

4CM00: Control Engineering *Performance*

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Where innovation starts

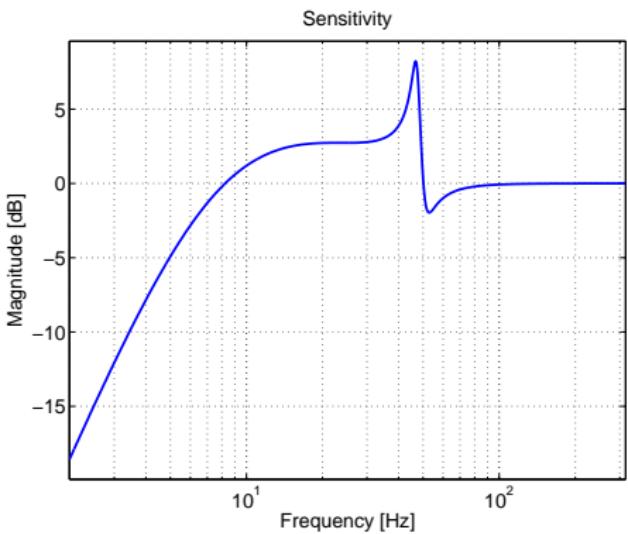
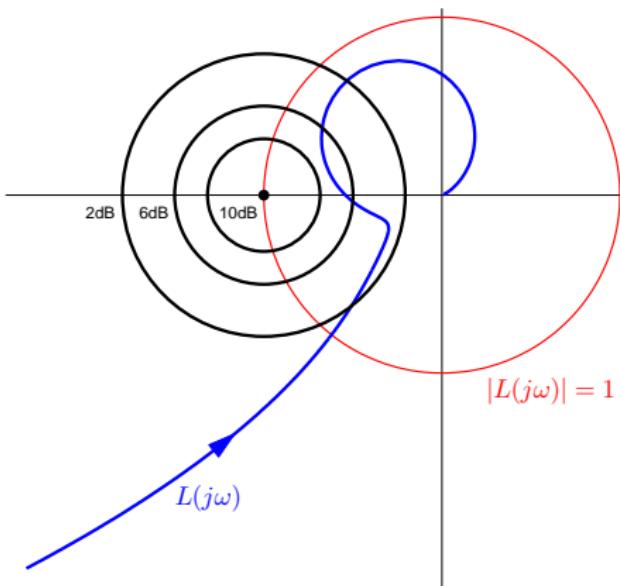
The importance of the Sensitivity function

The Sensitivity function

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Remember from the previous lecture

- ▶ direct relation between Nyquist plot of $L(j\omega)$ and $|S(j\omega)|$
- ▶ modulus margin: $\max_{\omega} |S(j\omega)|$

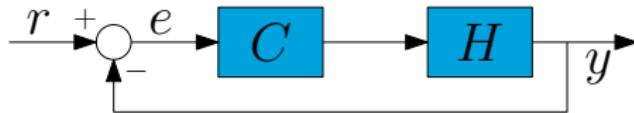


The use of the Sensitivity function:

- ▶ Robustness - ‘closeness to instability’
 - !! Small $|S|$ can still yield instability; the point $(-1,0)$ can be passed on the *wrong* side with a large margin
 - !! Large $|S|$ can still come with stability
- ▶ Measure for performance
- ▶ Indicates the benefit of feedback

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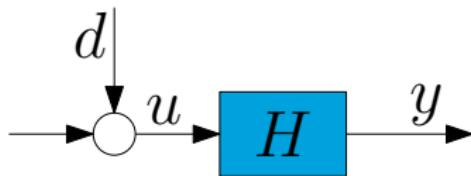


Error e resulting from an input r :

$$e = r - y = r - HCe \quad \Rightarrow \quad (1 + HC) e = r \quad \Rightarrow \quad \frac{e}{r} = \frac{1}{1 + HC} = S$$

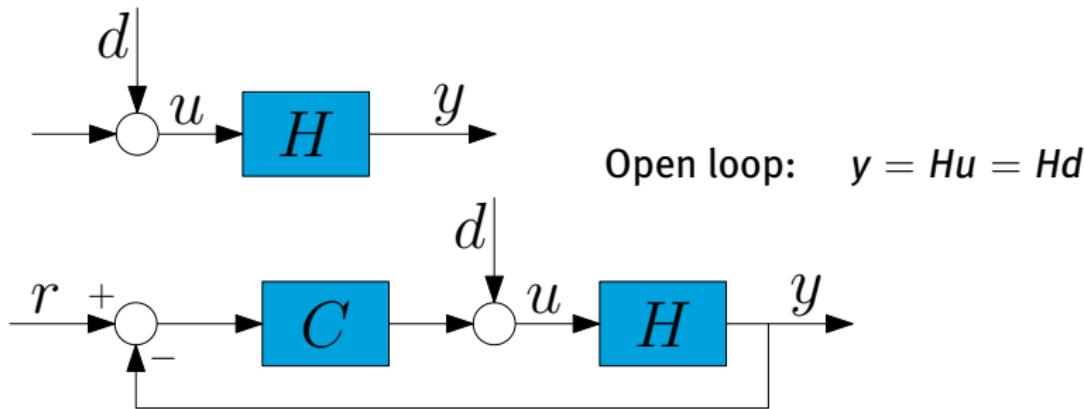
The Sensitivity function determines the resulting *closed loop* error.

The benefit of feedback



Open loop: $y = Hu = Hd$

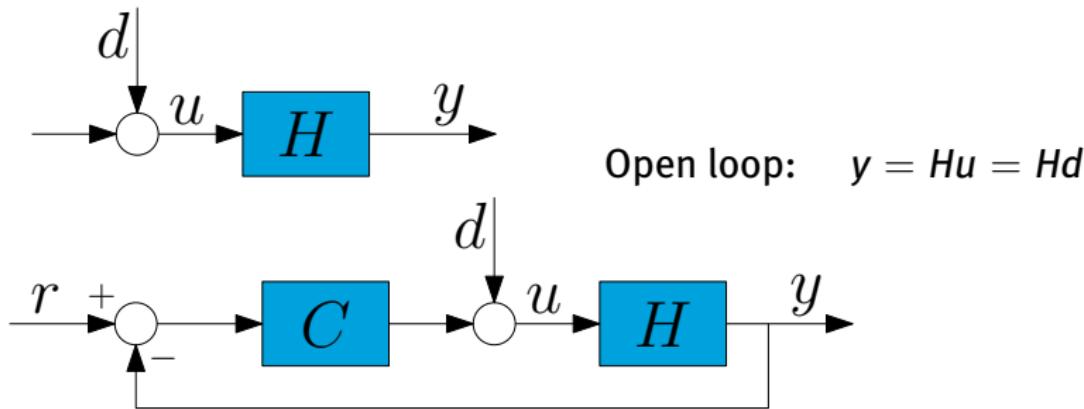
The benefit of feedback



Closed loop:

$$\begin{aligned}y &= Hu = H(d + C(-y)) = Hd - HCy \\(1 + HC)y &= Hd \\y &= \frac{H}{1 + HC} d = S \cdot Hd\end{aligned}$$

The benefit of feedback



Closed loop:

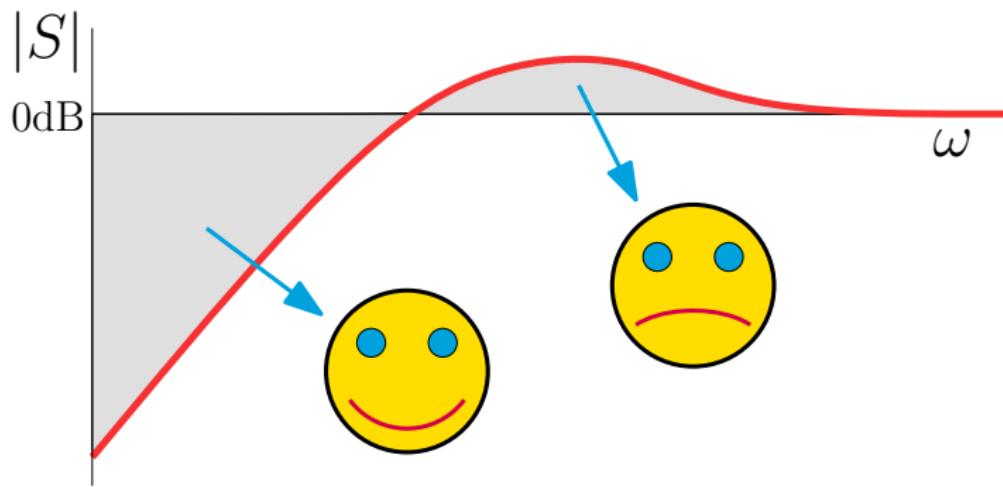
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Improvement due to feedback: S

The benefit of feedback

Feedback is:

- ▶ advantageous when $|S| < 1$
- ▶ disadvantageous when $|S| > 1$



So, the goal of feedback is to get: $|S(j\omega)| < 1 \quad \forall \omega$, right?

...well, actually...

There's something known as the **Bode Sensitivity Integral**:

$$\int_0^\infty \ln |S(j\omega)| d\omega = \pi \sum_{i=1}^{N_p} \operatorname{Re}(p_i), \quad (1)$$

where $S(s) = \frac{1}{1+L(s)}$ and $L(s)$ has N_p RHP poles at locations p_i .

- ▶ Implies that area beneath $|S|$ is always non-negative
- ▶ Hence, there are always regions where $|S| > 1$
- ▶ The ‘faster’ the RHP poles are, the larger the area above $|S| = 1$
- ▶ That’s the price of having to stabilize an unstable system

Note: holds for open loops $L(s)$ with relative degree 2 or higher

For stable open loops the **Bode Sensitivity Integral** simplifies to

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

- ▶ Surface beneath $|S|$ is always zero
- ▶ Suppression of $|S|$ at certain frequency ω always results in an amplification elsewhere
- ▶ (Again only for open loops $L(s)$ with relative degree 2 or higher)

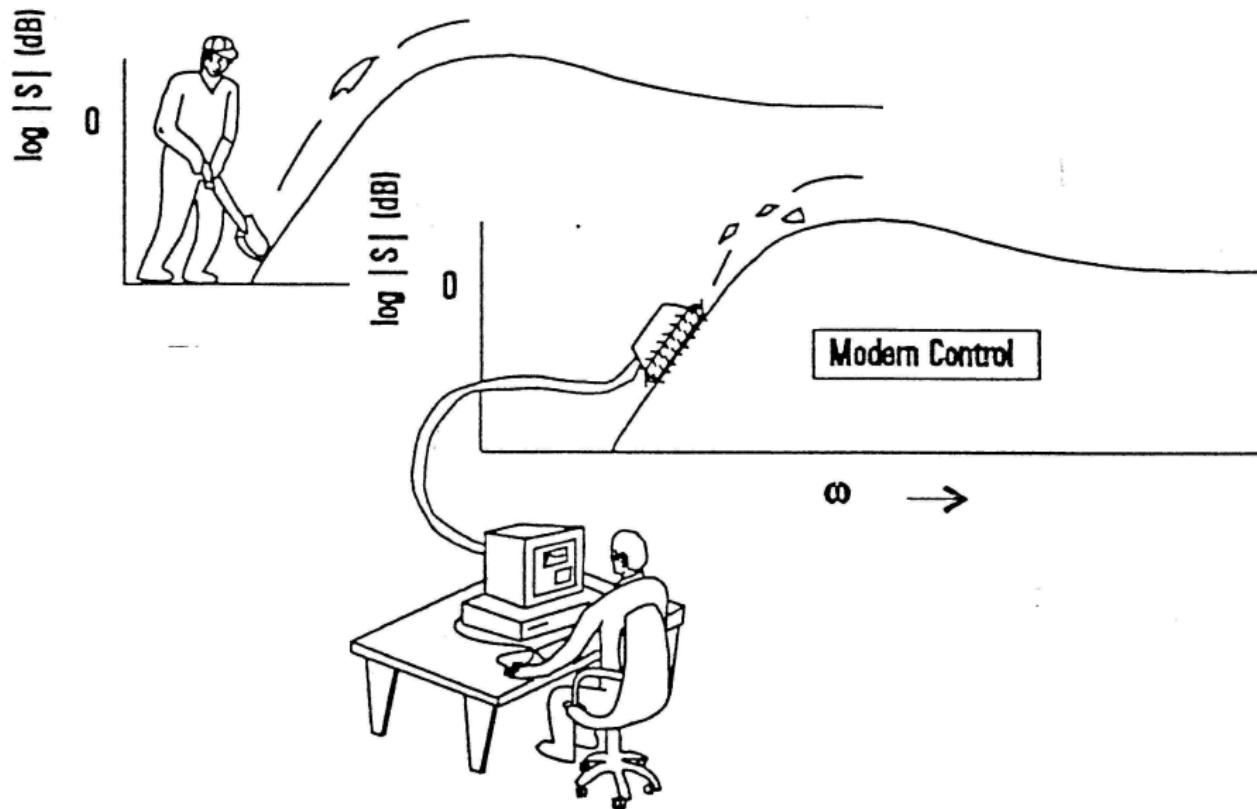
Also known as the **WaterBed Effect**

Fundamental limitation of linear control!

Control design: making S small only for those frequencies where it matters, and allowing large S where it doesn't matter.

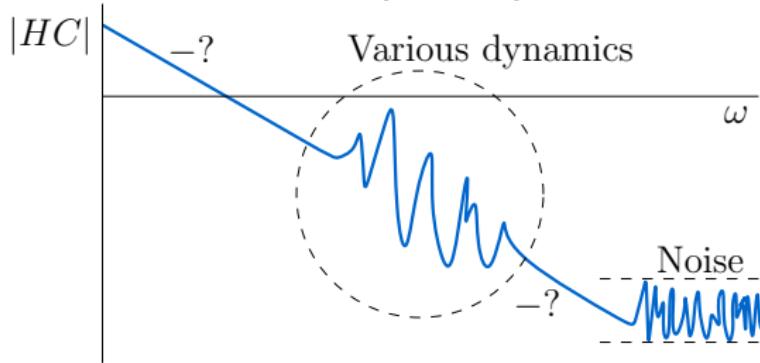
WaterBed Effect

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Closed loop transfer functions

We assume that the open loop is of the following form:

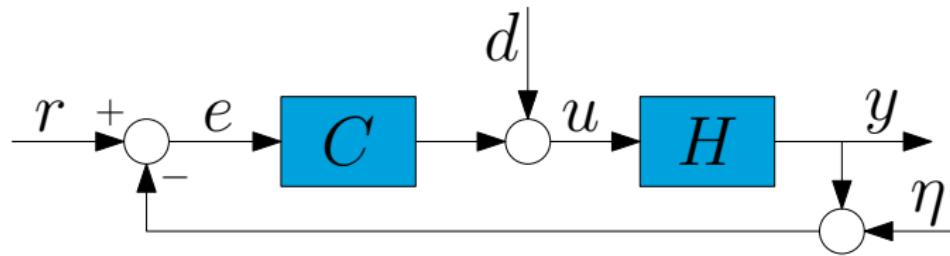


- ▶ Negative slope for low frequencies
- ▶ Various (anti-)resonances in the mid- to high-frequency range
- ▶ Flat (measurement) noise level for high frequencies

Note: Large H for $\omega \rightarrow 0$ and small H for $\omega \rightarrow \infty$

Note: This typically holds for **motion systems** and their open loop

Closed loop transfers



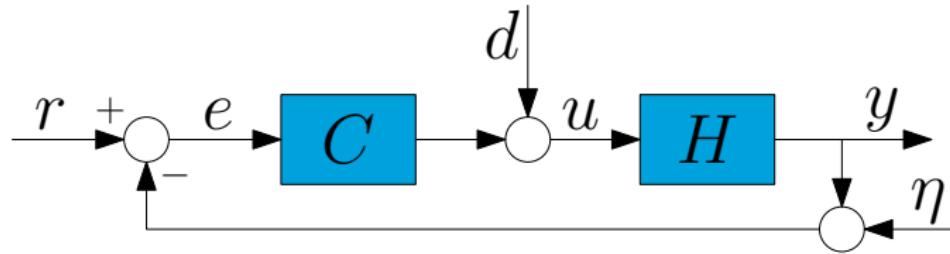
$$\frac{e}{r} = \frac{u}{d} =$$

$$\frac{y}{r} = \frac{y}{\eta} =$$

$$\frac{y}{d} =$$

$$\frac{u}{r} =$$

Closed loop transfers



$$\frac{e}{r} = \frac{u}{d} = \frac{1}{1 + HC} = S : \text{ Sensitivity}$$

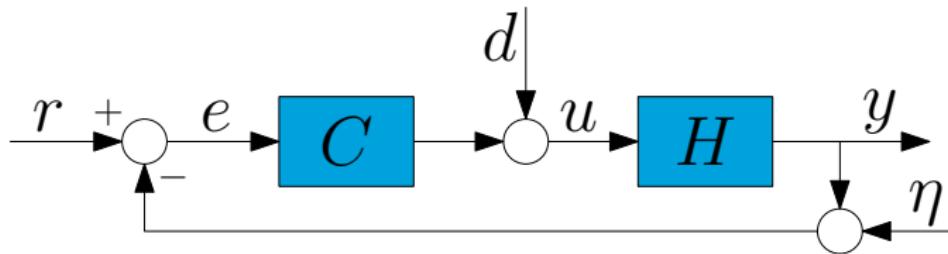
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Closed loop transfers

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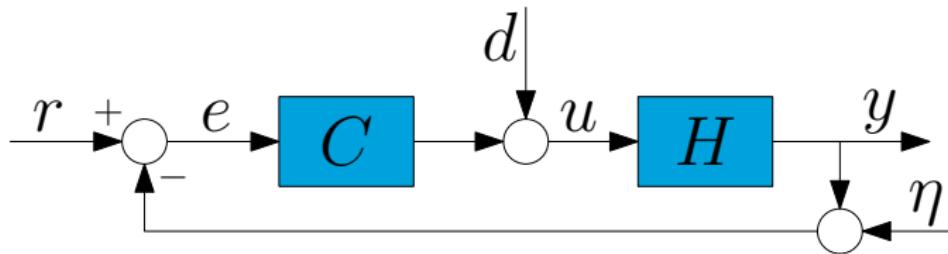
$$\frac{y}{r} = \frac{y}{\eta} = \frac{HC}{1 + HC} = T : \text{ Complementary sensitivity}$$

$$\frac{y}{d} =$$

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Closed loop transfers

12/44



$$\frac{e}{r} = \frac{u}{d} = \frac{1}{1 + HC} = S : \text{ Sensitivity}$$

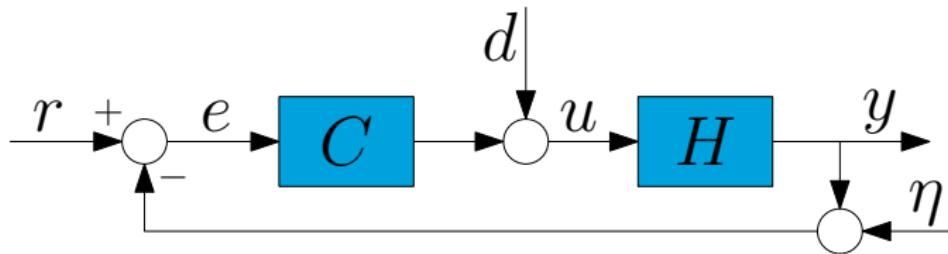
$$\frac{y}{r} = \frac{y}{\eta} = \frac{HC}{1 + HC} = T : \text{ Complementary sensitivity}$$

$$\frac{y}{d} = \frac{H}{1 + HC} = HS : \text{ Process sensitivity}$$

$$\frac{u}{r} =$$

Closed loop transfers

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$$\frac{e}{r} = \frac{u}{d} = \frac{1}{1 + HC} = S : \text{ Sensitivity}$$

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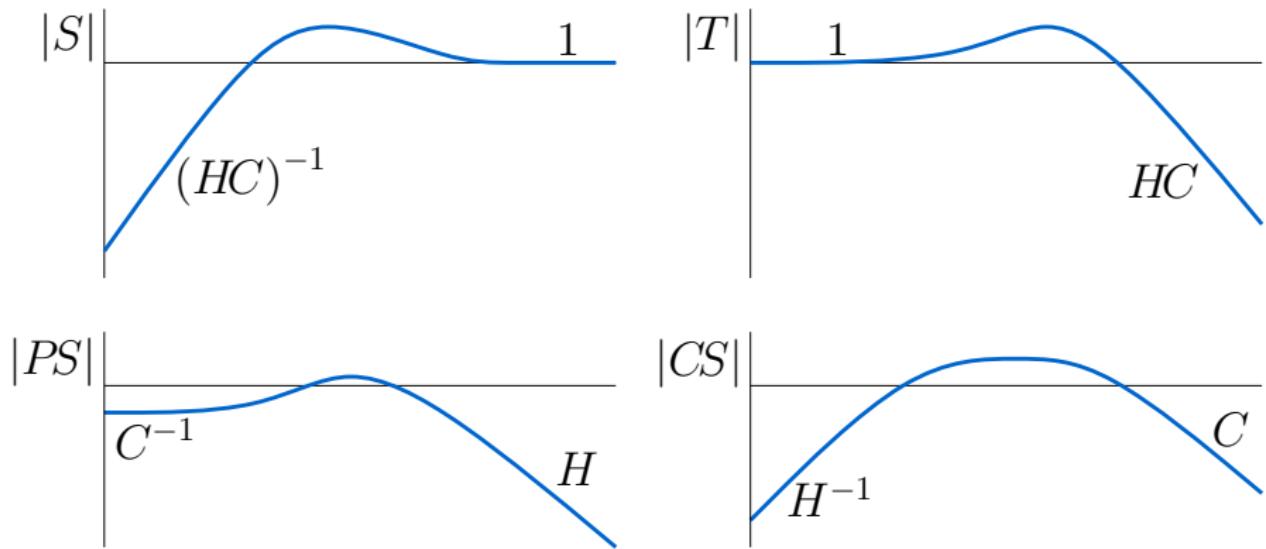
$$\frac{u}{r} = \frac{C}{1 + HC} = CS : \text{ Control sensitivity}$$

For simple controllers this yields the following closed loop transfers

Note: $HC \rightarrow \infty$ for $\omega \rightarrow 0$ and $HC \rightarrow 0$ for $\omega \rightarrow \infty$

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Note that

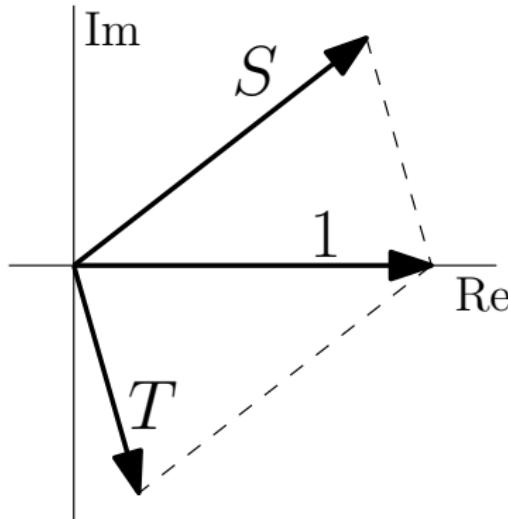
$$S + T = \frac{1}{1 + HC} + \frac{HC}{1 + HC} = 1 \quad (2)$$

Note that

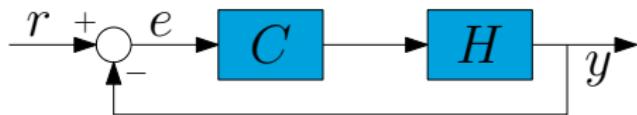
$$S + T = \frac{1}{1+HC} + \frac{HC}{1+HC} = 1 \quad (2)$$

Both S and T are complex valued

- ▶ S and T have different angles,
- ▶ so $|S|$ and $|T|$ can be larger than 1 at the same time!



How to achieve high performance?



Transfer from r to e :

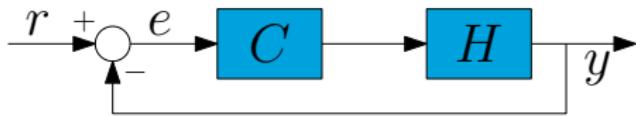
$$\frac{e}{r} = \frac{1}{1 + HC} = S$$

Transfer from r to y :

$$\frac{y}{r} = \frac{HC}{1 + HC} = T$$

General goals:

- ▶ minimizing the error: $e = 0$,
- ▶ tracking the input: $y = r$.



Transfer from r to e :

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Transfer from r to y :

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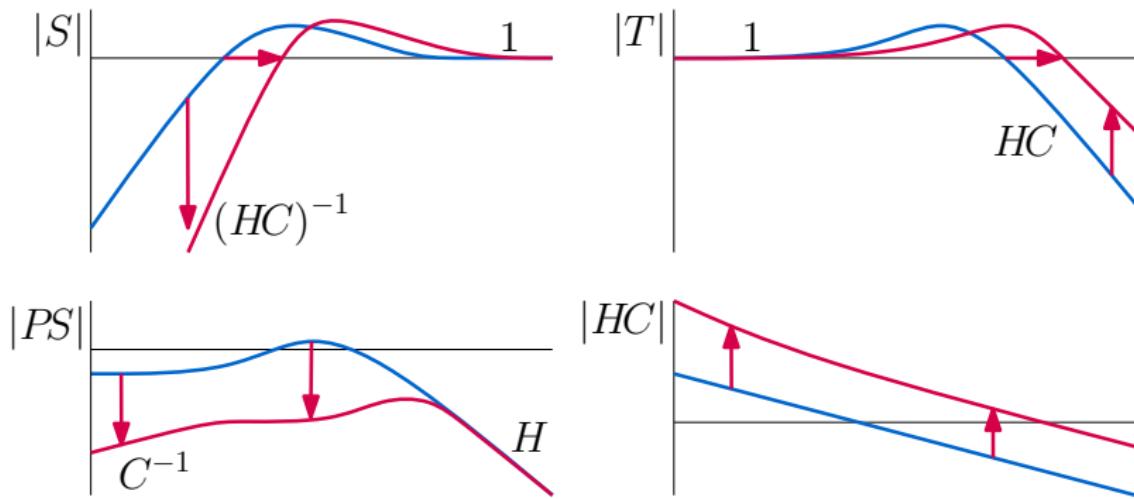
General goals:

- ▶ minimizing the error: $e = 0$,
- ▶ tracking the input: $y = r$.

Can be achieved by *high-gain feedback*:

$$\text{maximize } HC \left\{ \begin{array}{l} \frac{1}{1 + HC} \rightarrow 0 \\ \frac{HC}{1 + HC} \rightarrow \frac{HC}{HC} = 1 \end{array} \right.$$

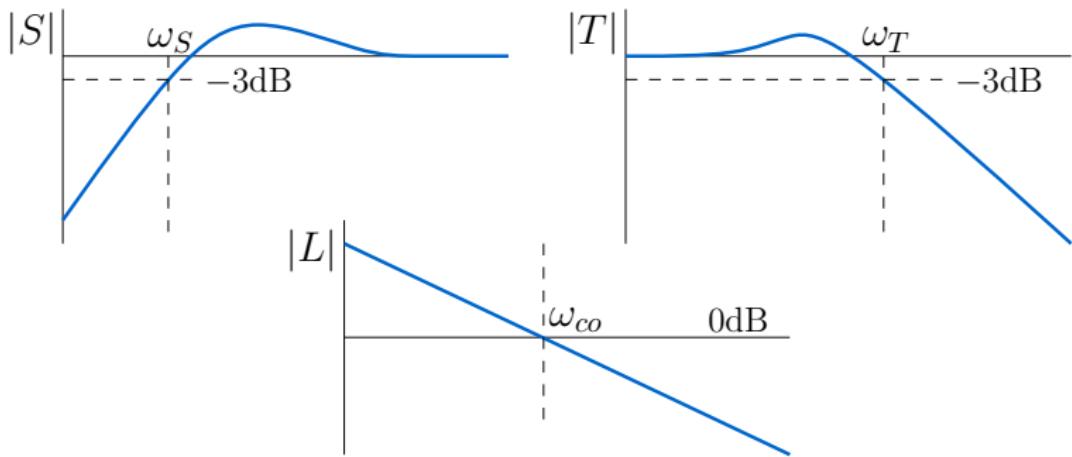
Consequence of high-gain feedback:



However, in reality the high-gain in HC is limited:

- ▶ High frequent measurement noise in y will be amplified
- ▶ High frequent gain in T should be small

Around the world different definitions for bandwidth are used:



- ▶ Frequency up to where disturbances are suppressed: ω_S
- ▶ Frequency up to where references are tracked: ω_T
- ▶ Cross-over frequency of the open-loop L : ω_{co}

In practice: $\omega_S \leq \omega_{co} \leq \omega_T$

We take: bandwidth $\omega_b = \omega_{co}$

Advantages of high bandwidth:

- ▶ $|S| < 1$ over large frequency band
 - ⇒ small error e
 - ⇒ more disturbance rejection
- ▶ $|T| = 1$ over large frequency band
 - ⇒ good tracking performance

Disadvantages of high bandwidth

- ▶ Amplification of measurement noise
- ▶ Possibly large control signals (saturation?)

For performance reasons, bandwidth is normally chosen as high as possible. However, it is better to say:

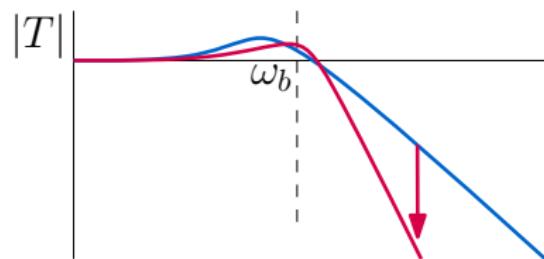
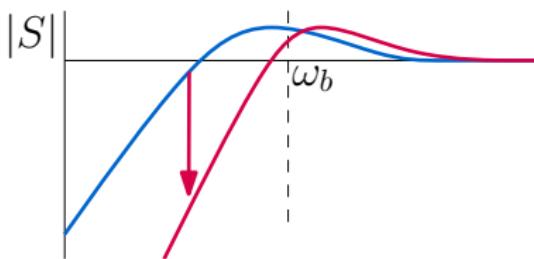
*"Choose the bandwidth as low as possible,
but such that the closed loop still meets its requirements"*

(I.M. Horowitz)

Control targets:

- ▶ Low frequencies (LF): track reference r , suppress disturbances d
⇒ small S for $\omega < \omega_b$
- ▶ High frequencies (HF): suppress measurement noise in y
⇒ small T for $\omega > \omega_b$

Desired closed loop transfers:

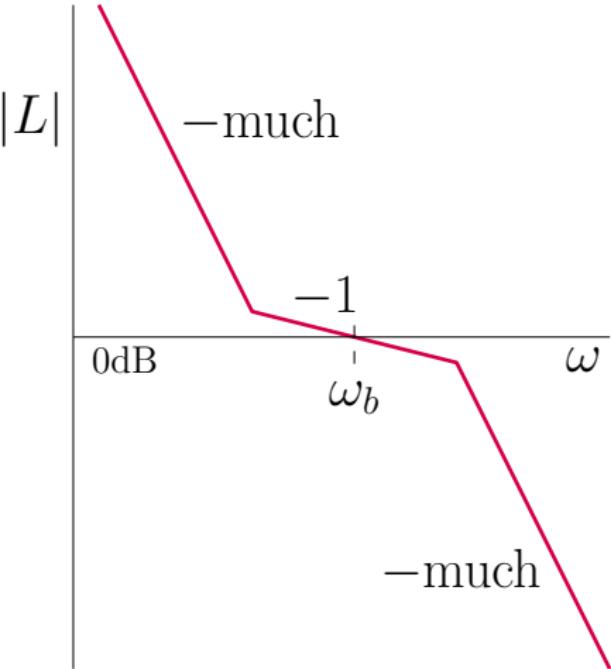


Hence, the ideal open loop has the following shape:

- ▶ Large slope for $\omega \ll \omega_b$ and $\omega \gg \omega_b$
- ▶ Slope ≈ -1 at ω_b
⇒ Necessary for stability

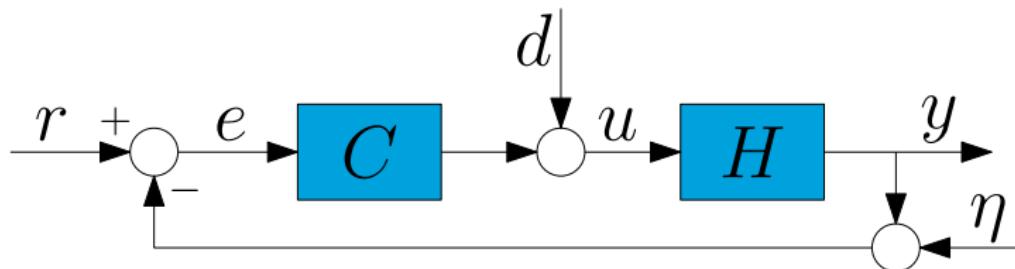
However, keep the controller order limited to prevent

- ▶ large complexity
- ▶ large computation times
- ▶ risk of implementation errors



Feedback performance using the internal model principle

External signals enter at various points in the loop:



Closed loop performance (e.g. error e) is determined by

- ▶ Relevant closed loop transfer
 - e.g. $e = -\frac{H}{1+HC} d$ (disturbance attenuation)
 - e.g. $e = \frac{1}{1+HC} r$ (tracking)
- ▶ Specific frequency content of the input signals r , d and/or η

Perfect tracking / disturbance attenuation can be achieved when

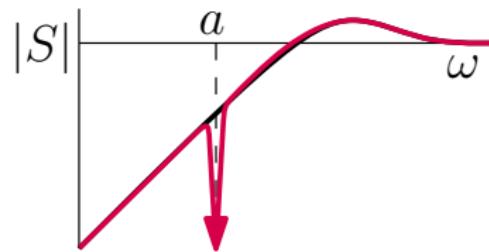
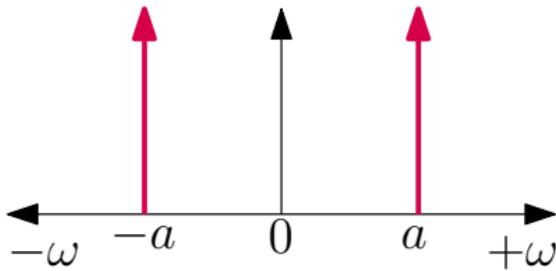
- ▶ the input signal is exactly known;
- ▶ then the relevant transfer function should **counteract** the specific input signal.

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- ▶ the input signal is exactly known;
- ▶ then the relevant transfer function should **counteract** the specific input signal.

Simple example:

- ▶ Suppose $r(t) = \sin(at)$
- ▶ In frequency domain: $R(s) = \mathcal{L}(r(t))$ has infinite peak at $\omega = a$
- ▶ To get $e \rightarrow 0$ for $t \rightarrow \infty$ we need $\frac{e}{r} = S$ to be 0 at $\omega = a$



Note that:

Laplace transform of $r(t)$:

$$R(s) = \mathcal{L}(r(t)) = \frac{a}{s^2 + a^2}$$



Infinite dip in S means it should contain an undamped anti-resonance at a :
 $S(s) \sim s^2 + a^2$

As a result, since $S = \frac{1}{1+L}$, we know that $e \rightarrow 0$ if

- ▶ L contains the term $\frac{1}{s^2 + a^2}$,
- ▶ so if L contains the Laplace transform of the input r !

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Similarly, if $r(t)$ is a step reference:

- ▶ Laplace transform: $R(s) = \frac{1}{s}$
- ⇒ For perfect tracking: $S(s) \sim s$ (+1 slope for $\omega \rightarrow 0$)
- ⇒ So perfect tracking if $L(s) \sim \frac{1}{s}$ (-1 slope for $\omega \rightarrow 0$)

Summarizing:

| Signal $r(t)$ | Laplace $R(s)$ | L should contain |
|-----------------------|---------------------|---------------------|
| $1(t)$ - step | $\frac{1}{s}$ | $\frac{1}{s}$ |
| $t \cdot 1(t)$ - ramp | $\frac{1}{s^2}$ | $\frac{1}{s^2}$ |
| $t^2 \cdot 1(t)$ | $\frac{1}{s^3}$ | $\frac{1}{s^3}$ |
| $\sin(at)$ | $\frac{a}{s^2+a^2}$ | $\frac{a}{s^2+a^2}$ |

If $L(s)$ contains a **model** of the reference, perfect tracking can be guaranteed, so:

$$e \rightarrow 0 \quad \text{for} \quad t \rightarrow \infty$$

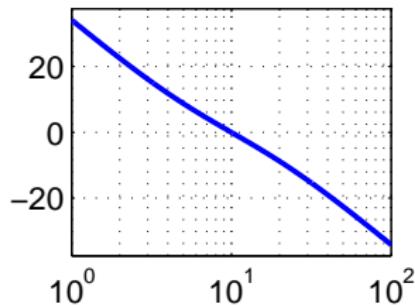
This is known as the **Internal Model Principle**.

Note: A similar reasoning can be applied for disturbances.

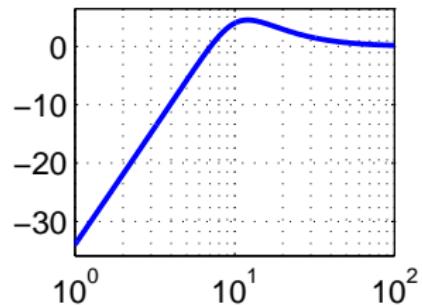
Perfect disturbance attenuation can be achieved when PS , CS or T contains the **inverse model** of the disturbance d or η .

Internal model principle: examples

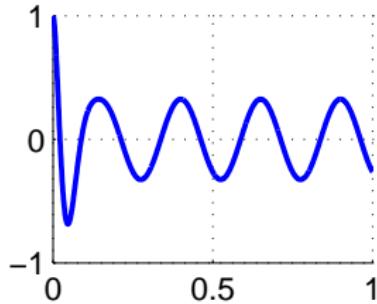
Open loop



Sensitivity

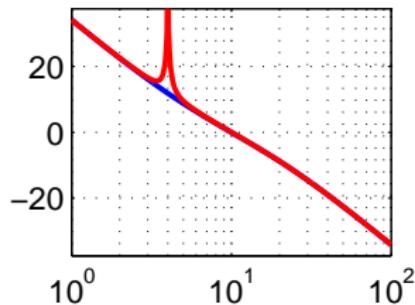


4Hz reference

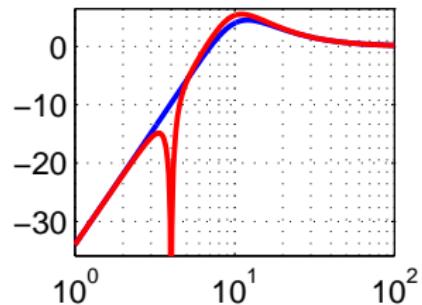


Internal model principle: examples

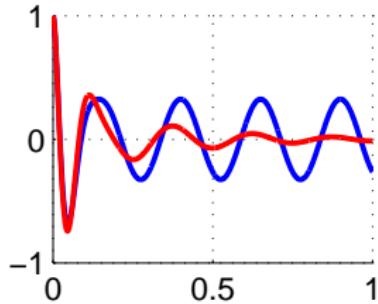
Open loop



Sensitivity



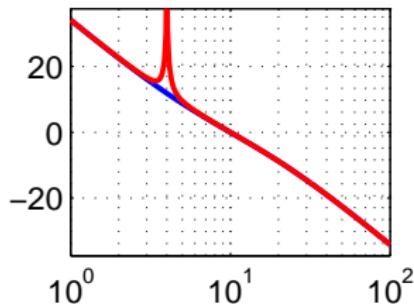
4Hz reference



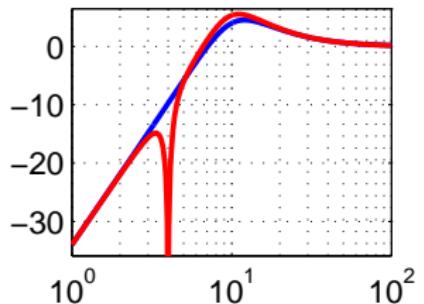
Internal model principle: examples

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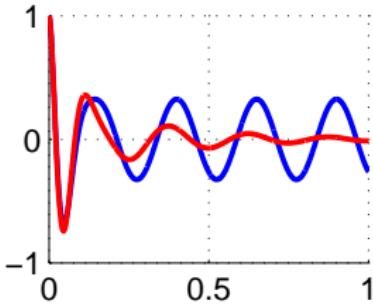
Open loop



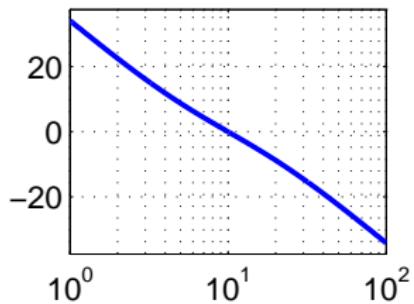
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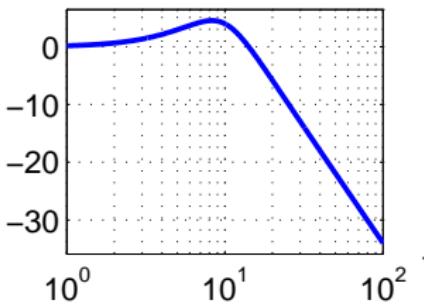
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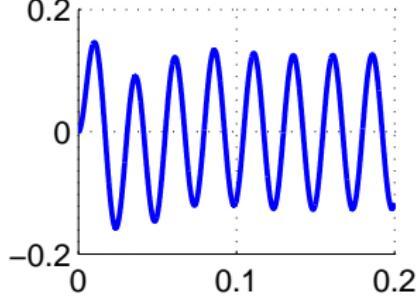
Open loop



Closed loop



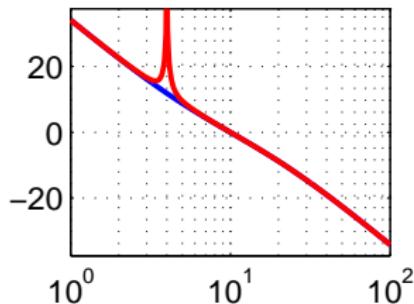
40Hz noise



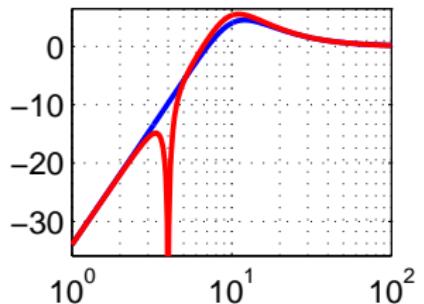
Internal model principle: examples

27/44

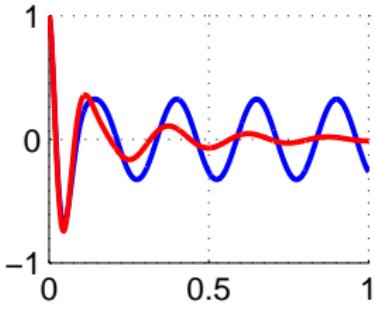
Open loop



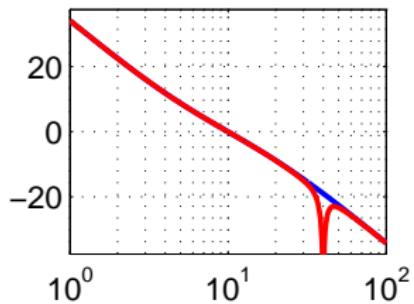
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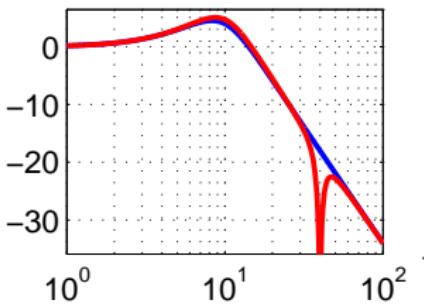
4Hz reference



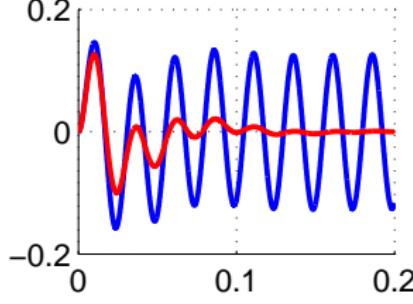
Open loop



Closed loop



40Hz noise



Basic building blocks of a linear controller

Controller design = adding poles and zeros to $L(s)$.

Each controller element is either

- ▶ a first order term, or
- ▶ a second order term,

in the numerator and/or denominator.

Possible controller blocks:

- ▶ Integrator / PI-controller
- ▶ PD controller
- ▶ lead/lag filter
- ▶ second order filter (notch)
- ▶ low-pass filter (first or second order)

You should know the formulas of these blocks by heart!

Pure integrator:

$$C = k \cdot \frac{1}{s}$$

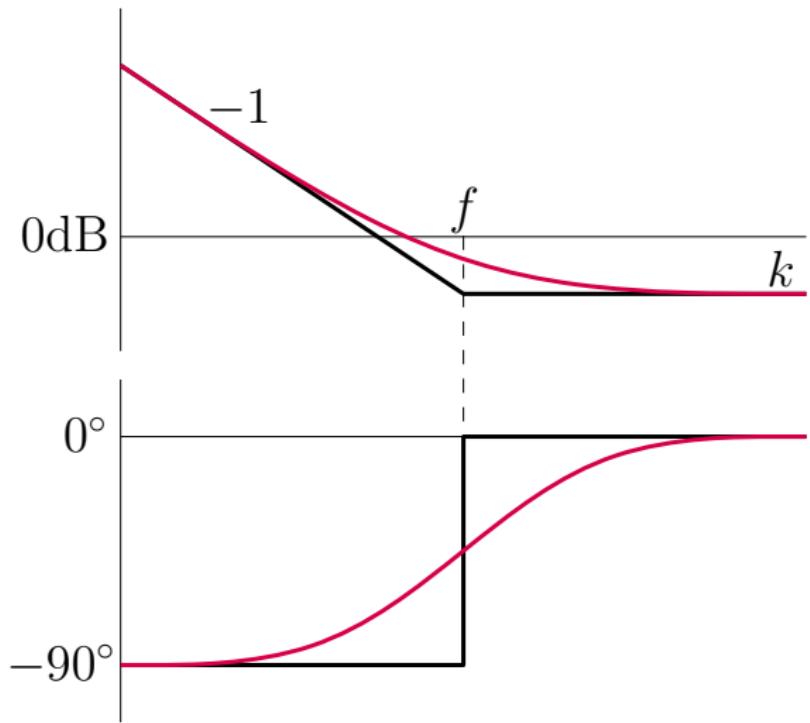
Cut-off integral action
due to phase lag:

$$C = k \cdot \frac{s + 2\pi f}{s}$$

Same as a PI controller:

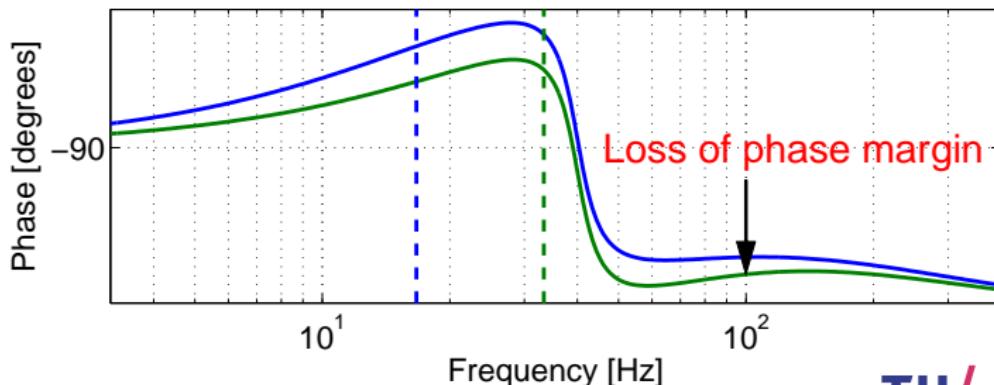
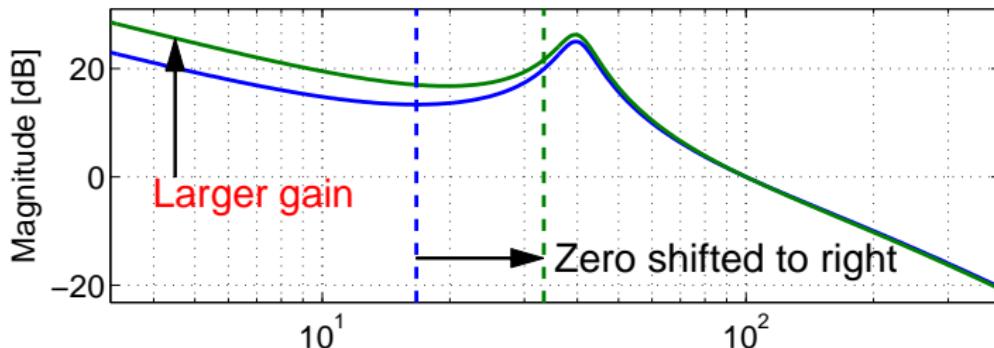
$$C = P + \frac{I}{s}$$

with $P = k$ and $I = 2\pi fk$.



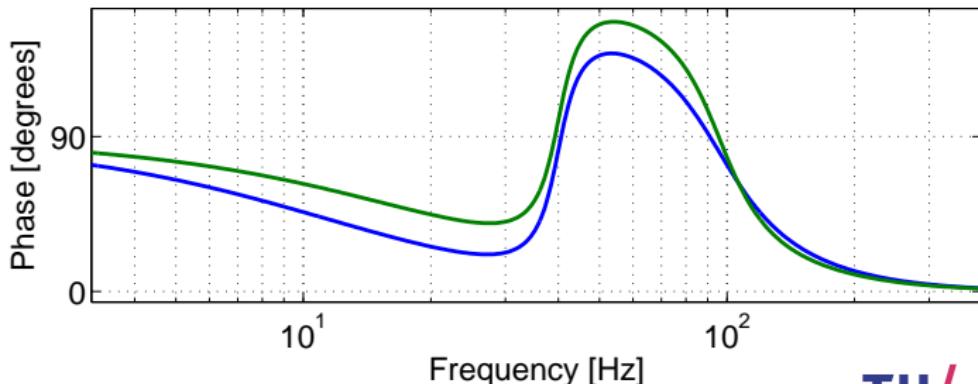
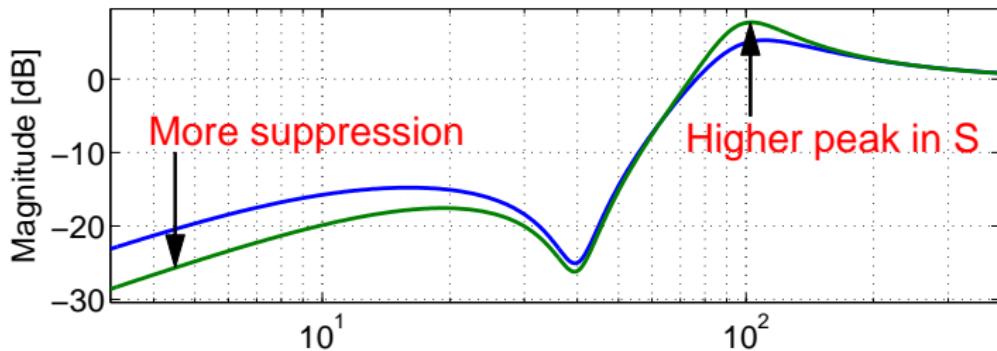
Integrator / PI-controller (cont'd)

Open loop transfers



Integrator / PI-controller (cont'd)

Sensitivity functions

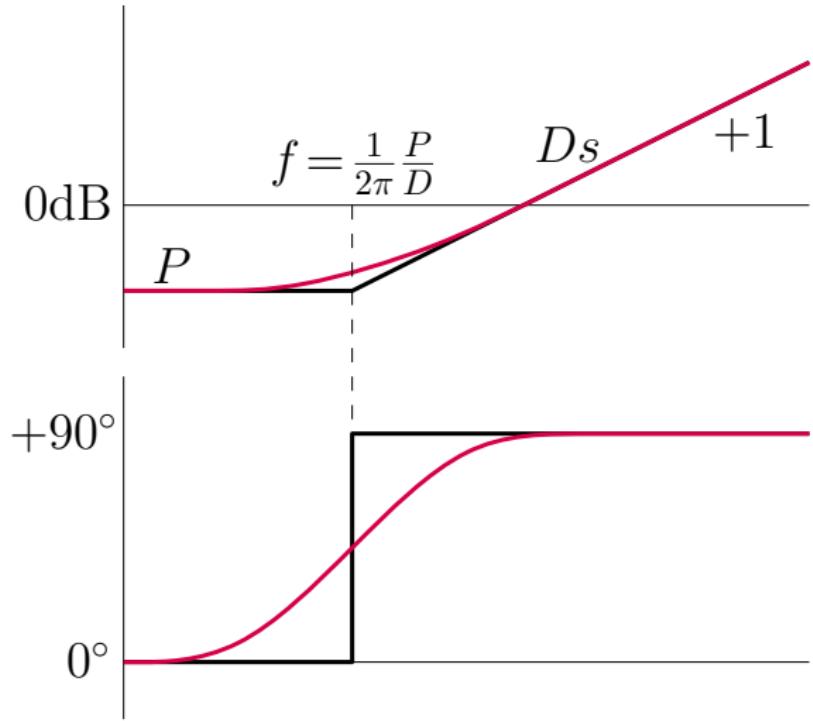


Create phase lead:

$$\begin{aligned}C &= P + Ds \\&= k \left(1 + \frac{1}{2\pi f} s \right)\end{aligned}$$

Note that:

$$P = k \quad \text{and} \quad D = \frac{k}{2\pi f}$$

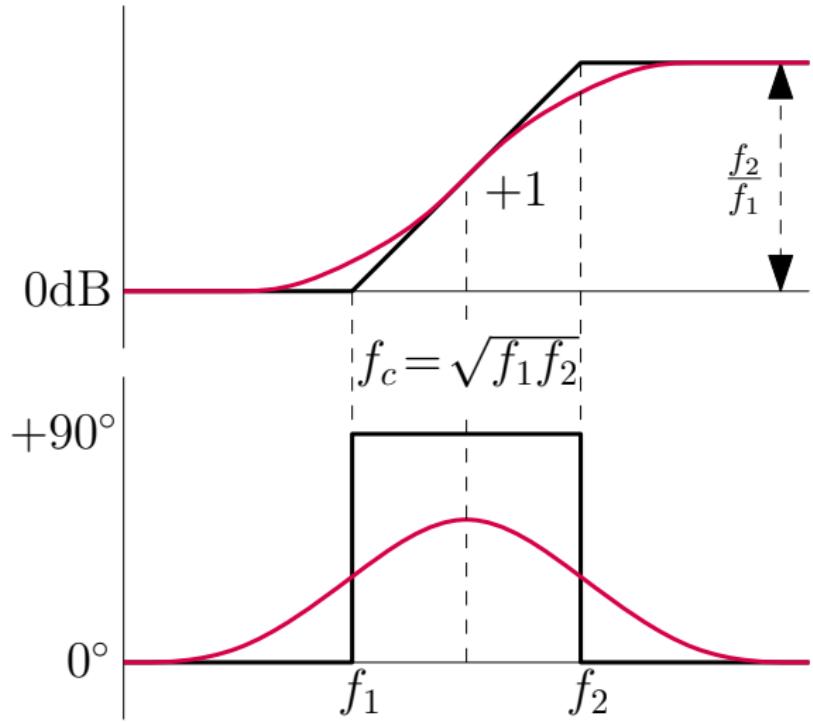


$$C = \frac{\frac{1}{2\pi f_1} s + 1}{\frac{1}{2\pi f_2} s + 1}$$

If $f_2 > f_1$: phase lead
If $f_2 < f_1$: phase lag

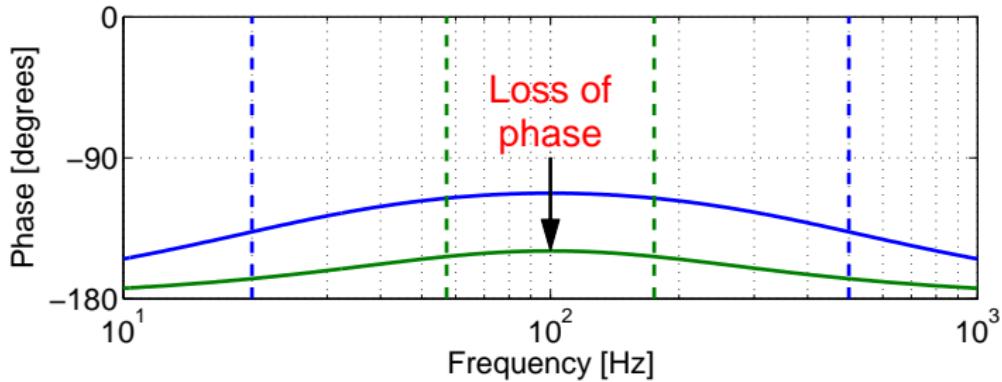
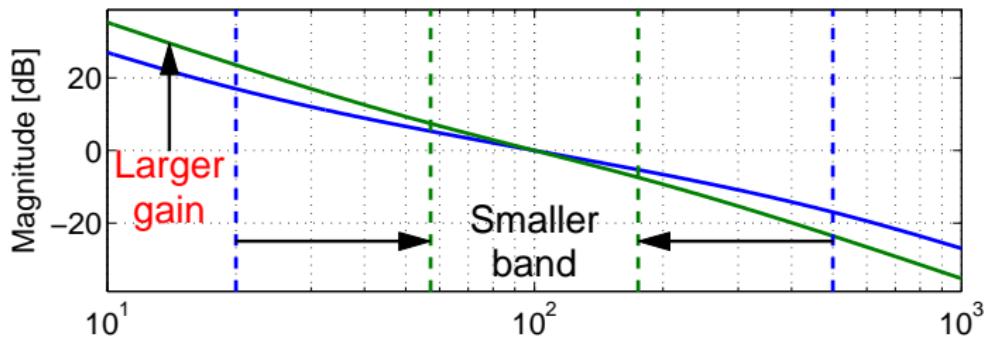
Maximum phase at:

$$f_c = \sqrt{f_1 f_2}$$



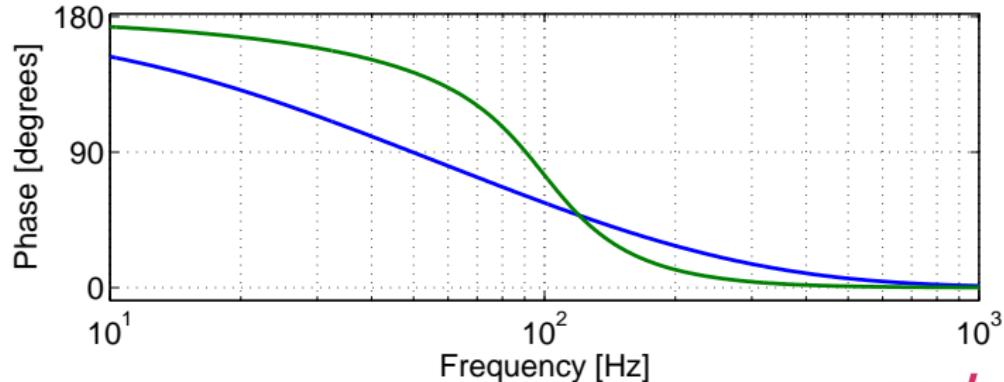
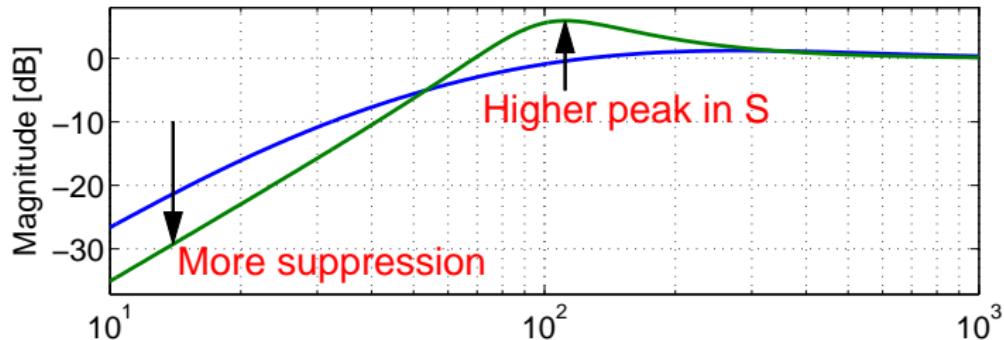
Lead/lag filter (cont'd)

Open loop transfers



Lead/lag filter (cont'd)

Sensitivity functions



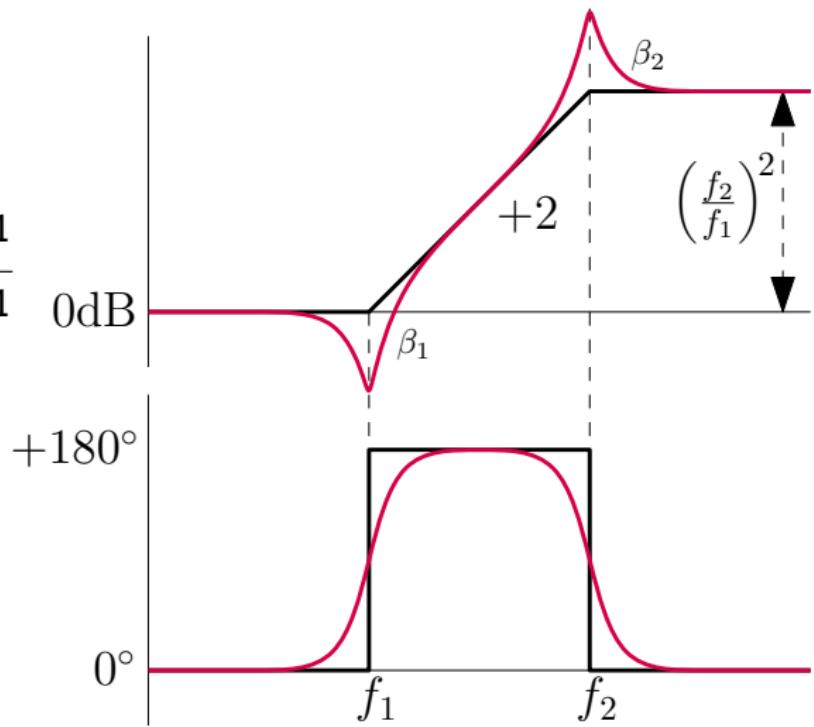
General second order filter (skewed notch)

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$$C = \frac{\frac{1}{(2\pi f_1)^2} s^2 + \frac{2\beta_1}{2\pi f_1} s + 1}{\frac{1}{(2\pi f_2)^2} s^2 + \frac{2\beta_2}{2\pi f_2} s + 1}$$

gain at high frequencies:

$$\left(\frac{f_2}{f_1}\right)^2$$

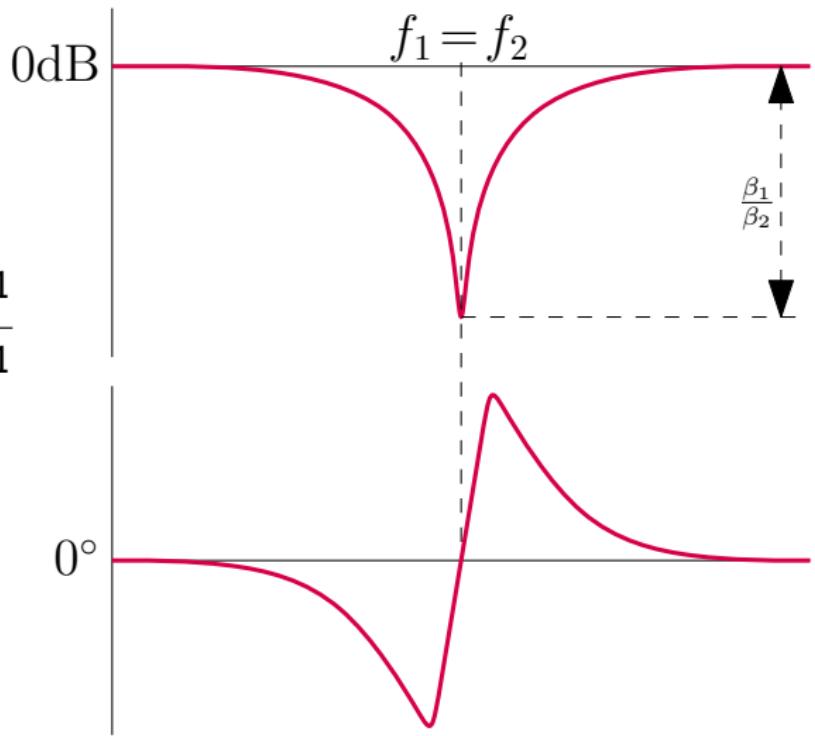


Second order filter (notch)

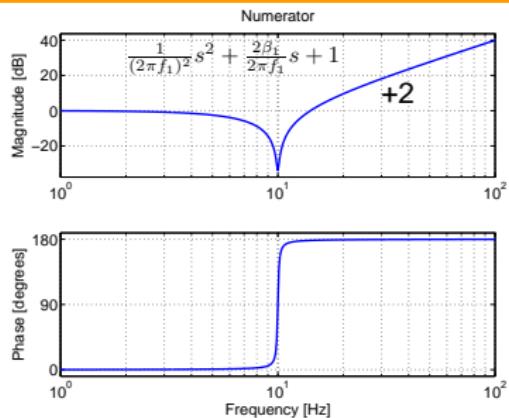
$$C = \frac{\frac{1}{(2\pi f_1)^2} s^2 + \frac{2\beta_1}{2\pi f_1} s + 1}{\frac{1}{(2\pi f_2)^2} s^2 + \frac{2\beta_2}{2\pi f_2} s + 1}$$

with

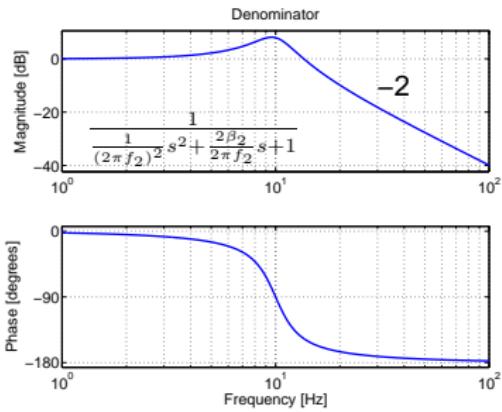
$$f_1 = f_2$$



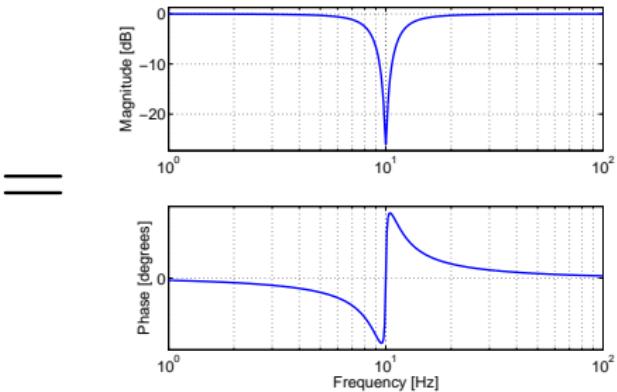
Second order filter (cont'd)



+

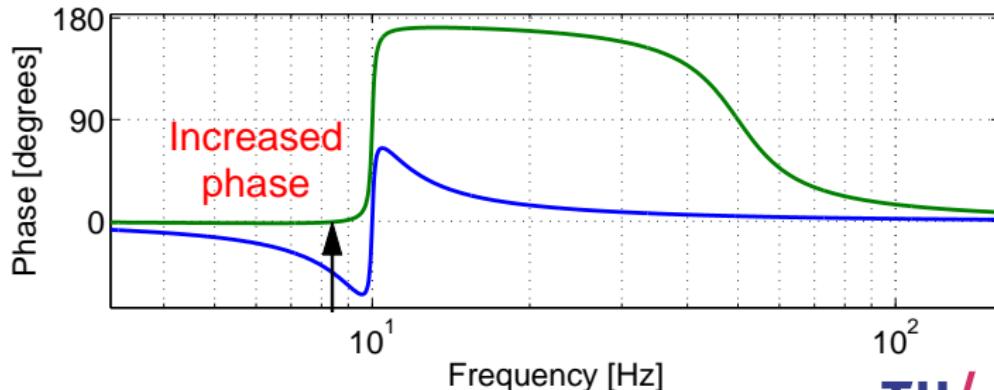
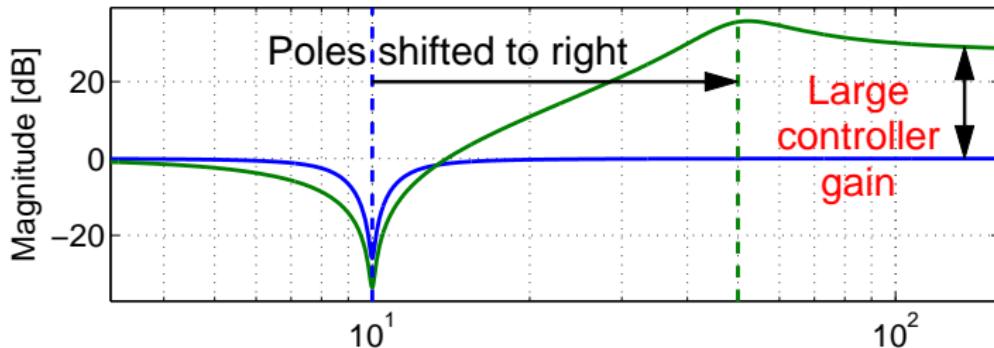


Notch filter: the sum



Second order filter (cont'd)

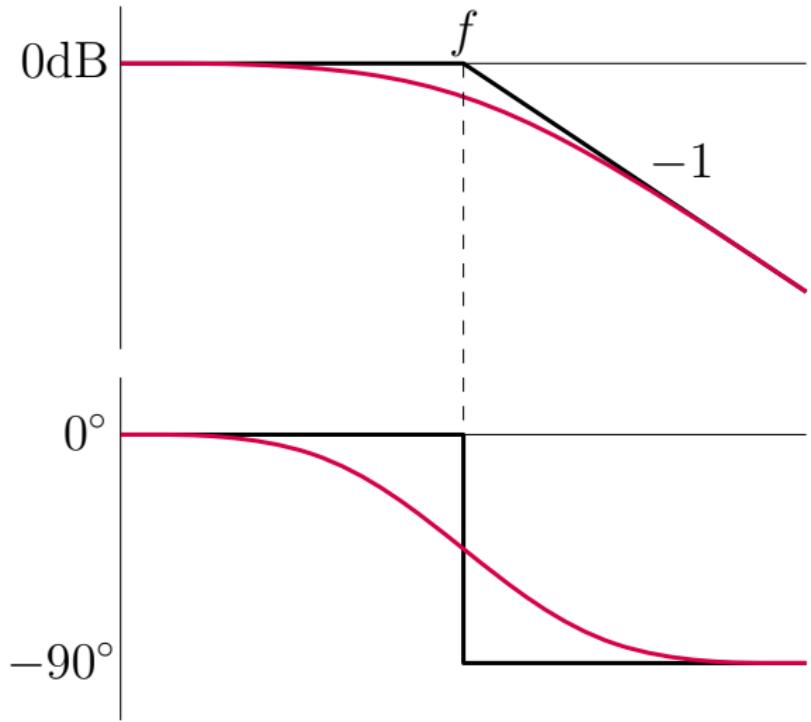
Second order filters



Lowpass filter: 1st order

$$C = \frac{1}{\frac{1}{2\pi f} s + 1}$$

Low frequent gain: 0dB

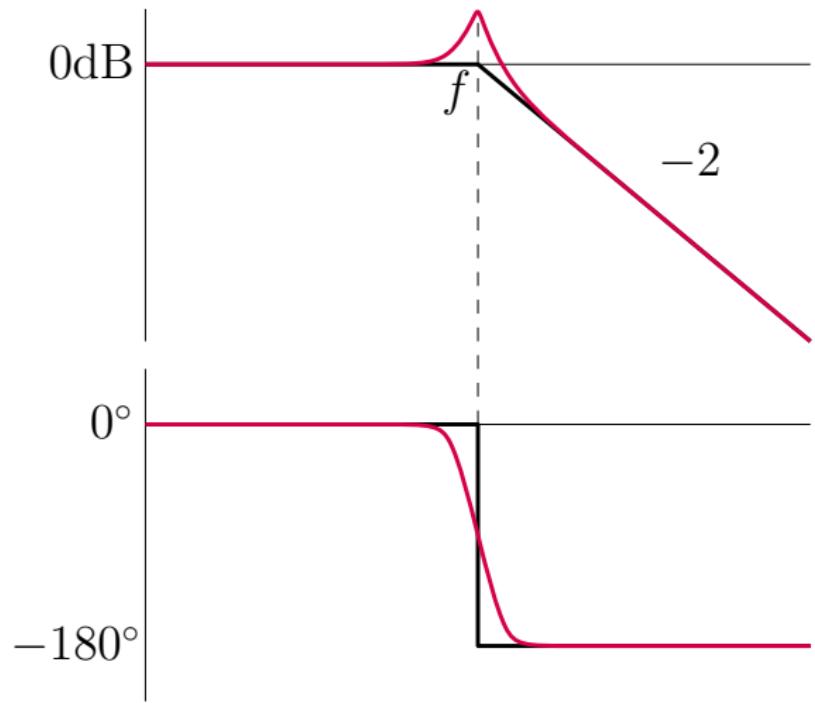


Lowpass filter: 2nd order

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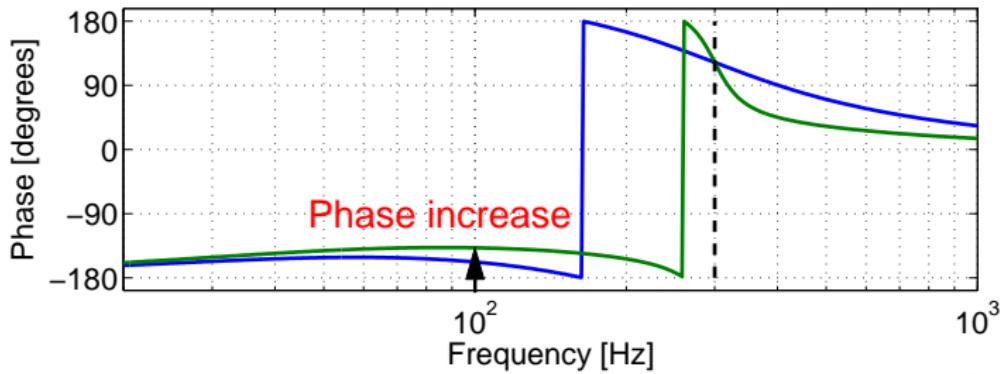
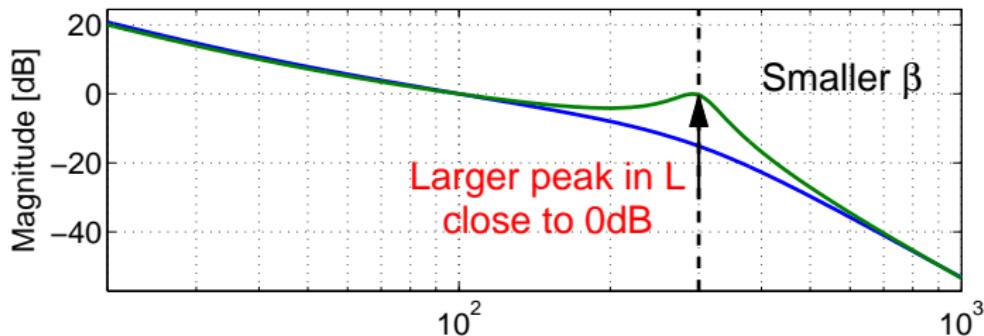
$$C = \frac{1}{\frac{1}{(2\pi f)^2} s^2 + \frac{2\beta}{2\pi f} s + 1}$$

Low frequent gain: 0dB

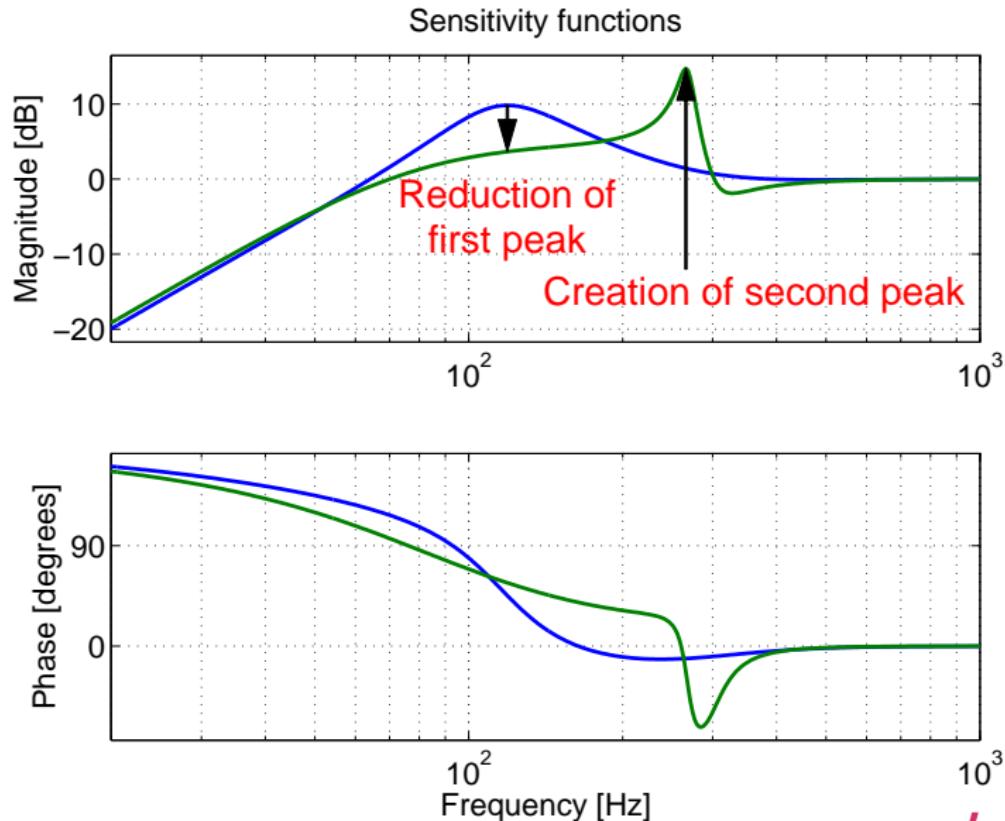


Lowpass filter: 2nd order (cont'd)

Open loop transfers



Lowpass filter: 2nd order (cont'd)



‘Shaping’ the open loop transfer, until stability and satisfactory performance is achieved.

1. Stabilize the plant

- make the right number of encirclements of $(-1, 0)$
- create phase lead at bandwidth

ROT: add lead filter with zero at **bandwidth/3** and pole at **bandwidth*3**; adjust gain

2. Meeting the margins and/or shape the loop

- remove resonances *if necessary* (e.g. for stability margins)
- use notch or second order filters (skewed notch)

3. Increase performance

- add integrator (if necessary or desired)

ROT: choose zero at **bandwidth/5**

- add other filter blocks (e.g. notches) to shape specific closed loop transfer functions in specific frequency regions

4. Cut-off high frequent controller gain

- add low-pass filter

ROT: choose poles at **bandwidth*6** (and beta of 0.5 in case of second order low-pass)

If desired, increase bandwidth.

The procedure is iterative; adjust the poles and zeros while shaping the loop / tuning the bandwidth. Make sure to check all relevant transfer functions!

ROT = Rule Of Thumb

All parameter choices are *indicative*, adjust them to your specific situation!

Controller design example

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