



UNIVERSITY OF
SOUTH CAROLINA

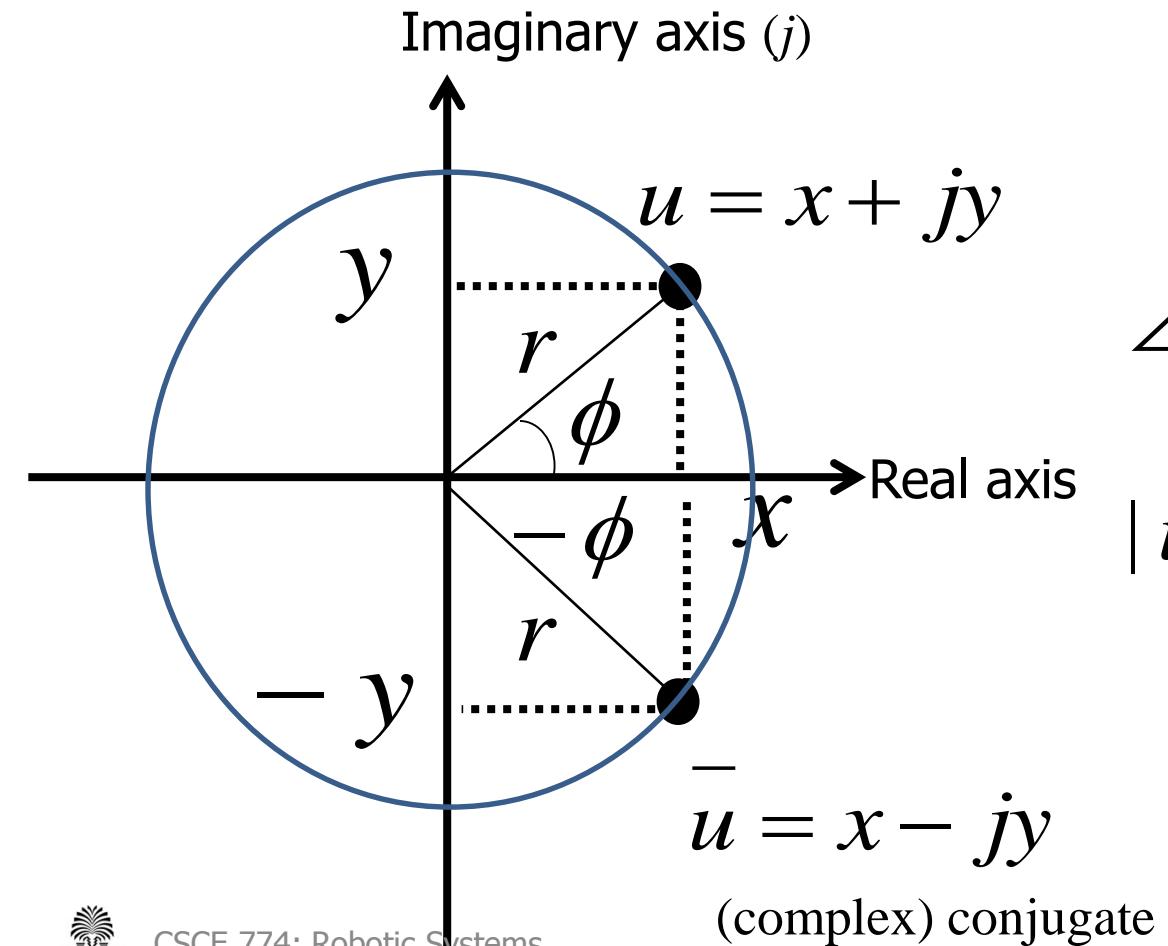
CSCE 774 ROBOTICS SYSTEMS

Control Theory



Ioannis Rekleitis

The Complex Plane (review)



$$\angle u \equiv \phi = \tan^{-1} \frac{y}{x}$$

$$|u| \equiv r \equiv |\bar{u}| = \sqrt{x^2 + y^2}$$



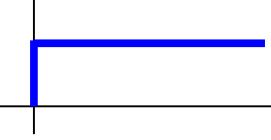
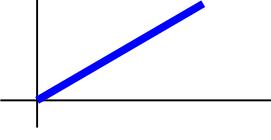
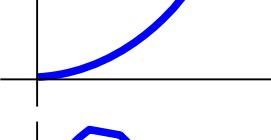
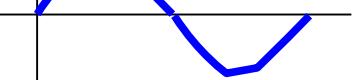
Basic Tool For Continuous Time: Laplace Transform

$$\mathbf{L}[f(t)] = F(s) = \int_0^{\infty} e^{-st} f(t) dt$$

- Convert time-domain functions and operations into frequency-domain
 - $f(t) \rightarrow F(s)$ ($t \in \mathbf{R}$, $s \in \mathbf{C}$)
 - **Linear differential equations (LDE) \rightarrow algebraic expression in Complex plane**
- Graphical solution for key LDE characteristics
- Discrete systems use the analogous z-transform



Laplace Transforms of Common Functions

Name	$f(t)$	$F(s)$
Impulse	$f(t) = \begin{cases} 1 & t = 0 \\ 0 & t > 0 \end{cases}$	 A graph showing a vertical blue line segment at t=0 with height 1, and the function is zero for all other values of t.
Step	$f(t) = 1$	 A graph showing a horizontal blue line segment starting at t=0 with a value of 1, and the function remains constant for all t > 0.
Ramp	$f(t) = t$	 A graph showing a straight blue line segment starting from the origin (0,0) with a positive slope, representing a linear increase over time.
Exponential	$f(t) = e^{at}$	 A graph showing a blue curve starting from a point on the t-axis and increasing exponentially towards the s-axis, representing exponential growth.
Sine	$f(t) = \sin(\omega t)$	 A graph showing a blue wave oscillating between -1 and 1, crossing the t-axis at regular intervals, representing periodic oscillation.



Laplace Transform Properties

Addition/Scaling $L[af_1(t) \pm bf_2(t)] = aF_1(s) \pm bF_2(s)$

Differentiation $L\left[\frac{d}{dt} f(t)\right] = sF(s) - f(0^\pm)$

Integration $L\left[\int f(t)dt\right] = \frac{F(s)}{s} + \frac{1}{s} \left[\int f(t)dt\right]_{t=0^\pm}$

Convolution $\int_0^t f_1(t-\tau)f_2(\tau)d\tau = F_1(s)F_2(s)$

Initial-value theorem $f(0+) = \lim_{s \rightarrow \infty} sF(s)$

Final-value theorem $\lim_{t \rightarrow \infty} f(t) = \lim_{s \rightarrow 0} sF(s)$



Differentiation

$$L\left[\frac{df(t)}{dt}\right] = sF(s)$$

$$L\left[\frac{d^2f(t)}{dt^2}\right] = s^2F(s)$$

$$L\left[\frac{d^3f(t)}{dt^3}\right] = s^3F(s)$$



Integration

$$L \left[\int_0^{\infty} f(t) dt \right] = \frac{F(s)}{s} + \frac{1}{s} \int_{0-}^{0+} f(t) dt$$



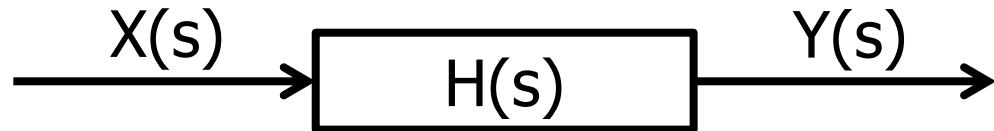
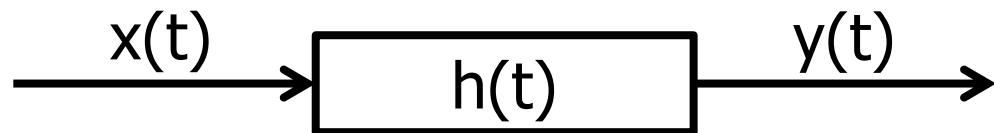
Insights from Laplace Transforms

- What the Laplace Transform says about $f(t)$
 - Value of $f(0)$
 - Initial value theorem
 - Does $f(t)$ converge to a finite value?
 - Poles of $F(s)$
 - Does $f(t)$ oscillate?
 - Poles of $F(s)$
 - Value of $f(t)$ at steady state (if it converges)
 - Limiting value of $F(s)$ as $s \rightarrow 0$



Block Diagram

Input Output



Transfer Function

- Definition
 - $H(s) = Y(s) / X(s)$
- Relates the output of a linear system (or component) to its input
- Describes how a linear system responds to an impulse
- All linear operations allowed
 - Scaling, addition, multiplication



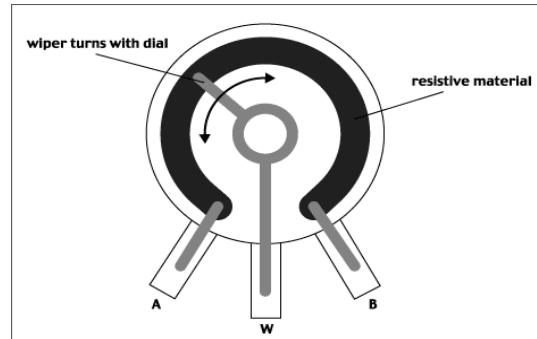
Actuators + Sensors

- Presented actuators and sensors, e.g.:
 - Electrical motor
 - Angular position encoder
- How to get the best precision/performance?

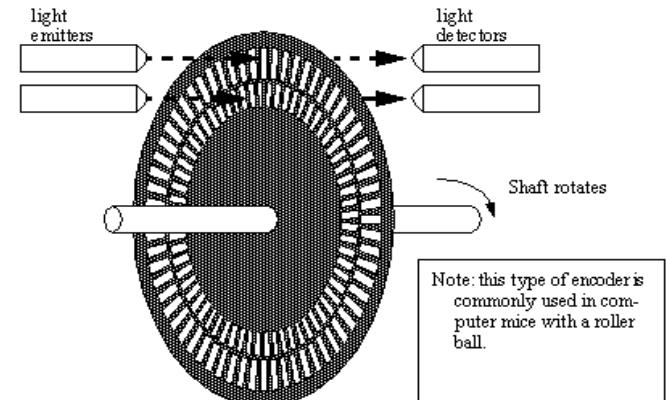
Electric Motor



Potentiometer

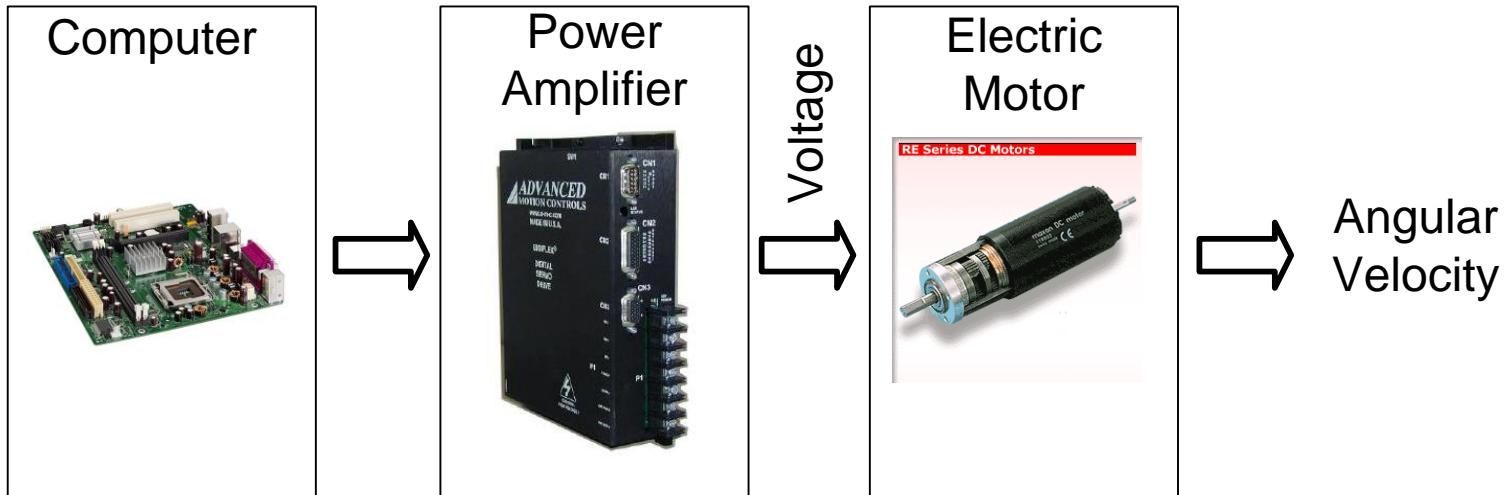


Optical Encoder



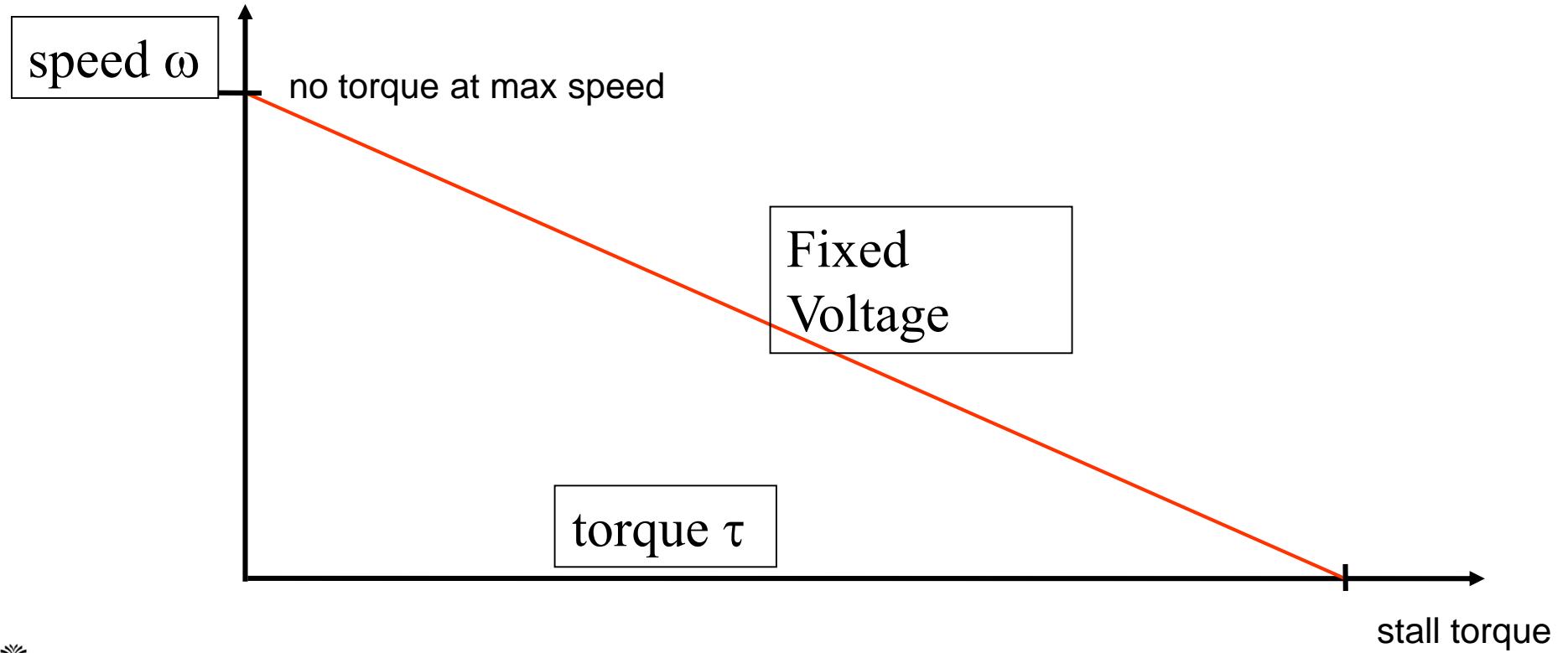
Open-loop

- Goal: move a differential drive robot
 - spin motors at a given angular velocity
- How: apply a fixed voltage to it,
 - and never check to see if it is rotating properly...



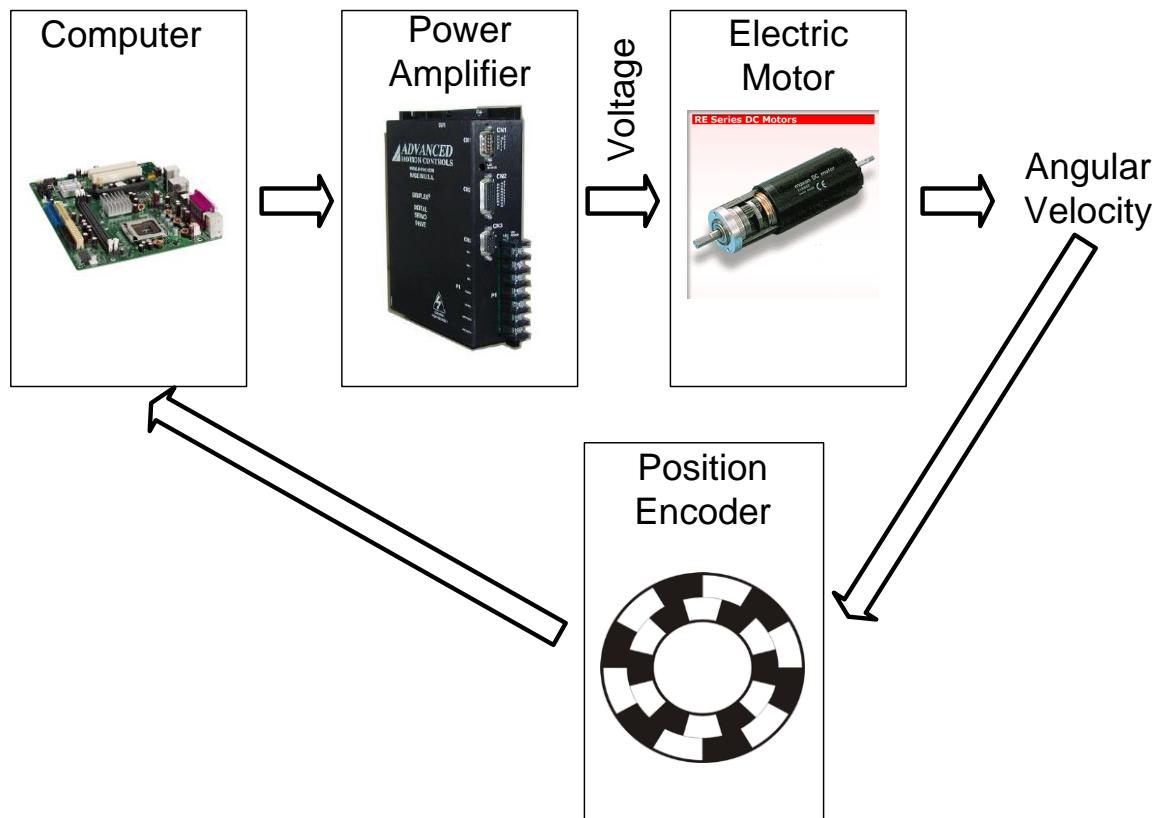
Open-loop

- Changing load on the motor?
 - Output velocity will change!



Closing the loop

- Let's measure the actual angular velocities.
- Compensate for changes in load by *feeding back* some information.



Control Theory

- Roots in another science: *Cybernetics*

Cybernetics is the study of feedback and derived concepts such as communication and control in living organisms, machines and organizations.

- Expression was coined by Norbert Wiener in 1948.

(my academic great-great-grand-father)

Norbert Wiener (1913 Harvard University)

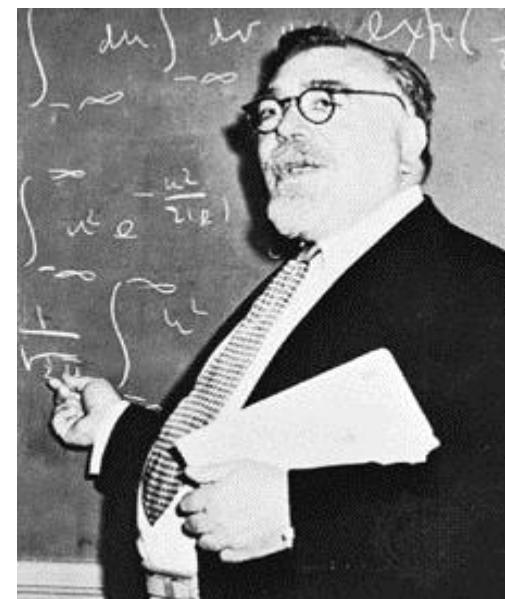
Amar Bose (1956 Massachusetts Institute of Technology)

Alan Oppenheim (1964 Massachusetts Institute of Technology)

Evangelos Milios (1986 Massachusetts Institute of Technology)

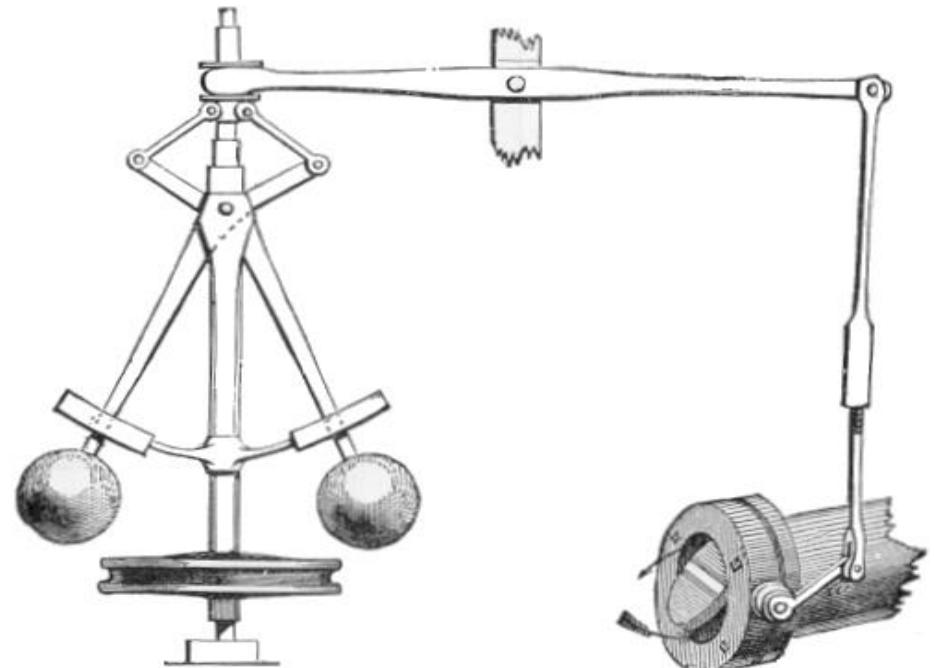
Rekleitis, Ioannis (2003 McGill University)

From <http://genealogy.math.ndsu.nodak.edu/index.php>



Early Example of Feedback System

- James Watt's "Centrifugal Governor" in 1788.
- Regulates the steam engine speed.



Other Examples

- Body temperature regulation
 - If cold, shiver (muscles produce heat)
 - If hot, sweat (evaporation takes away heat)
- Maintaining social peace
 - If a crime is found (sensor), the guilty party is punished (actuator).
- Cruise control in cars
- Banking industry regulation



Why Study Control Theory

- Used everywhere in robotics/mechatronics
- Systematic approach to analysis and design
- Taxonomy of controller concepts



Control Systems

- Regulation
 - Temperature (thermostat + heating)
- Tracking
 - robot joint rotation
- Process Optimization
 - maintaining best mix of chemicals

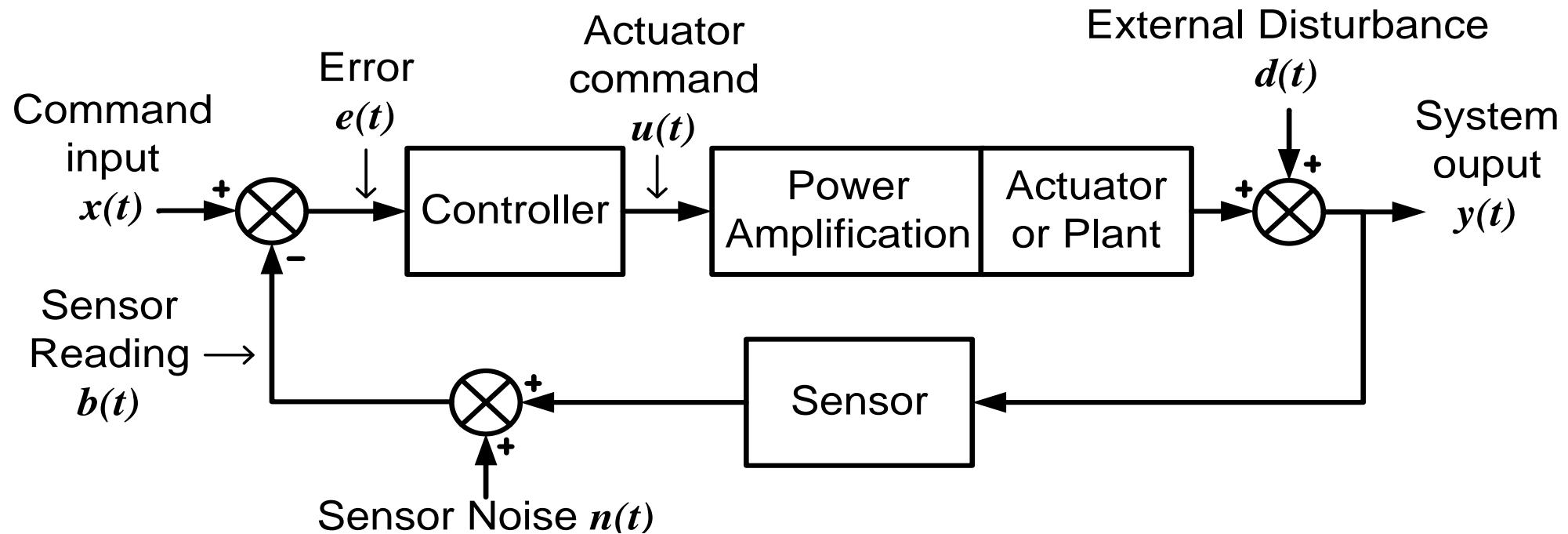


Components of Feedback Systems

- Power amplification
 - Neural signal power (μW) vs. muscle power output (tens of W)
 - Means it is an active system, as opposed to passive.
- Actuator
- Feedback
 - measurement (sensor)
- Error signal
- Controller



Classic Feedback Control Diagram

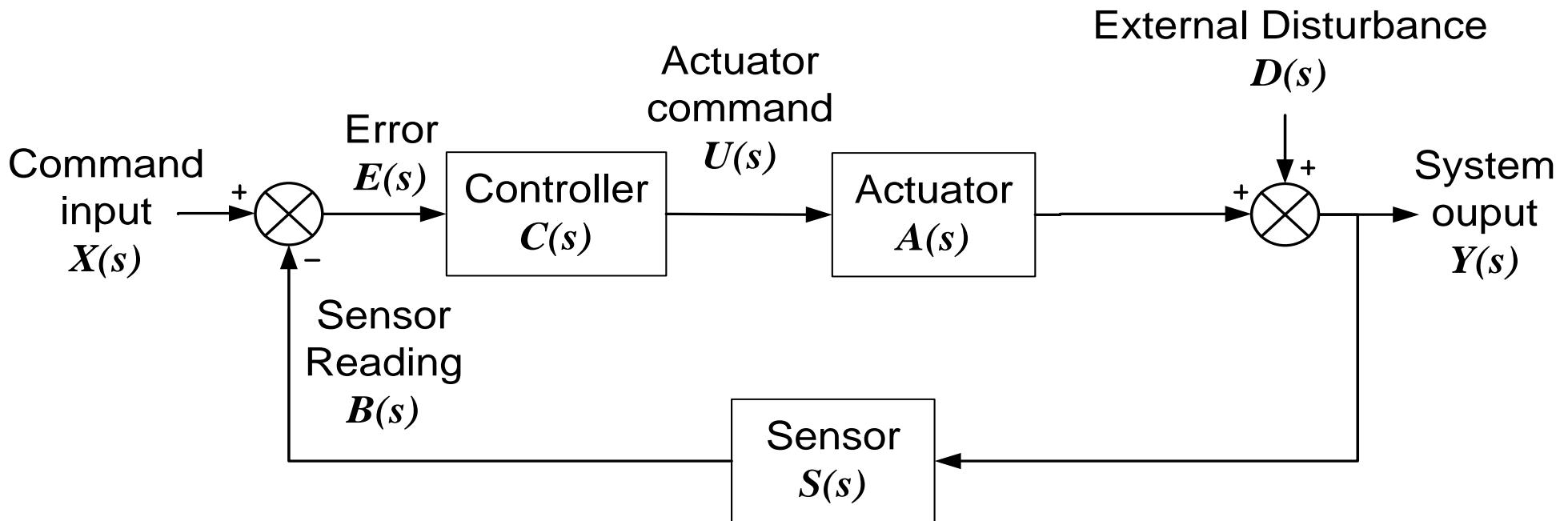


Transfer Function

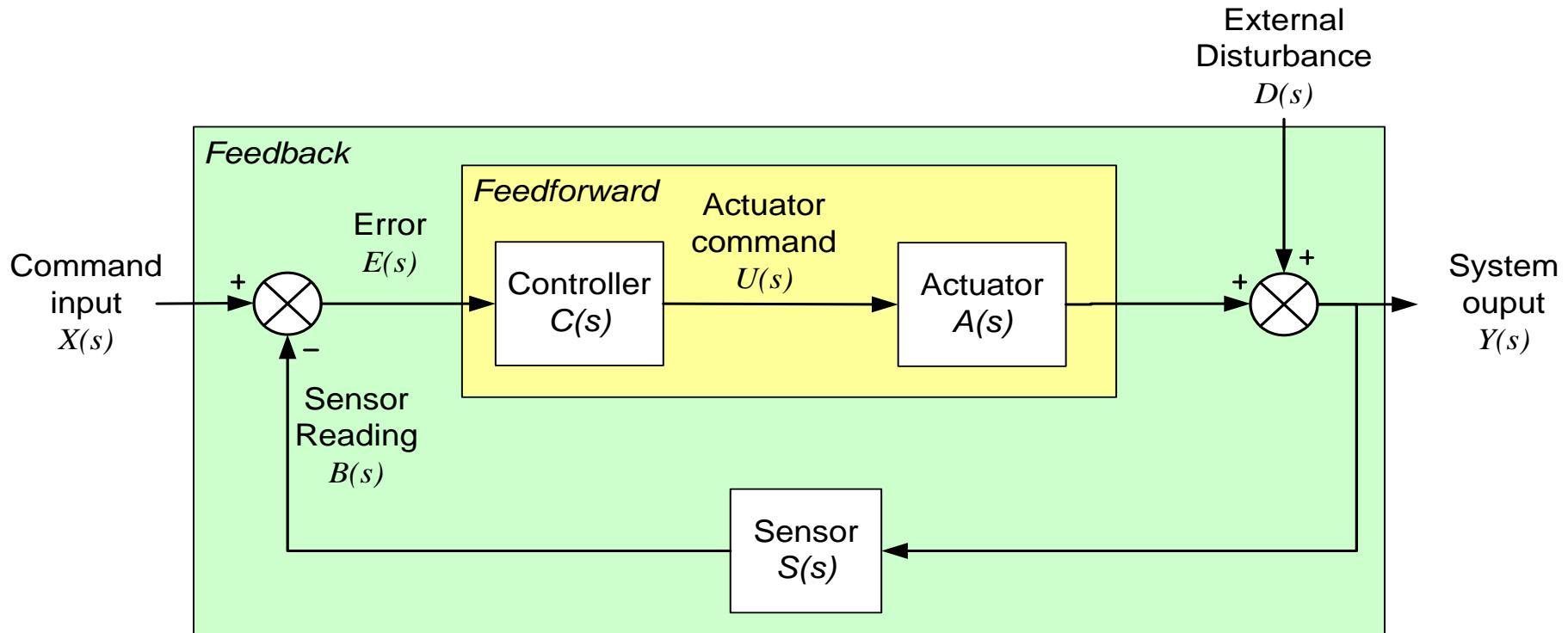
- Definition: $H(s) = Y(s) / X(s)$
- Relates the output of a linear system to its input.
- Describes how a linear system responds to an impulse... called *impulse response*



Laplace Transform of Classic Feedback System



Key Transfer Functions

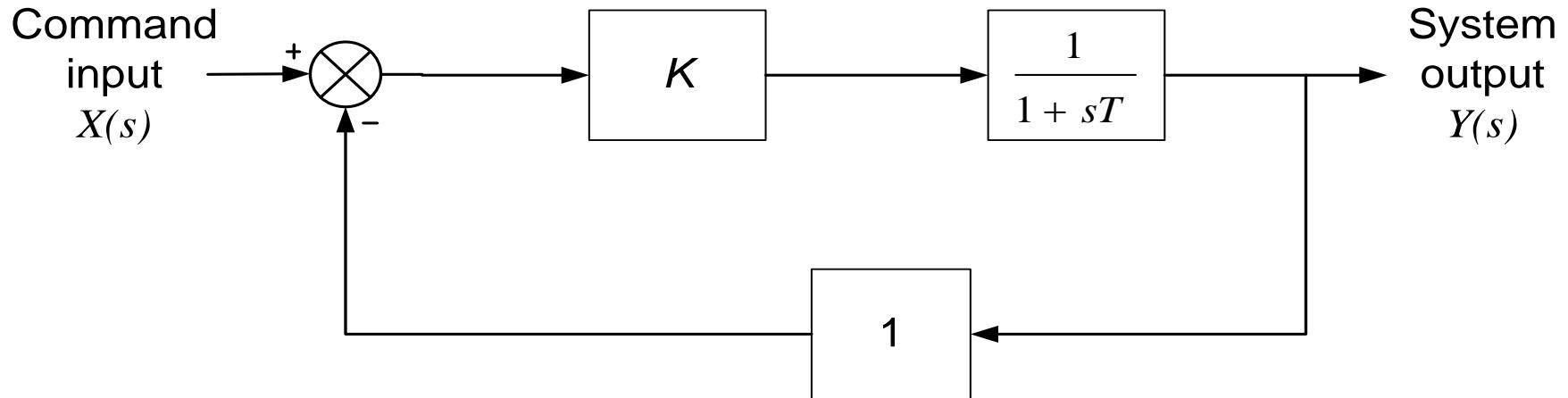


$$\text{Feedforward : } \frac{Y(s)}{E(s)} = C(s)A(s)$$

$$\text{Feedback : } \frac{Y(s)}{X(s)} = \frac{C(s)A(s)}{1 + C(s)A(s)S(s)}$$



First Order System



$$H(s) = \frac{Y(s)}{X(s)} = \frac{K}{1 + K + sT}$$

$u(t)$ is step function

Steady state value is given by Final Value Theorem

Steady state error is $1 - \lim_{s \rightarrow 0} sU(s)H(s)$

$$f(\infty) = \lim_{s \rightarrow 0} sF(s)$$

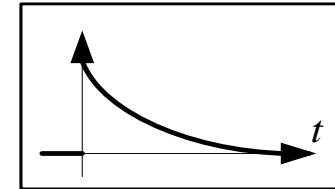
$$= 1 - \lim_{s \rightarrow 0} s \frac{1}{s} \left\{ \frac{K}{1 + K + sT} \right\} = 1 - \frac{K}{1 + K} = \frac{1}{1 + K} \approx \frac{1}{K}$$



Response of 1st Order System

- Impulse

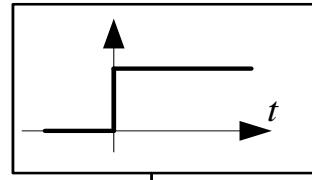
$$\frac{K}{1 + K + sT}$$



- Step

Time Domain
Laplace Domain

“step”
function

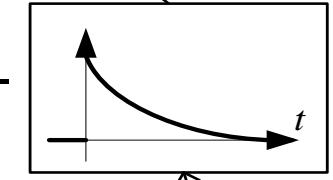
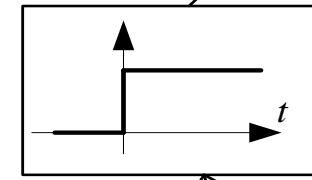
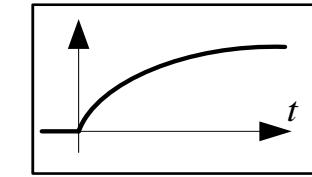


$$\frac{1}{s}$$

X

$$\frac{K}{1 + K + Ts}$$

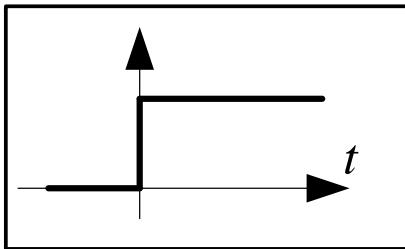
$$= \frac{K}{s(1 + K + Ts)} = \frac{1}{s} \frac{K}{(1 + K)} - \frac{K}{(1 + K) \frac{1}{T} + s}$$



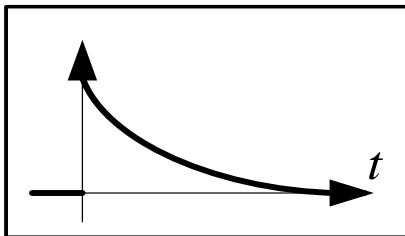
Steady-State vs. Transient

- Step Response illustrates how a system response can be decomposed into two components:

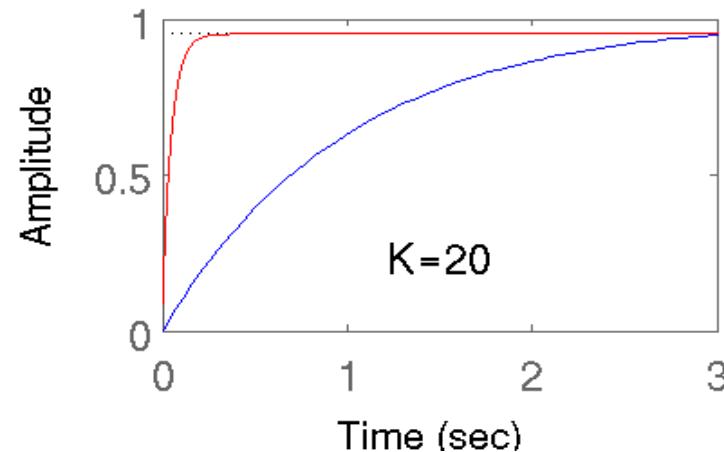
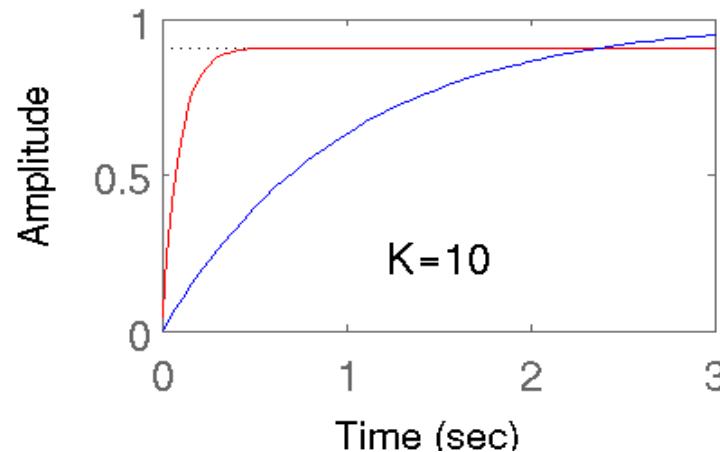
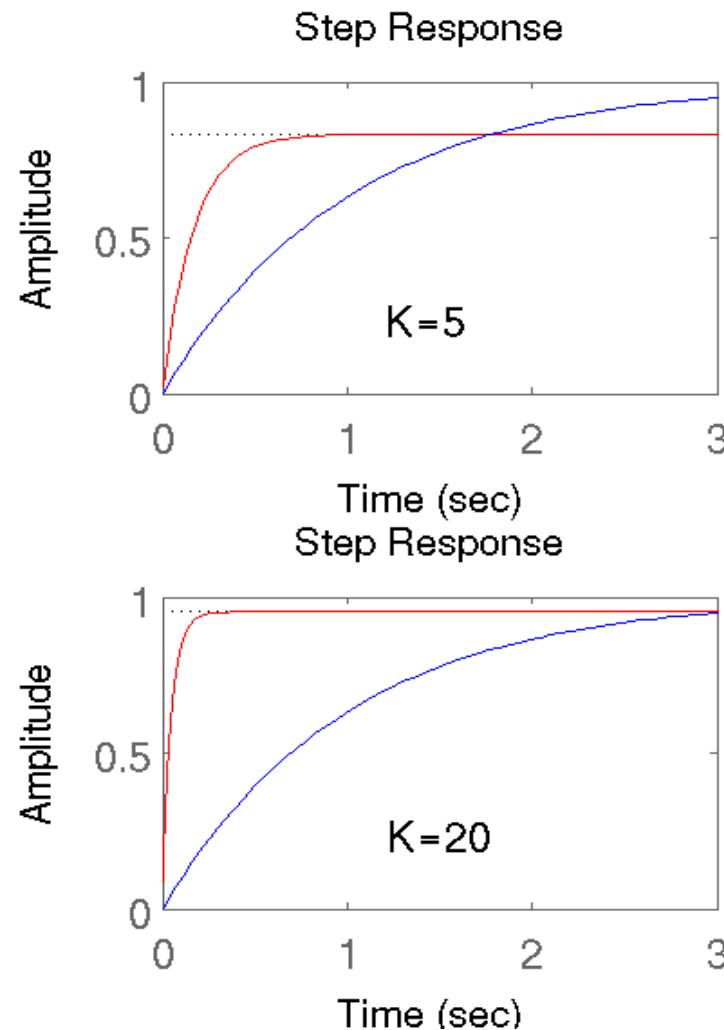
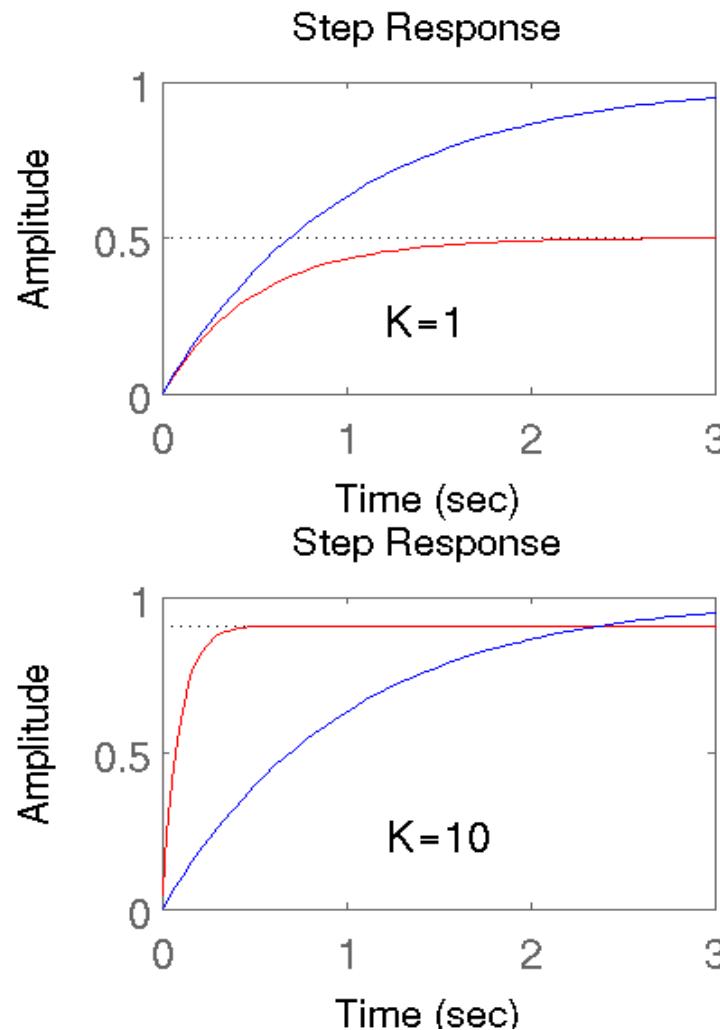
- Steady-state part:



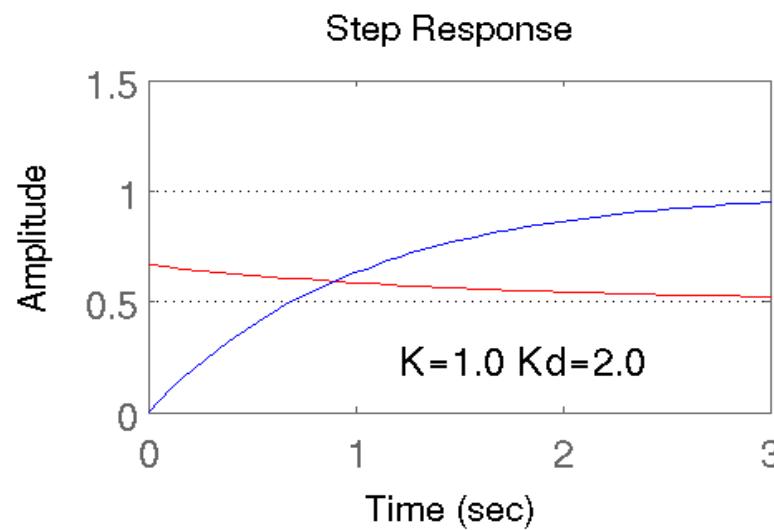
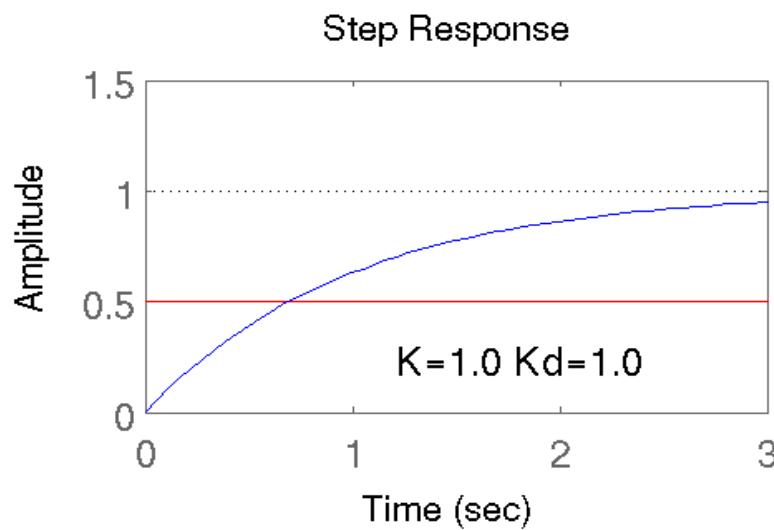
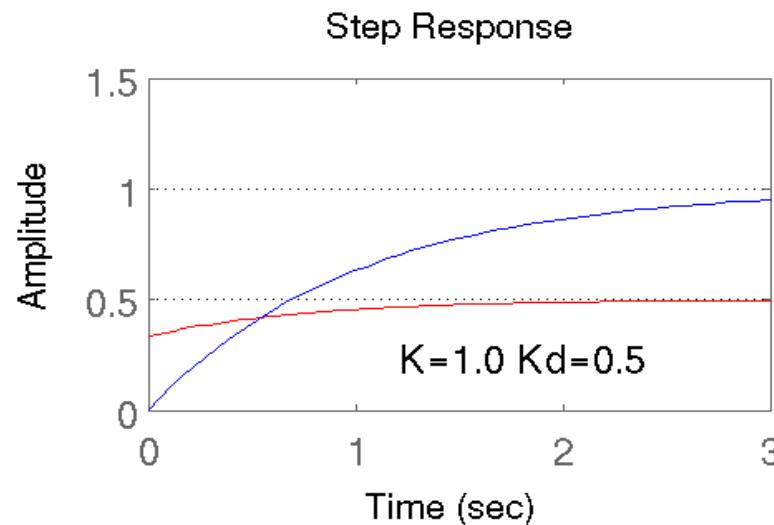
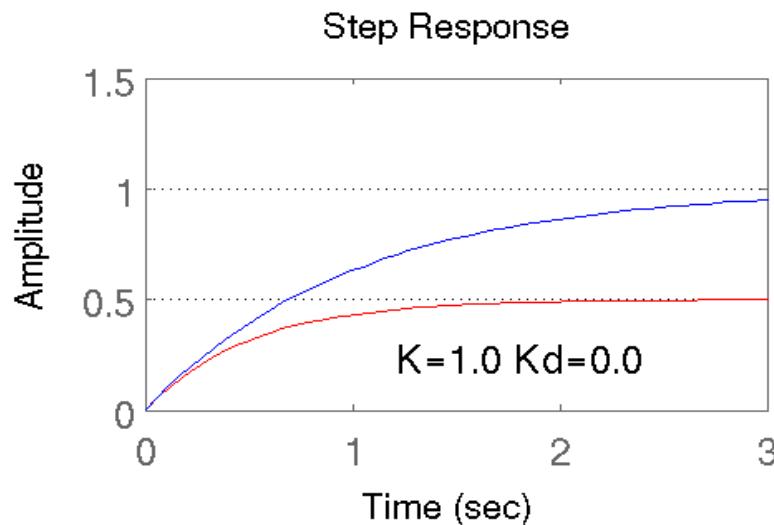
- Transient



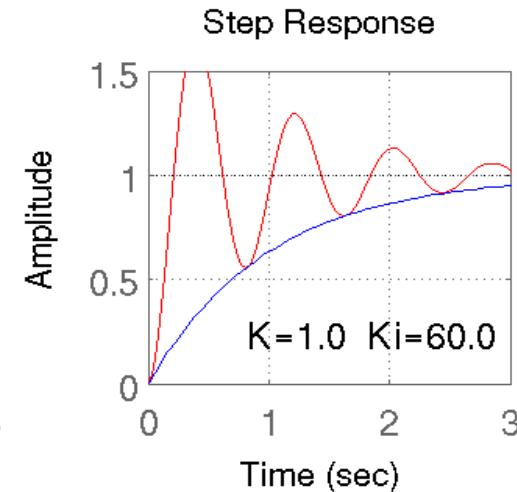
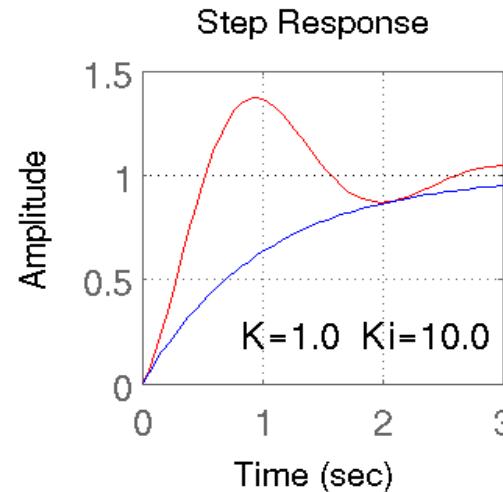
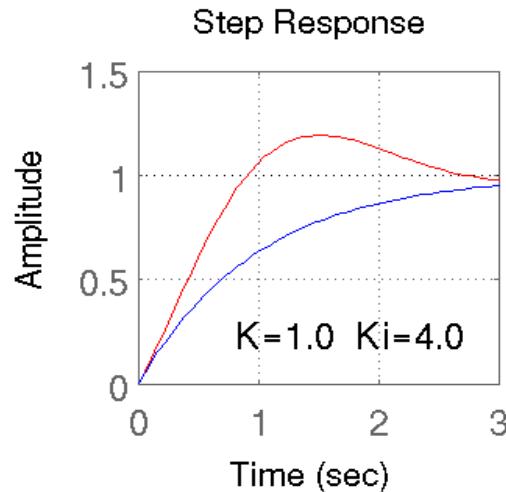
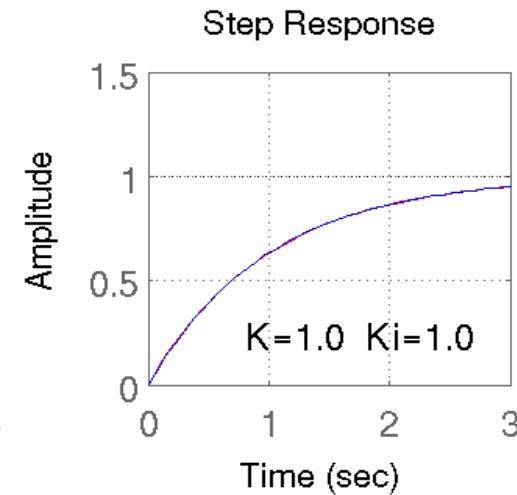
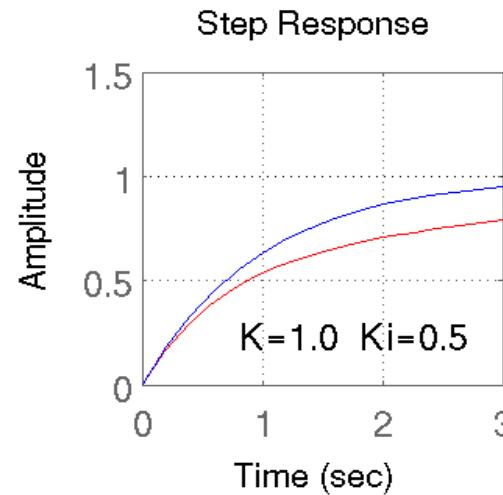
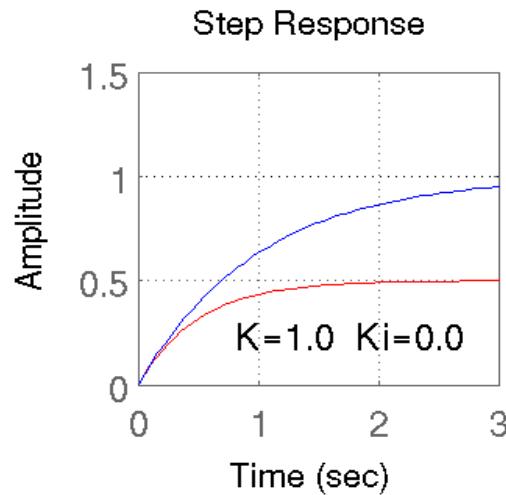
1st Order System: P Controller



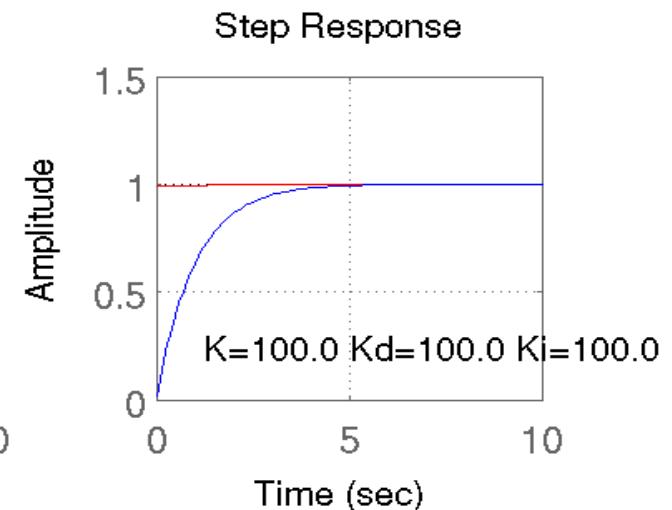
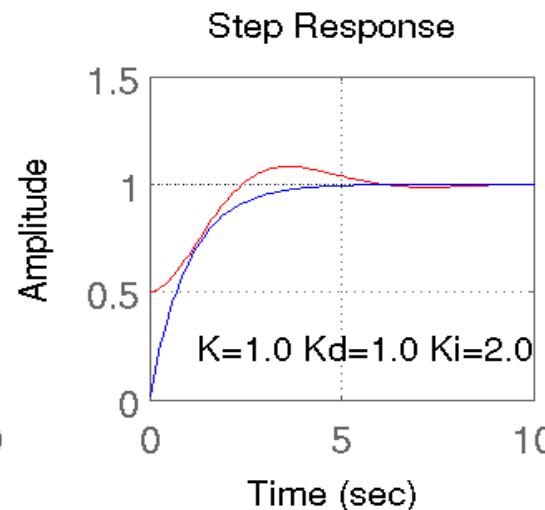
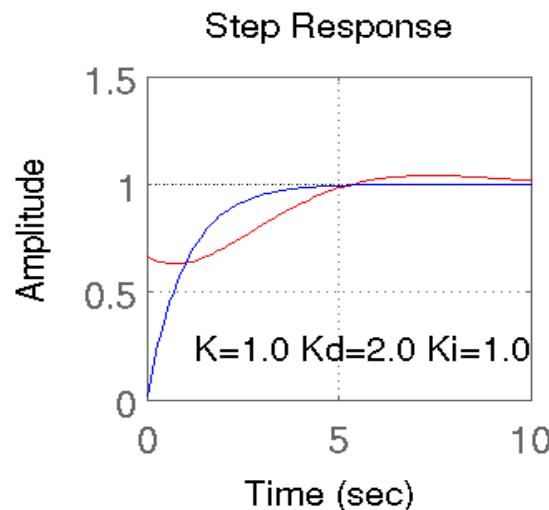
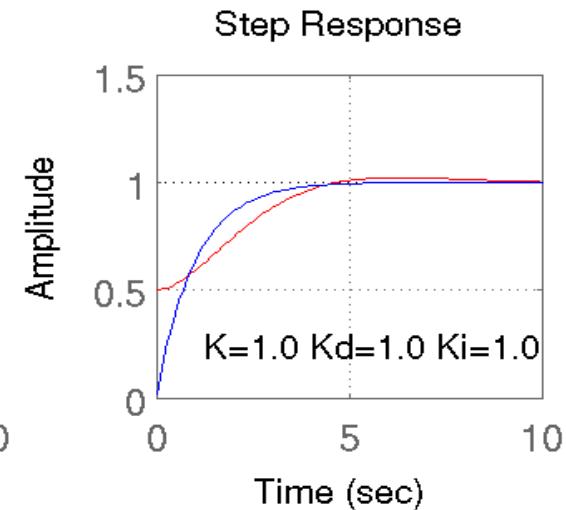
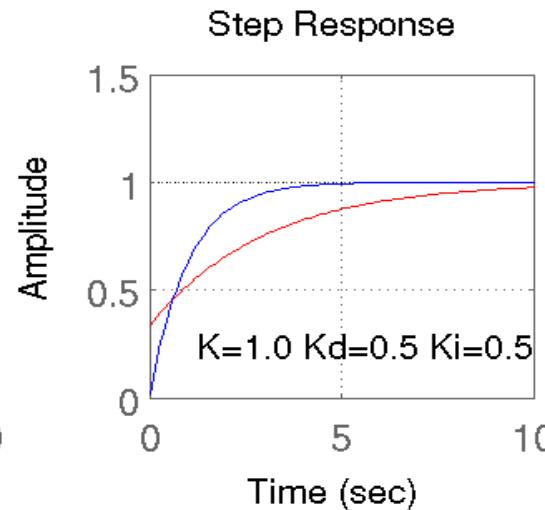
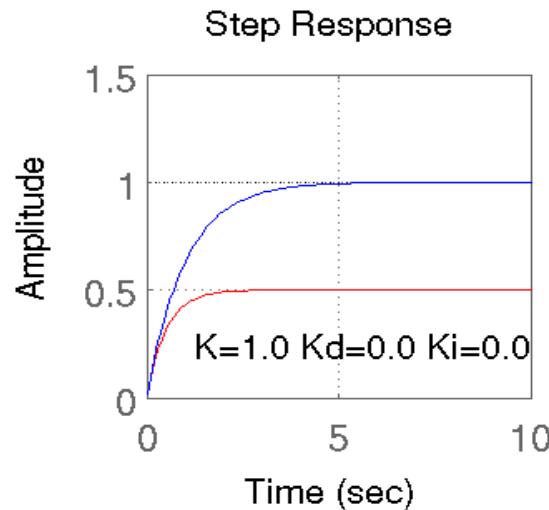
1st Order System: PD Controller



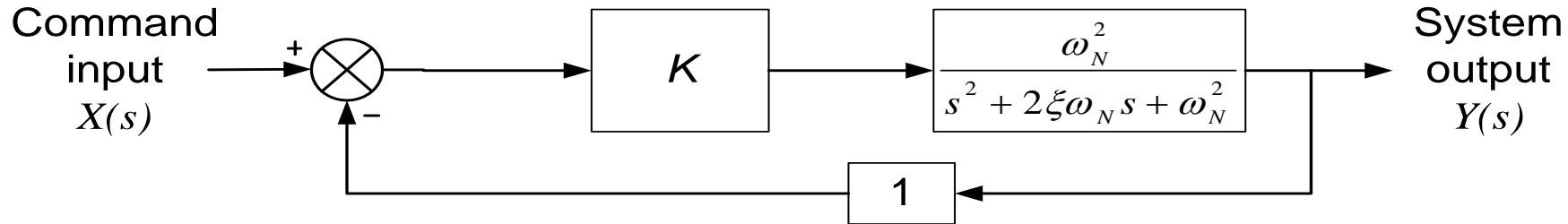
1st Order System: PI Controller



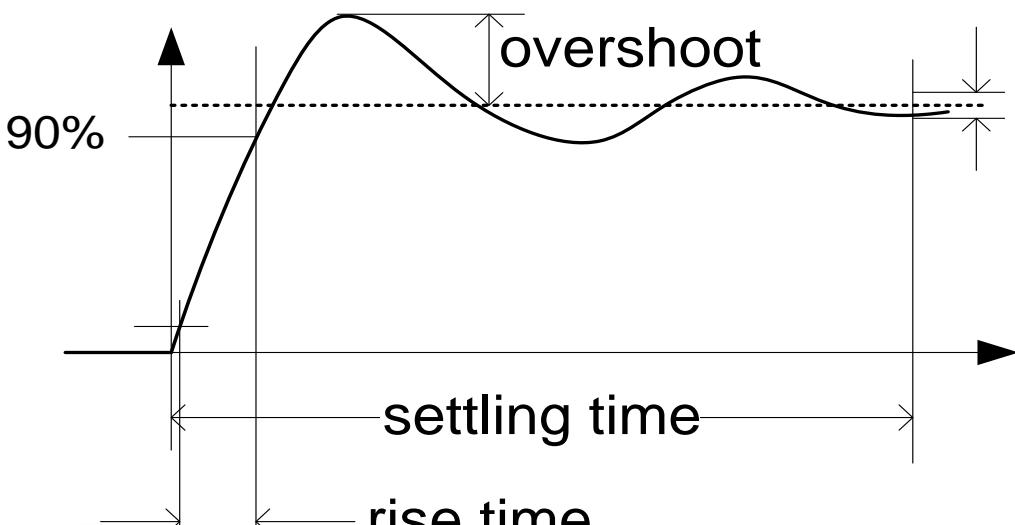
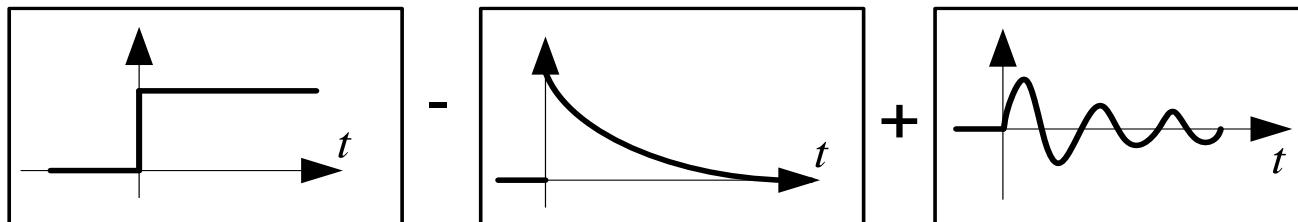
1st Order System: PID Controller



Second Order Response



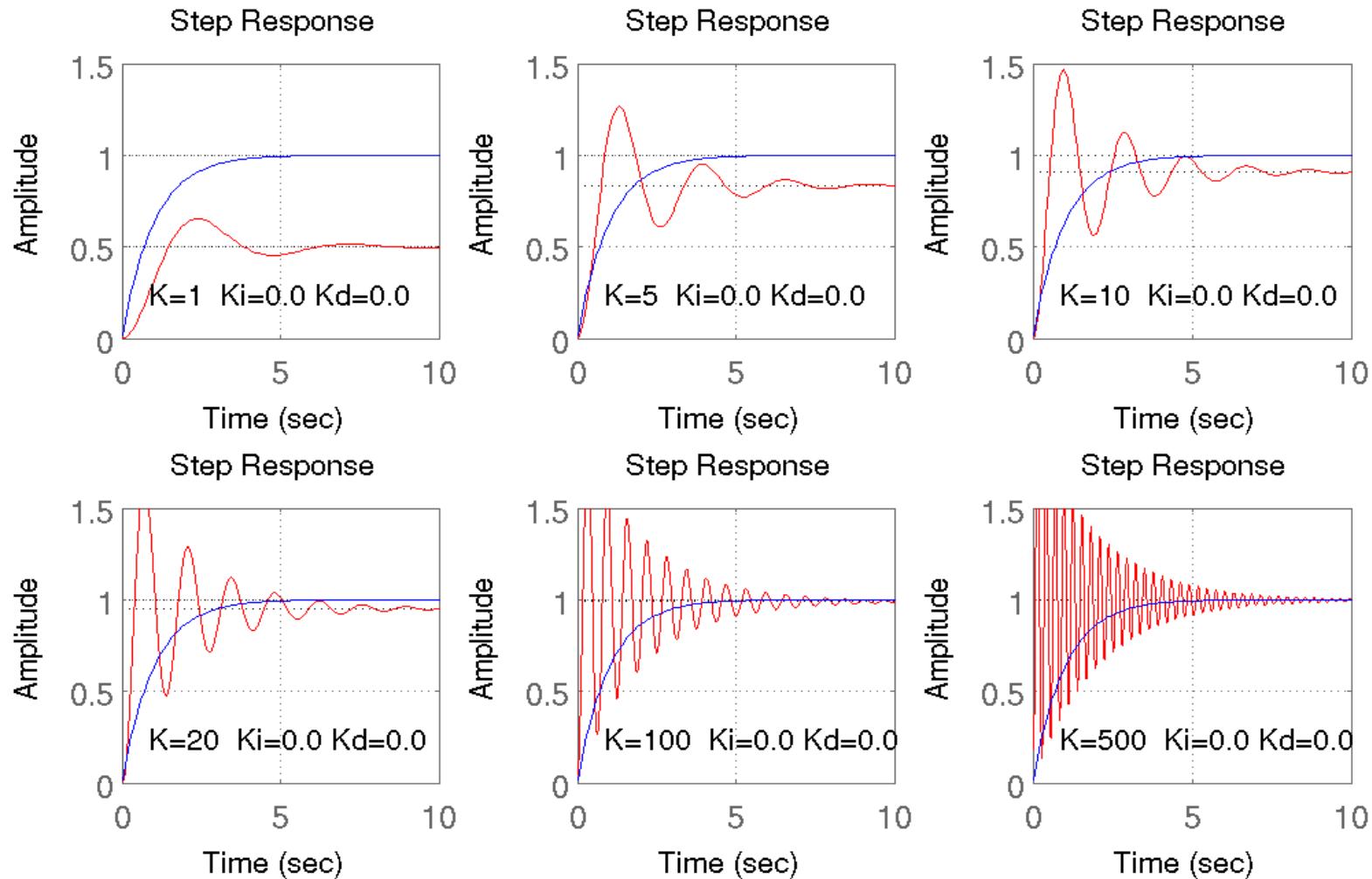
- Typical response to step input is:



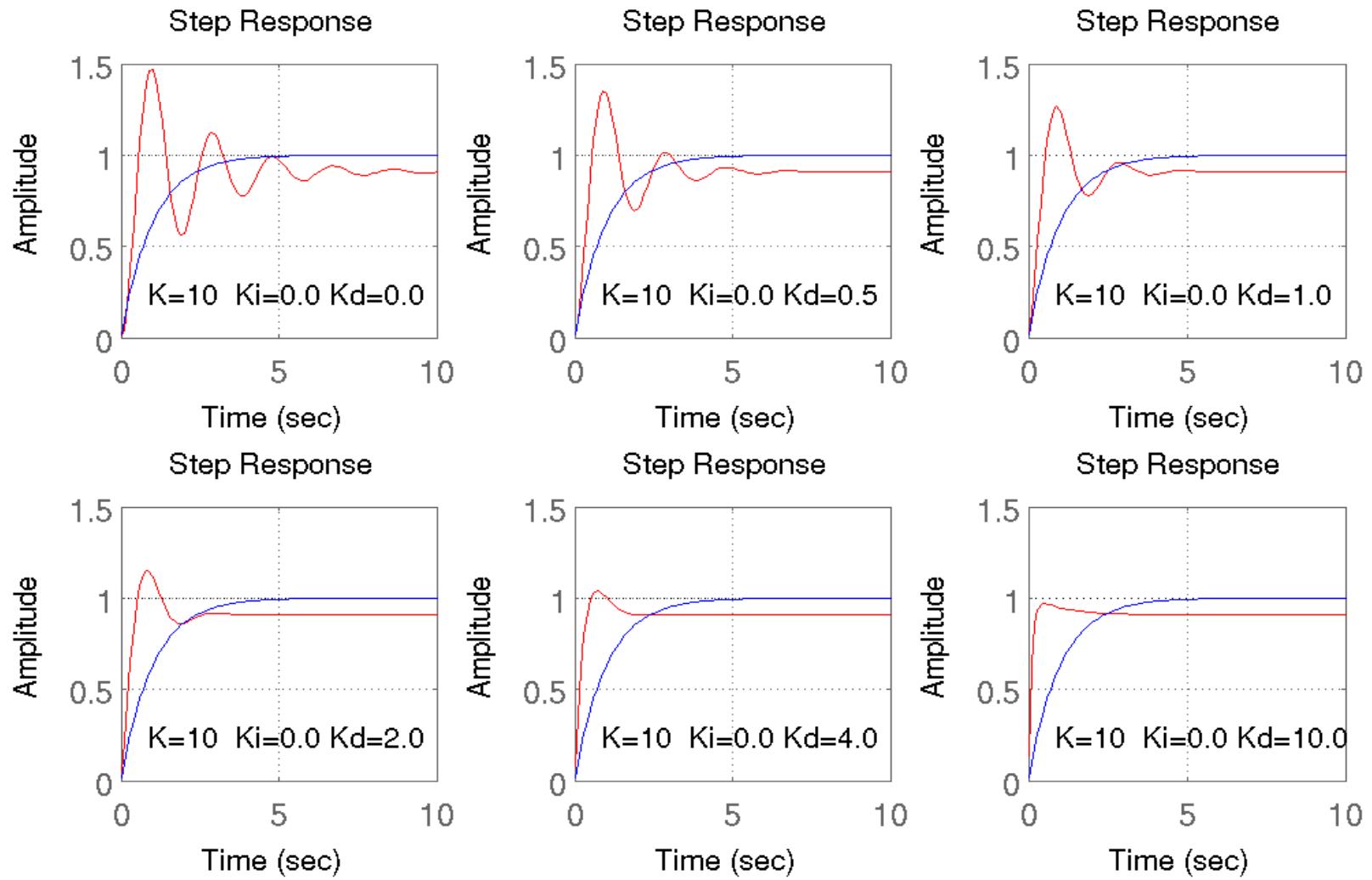
overshoot -- % of final value exceeded at first oscillation
rise time -- time to span from 10% to 90% of the final value
settling time -- time to reach within 2% or 5% of the final value



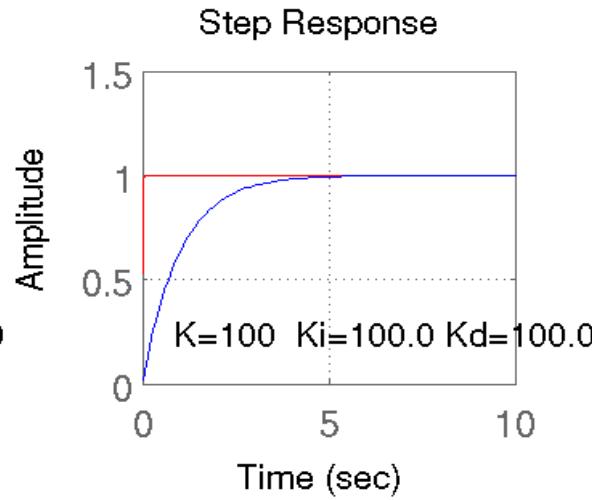
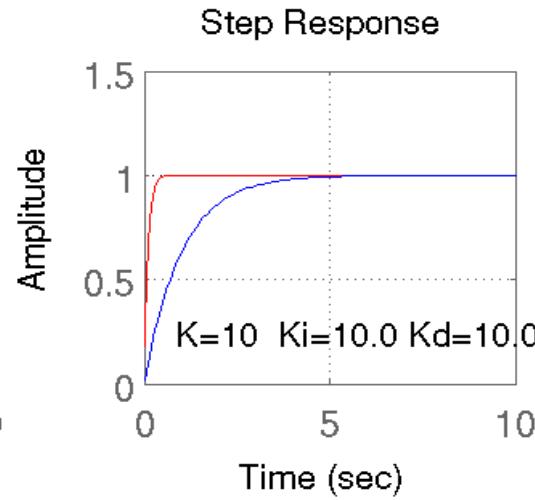
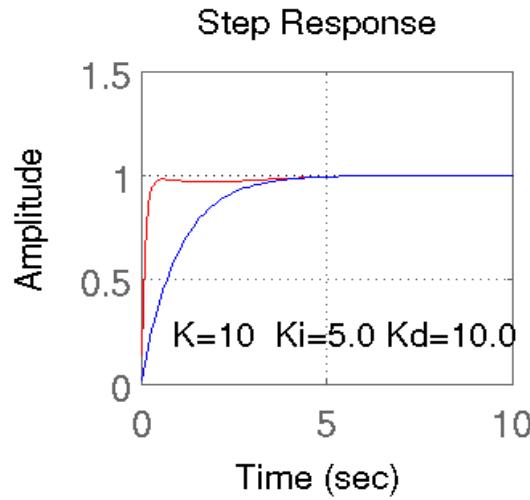
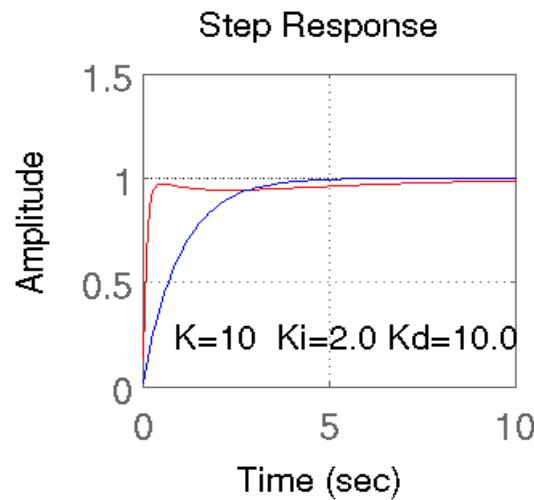
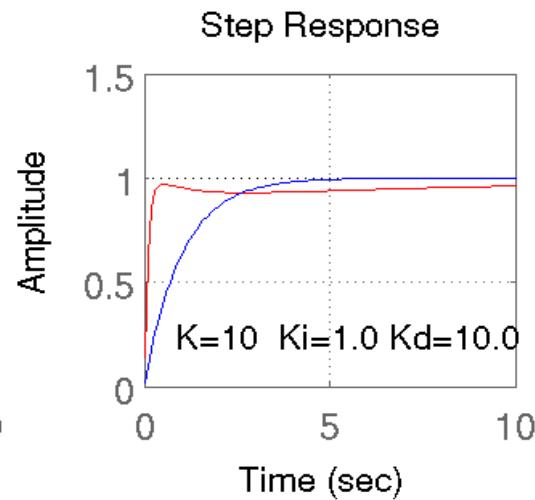
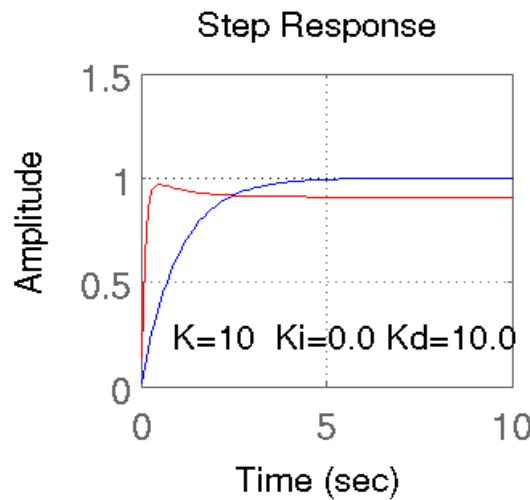
2nd Order System: P Controller



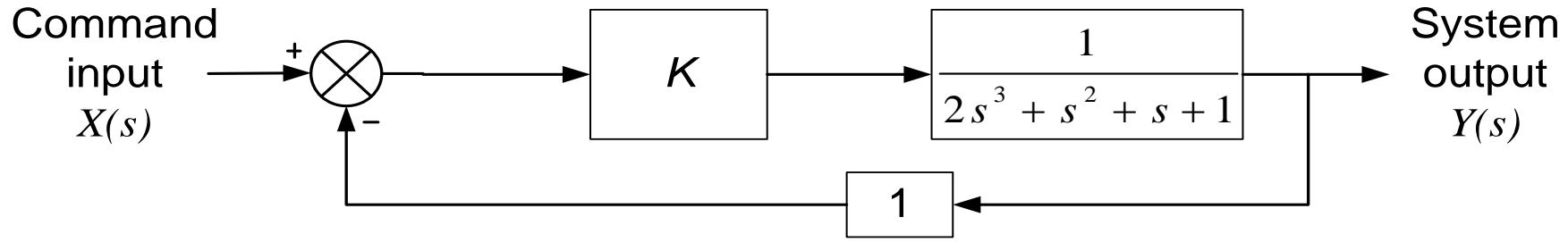
2nd Order System: PD Controller



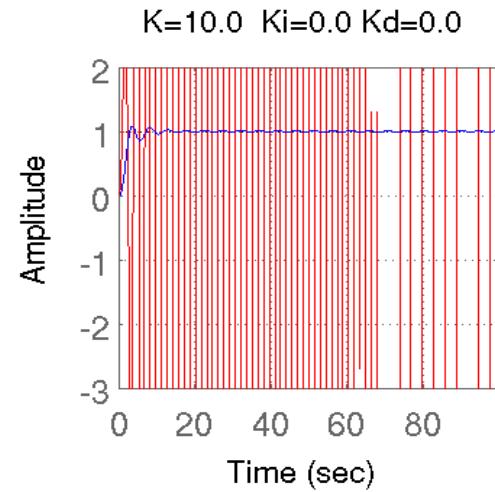
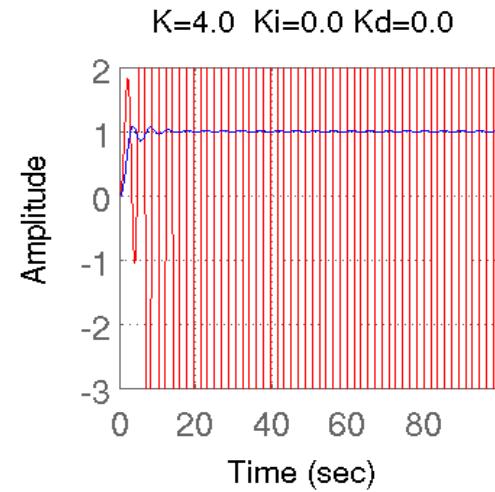
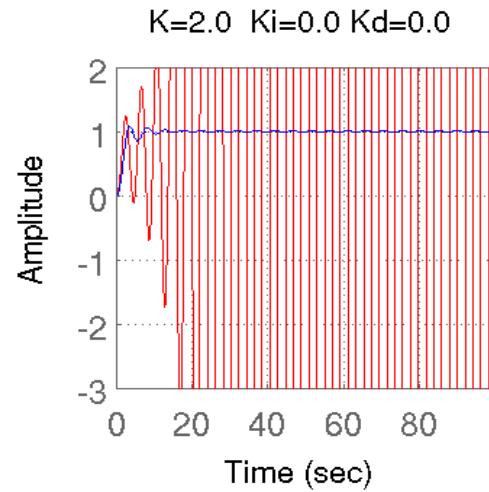
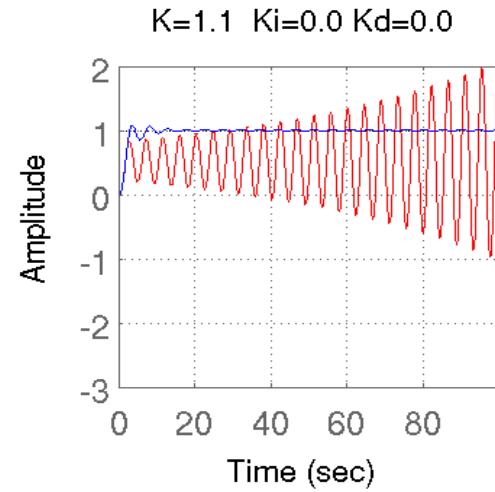
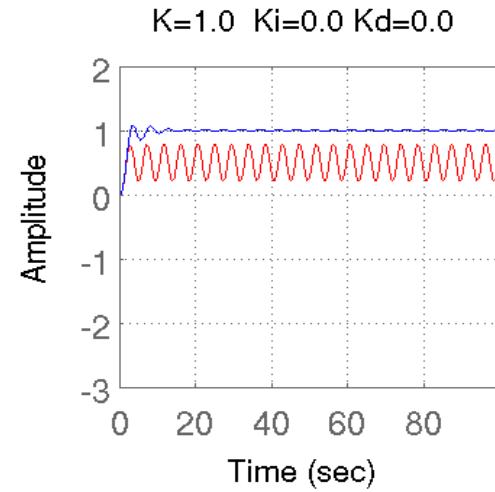
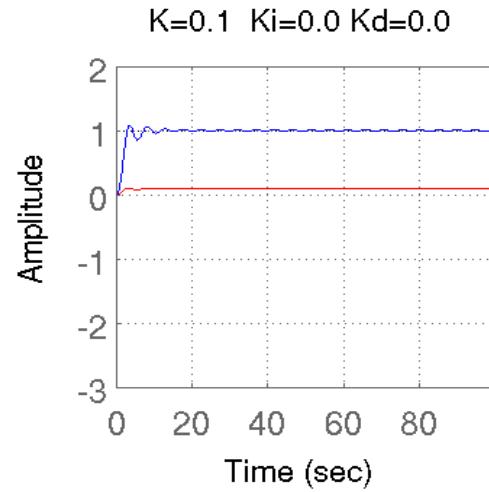
2nd Order System: PID Controller



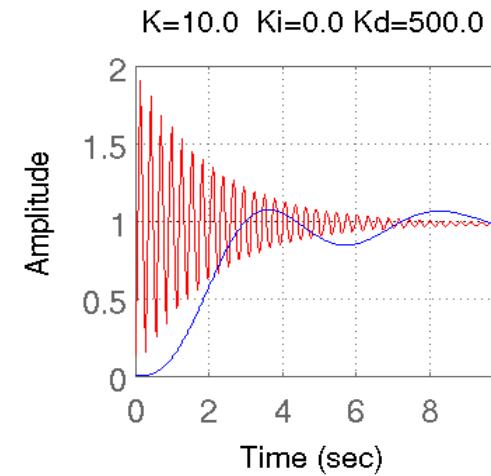
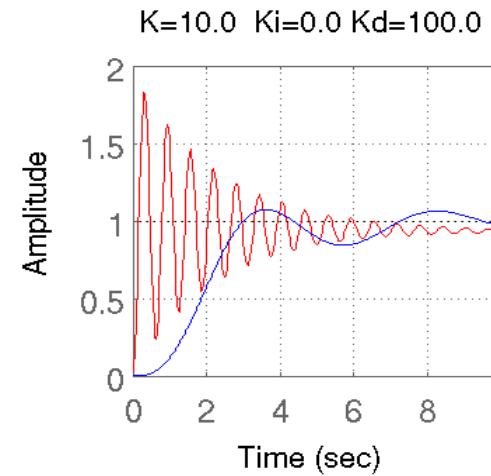
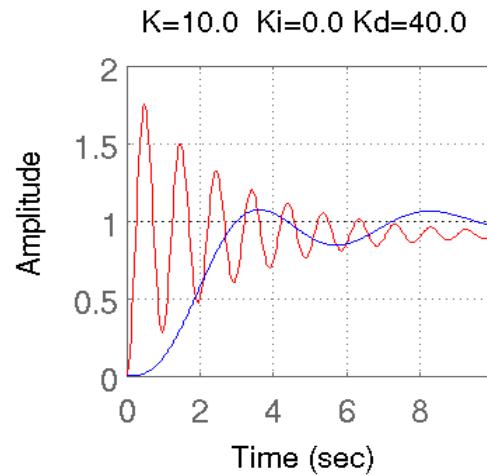
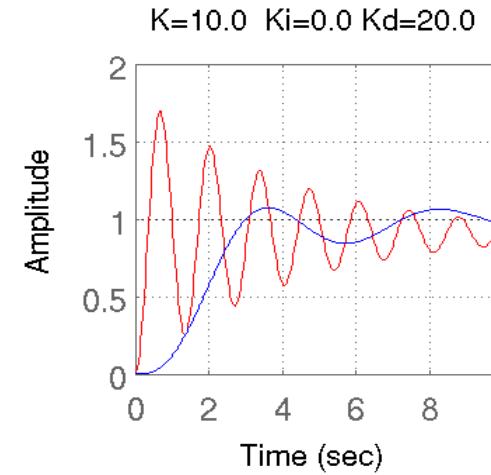
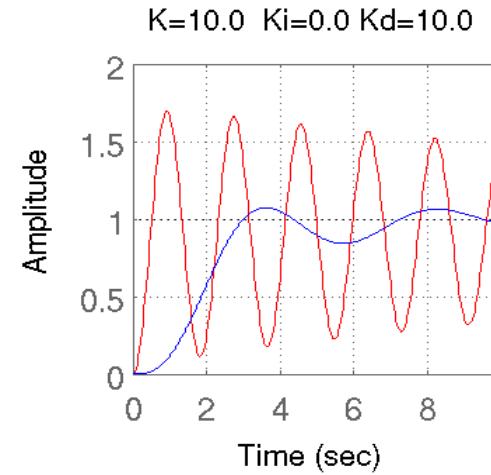
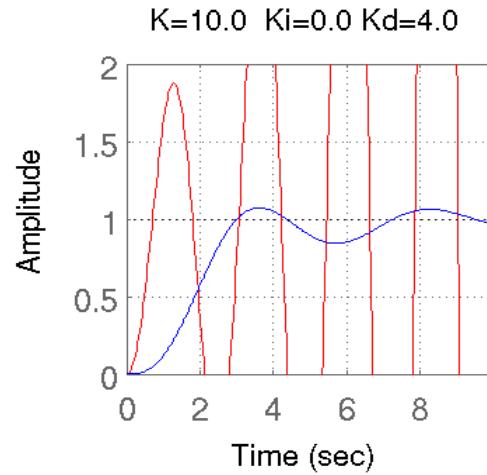
3rd Order System



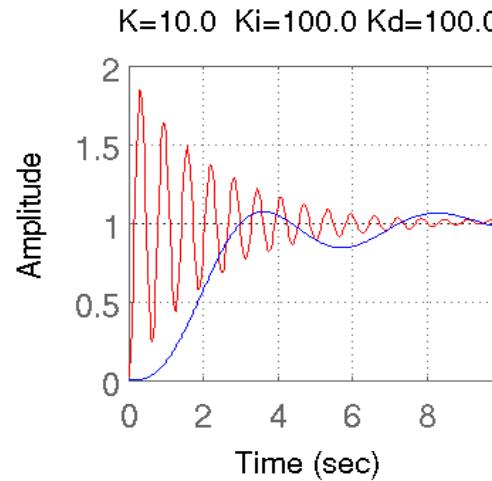
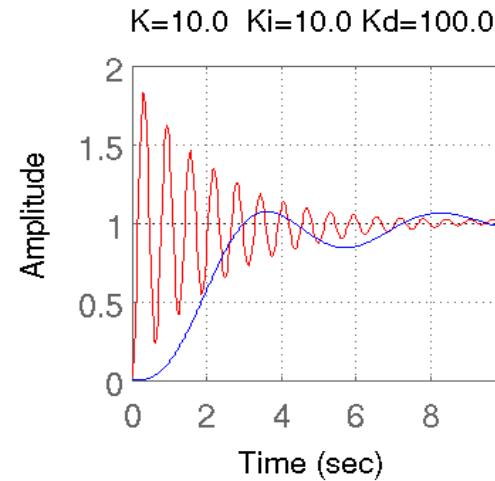
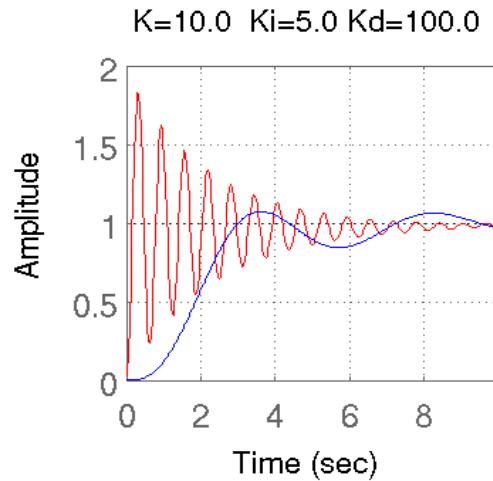
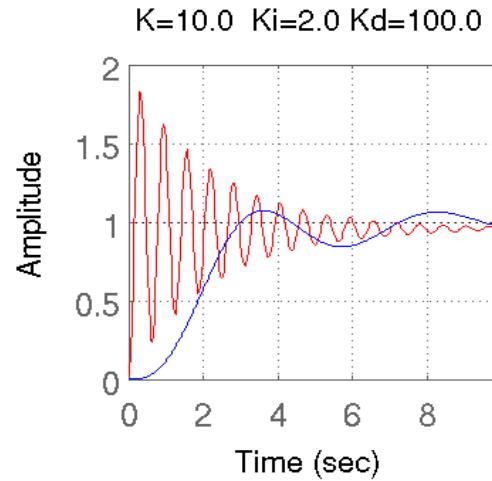
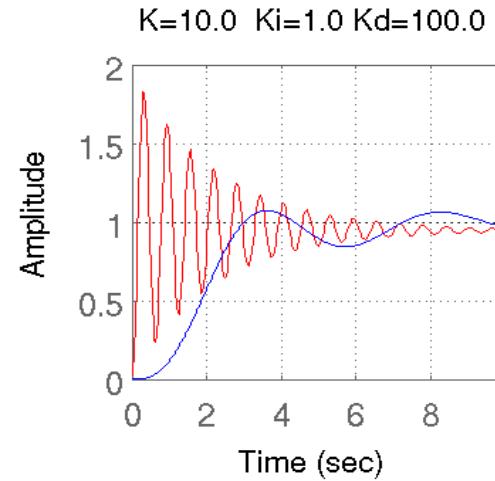
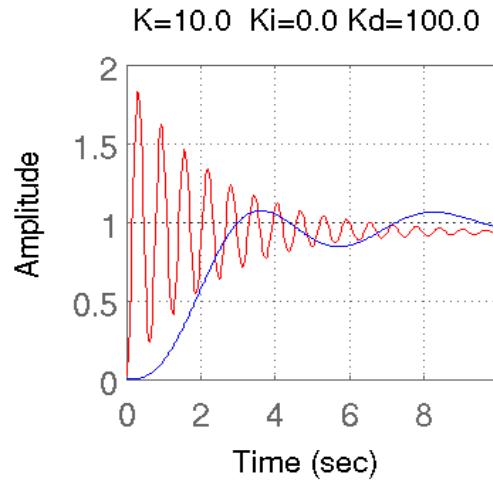
3rd Order System: P Controller



3rd Order System: PD Controller



3rd Order System: PID Controller



Basic Controller Functions

Proportional control: $u(t) = K_p e(t)$

$$\frac{U(s)}{E(s)} = K_p$$

Integral control: $u(t) = K_i \int_0^t e(t) dt$

$$\frac{U(s)}{E(s)} = \frac{K_i}{s}$$

Differential control: $u(t) = K_d \frac{d}{dt} e(t)$

$$\frac{U(s)}{E(s)} = K_d s$$



Effect of Controller Functions

- Proportional Action
 - Simplest Controller Function
- Integral Action
 - Eliminates steady-state error
 - Can cause oscillations
- Derivative Action (“rate control”)
 - Effective in transient periods
 - Provides faster response (higher sensitivity)
 - Never used alone



PID Tuning

How to get the PID parameter values ?

- (1) If we know the transfer function, analytical methods can be used (e.g., root-locus method) to meet the transient and steady-state specs.
- (2) When the system dynamics are not precisely known, we must resort to experimental approaches.

Ziegler-Nichols Rules for Tuning PID Controller:

Using only Proportional control, turn up the gain until the system oscillates w/o dying down, i.e., is marginally stable. Assume that K and P are the resulting gain and oscillation period, respectively.

Then, use

for P control

$$K_p = 0.5 K$$

for PI control

$$K_p = 0.45 K$$
$$K_i = 1.2 / P$$

for PID control

$$K_p = 0.6 K$$
$$K_i = 2.0 / P$$
$$K_d = P / 8.0$$

Ziegler-Nichols Tuning for
second or higher order
systems



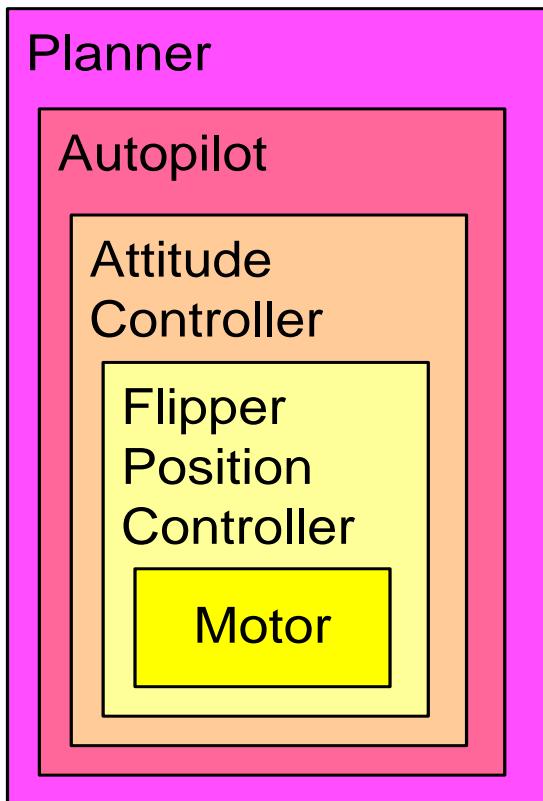
Advanced Control Topics

- Adaptive Control
 - Controller changes over time (adapts).
- MIMO Control
 - Multiple inputs and/or outputs.
- Predictive Control
 - You measure disturbance and react before measuring change in system output.
- Optimal Control
 - Controller minimizes a cost function of error and control energy.
- Nonlinear systems
 - Neuro-fuzzy control.
 - Challenging to derive analytic results.



Layered Approach to Control

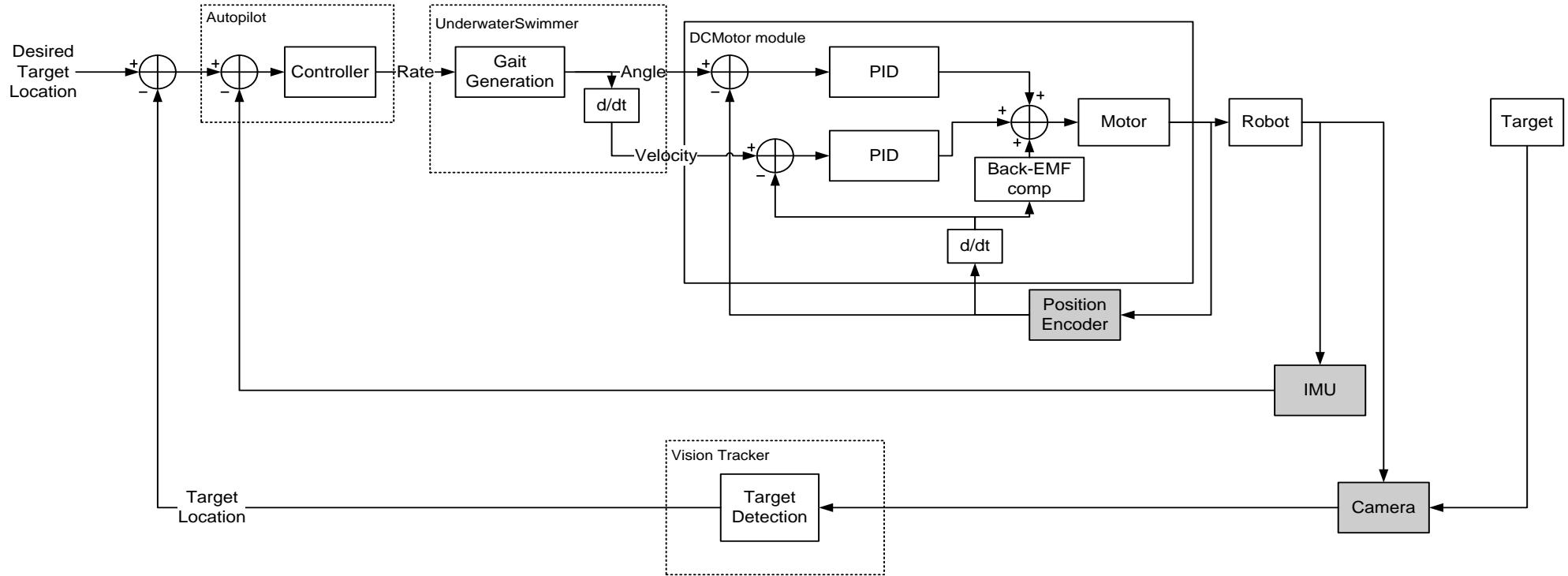
- Robotic systems often have a layered approach to control:



[movie](#)



Multiple Loops

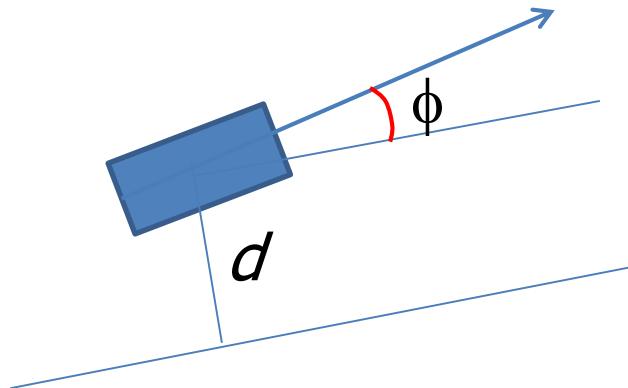


Inner loops are generally “faster” than outer loop.



Line Following

- Consider a 2D robot with pose (x, y, θ) following a line. The robot is moving with constant speed v , and we control the angular velocity ω (turnrate).



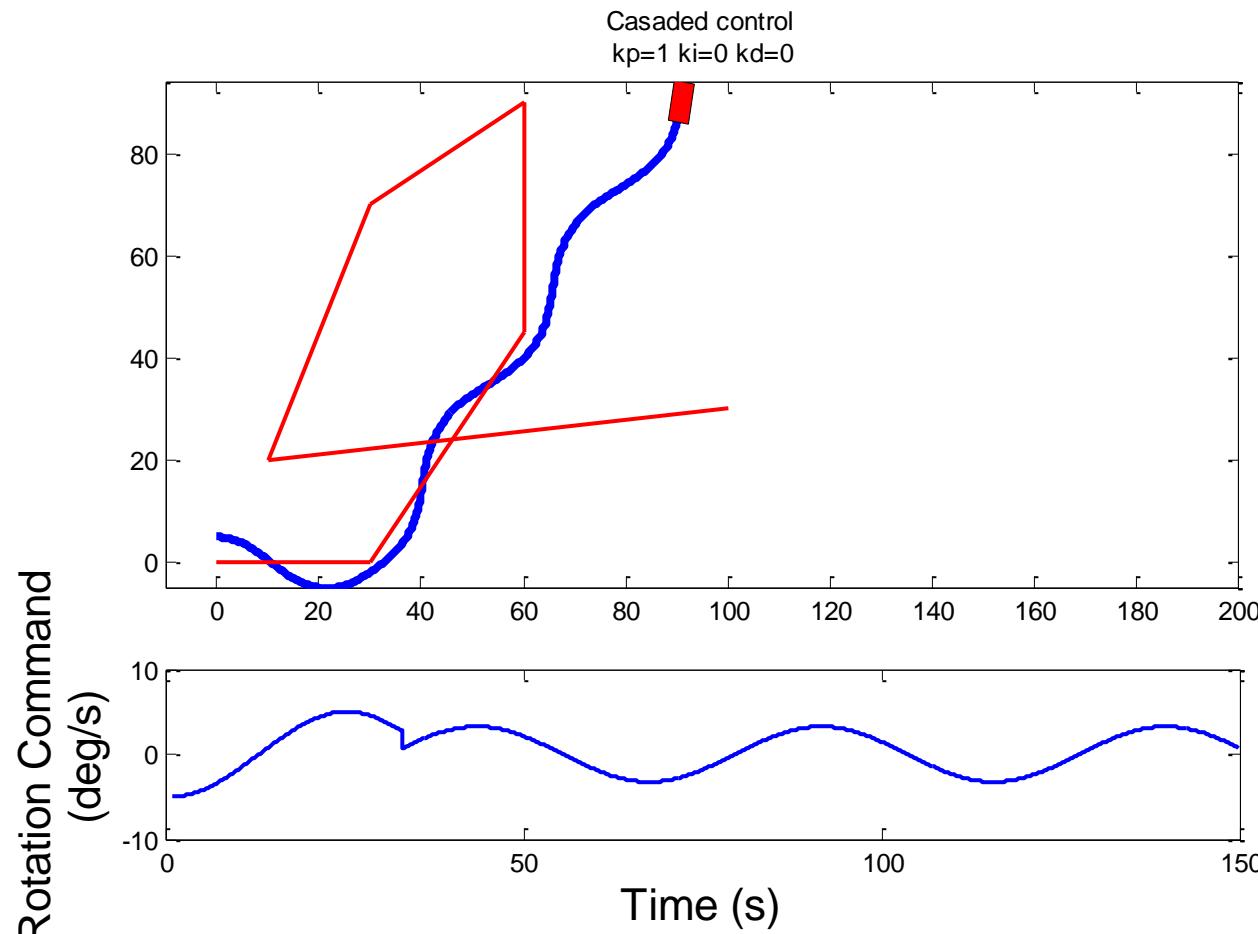
Calculating the error

- Consider two error measures,
 - d
 - ϕ
- The orientation error is used to estimate when we are heading too much in the wrong direction
 - if $|\phi| < 90^\circ$ ω is bounded
- The distance error is what we feed to our controller.



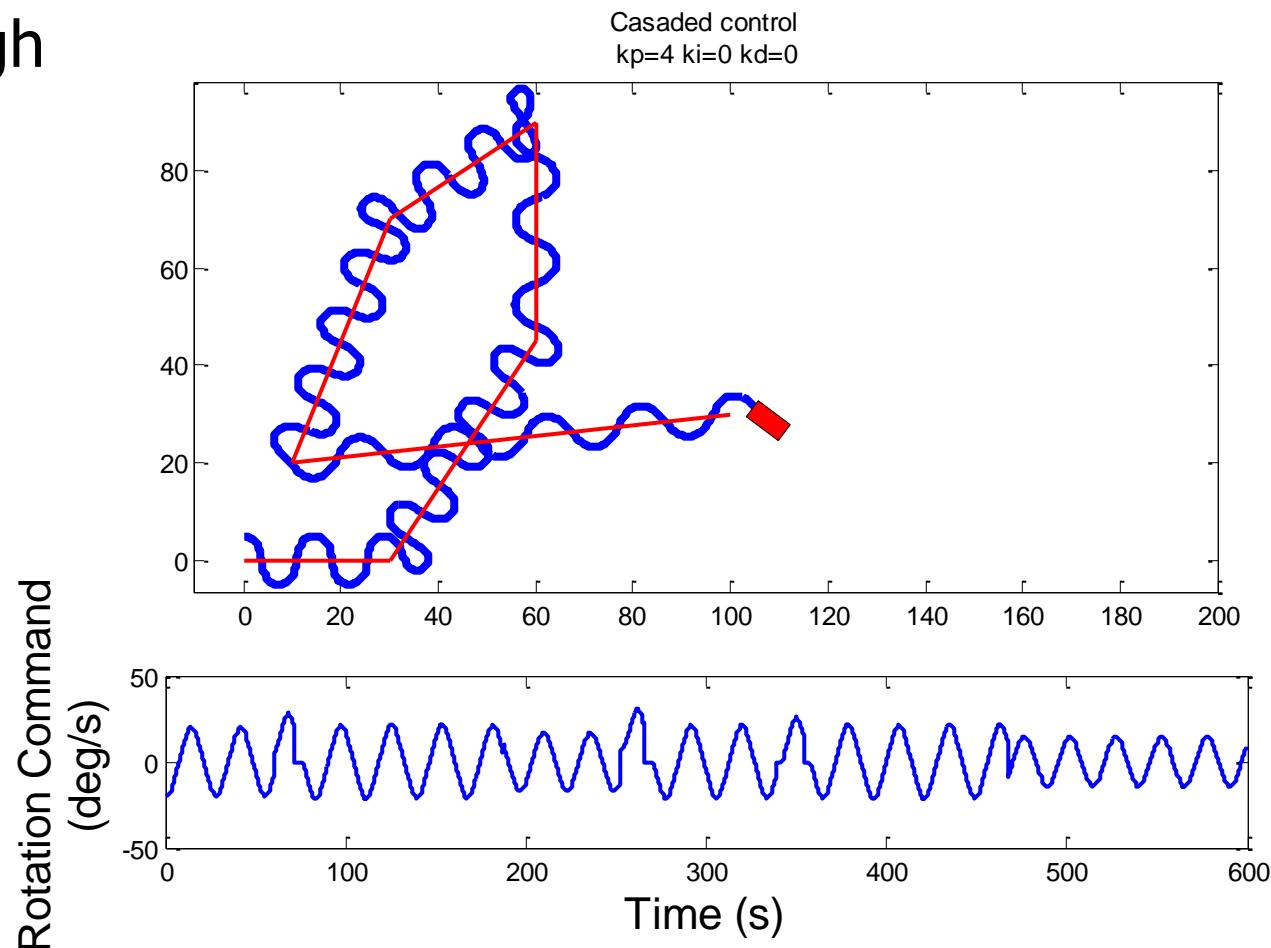
P-Controller

Gain too low



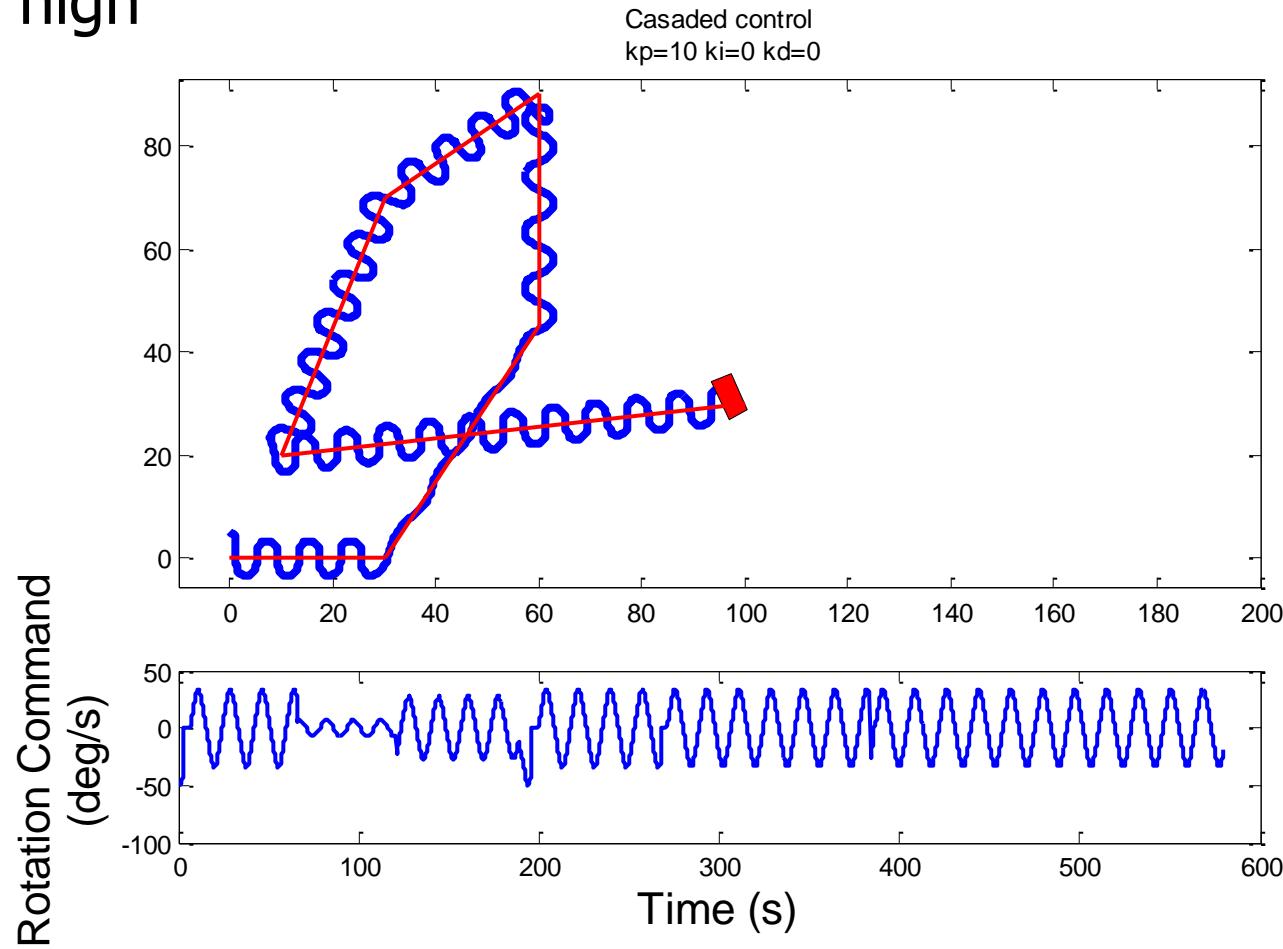
P-Controller

Gain high



P-Controller

Gain too high



Pd-Controller

- We are using also the derivative of the error:

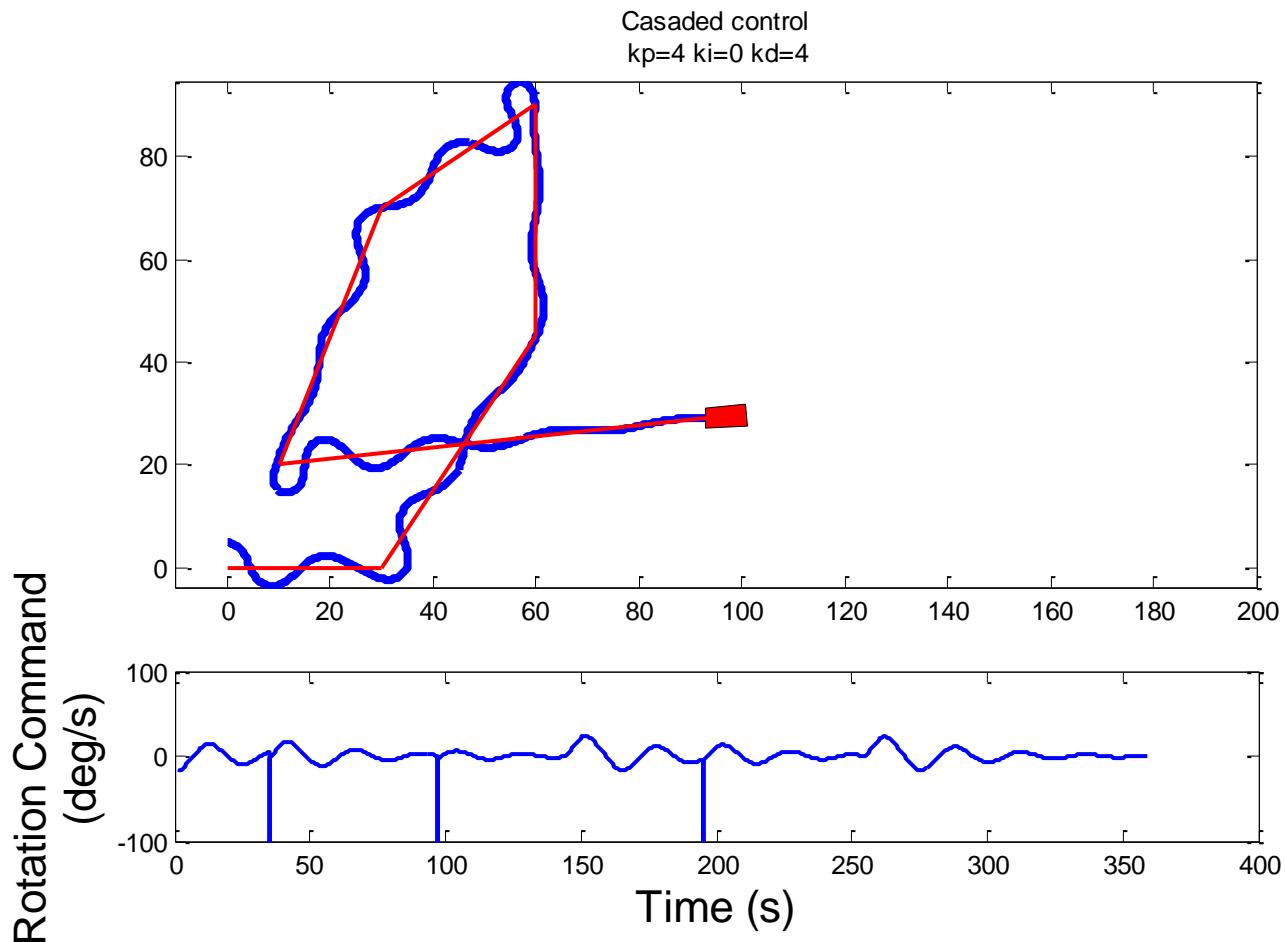
- $\dot{e} = \frac{d_t - d_{t-1}}{dt}$

to calculate the turnrate ω :

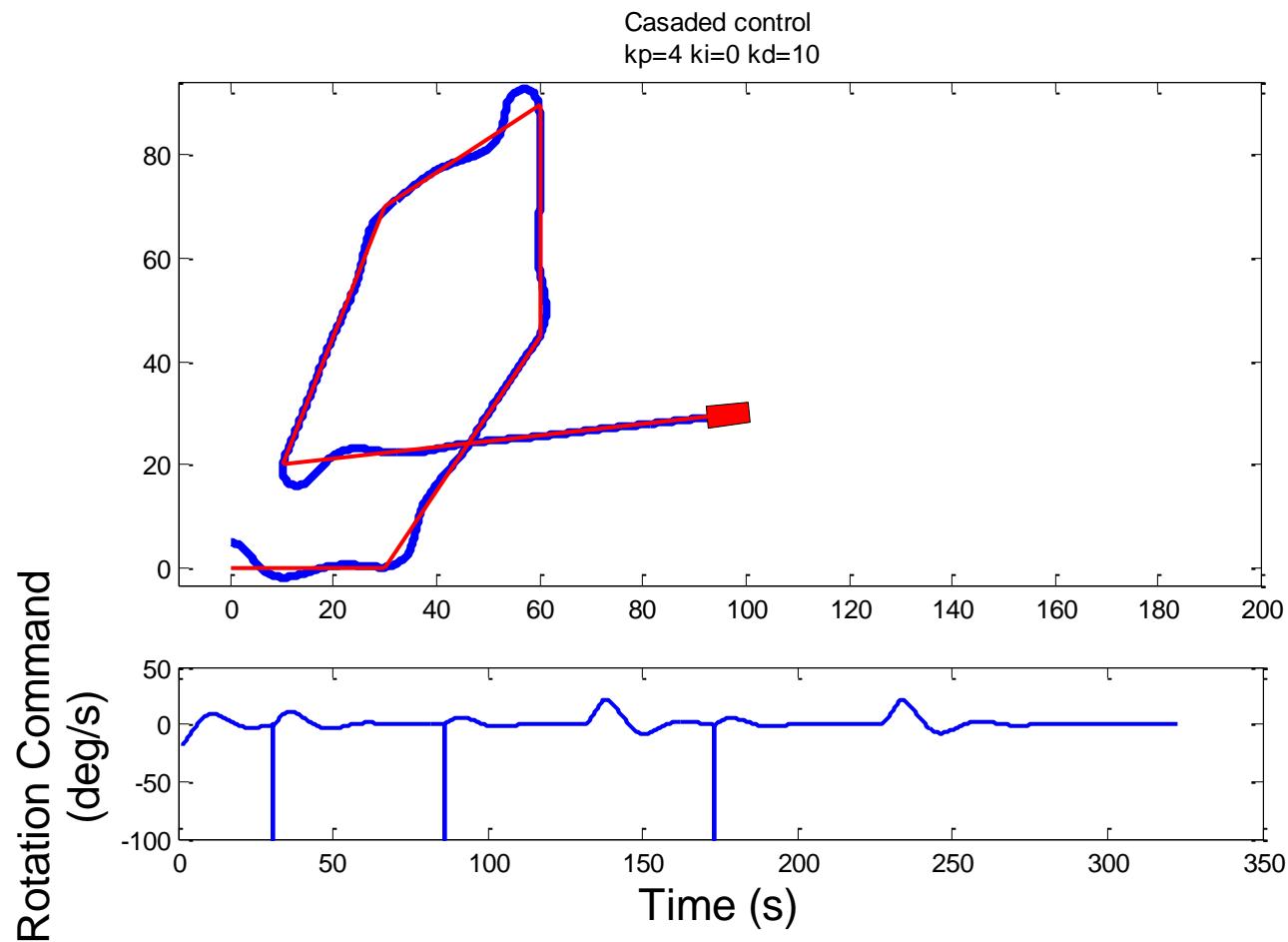
$$\omega = k_p \cdot d_t + k_d \cdot \dot{e}$$



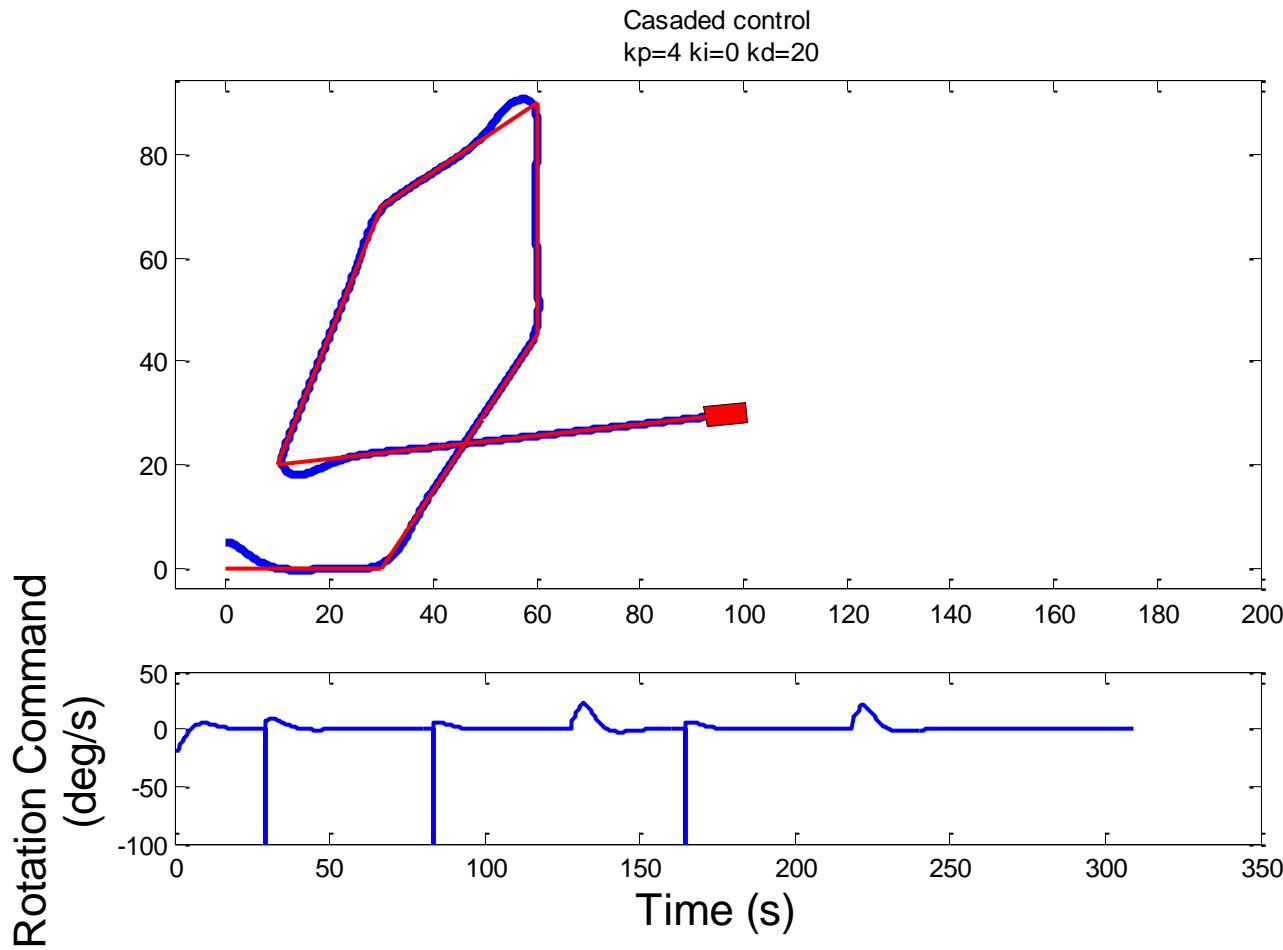
Pd-Controller



Pd-Controller



Pd-Controller



Pd-Controller

