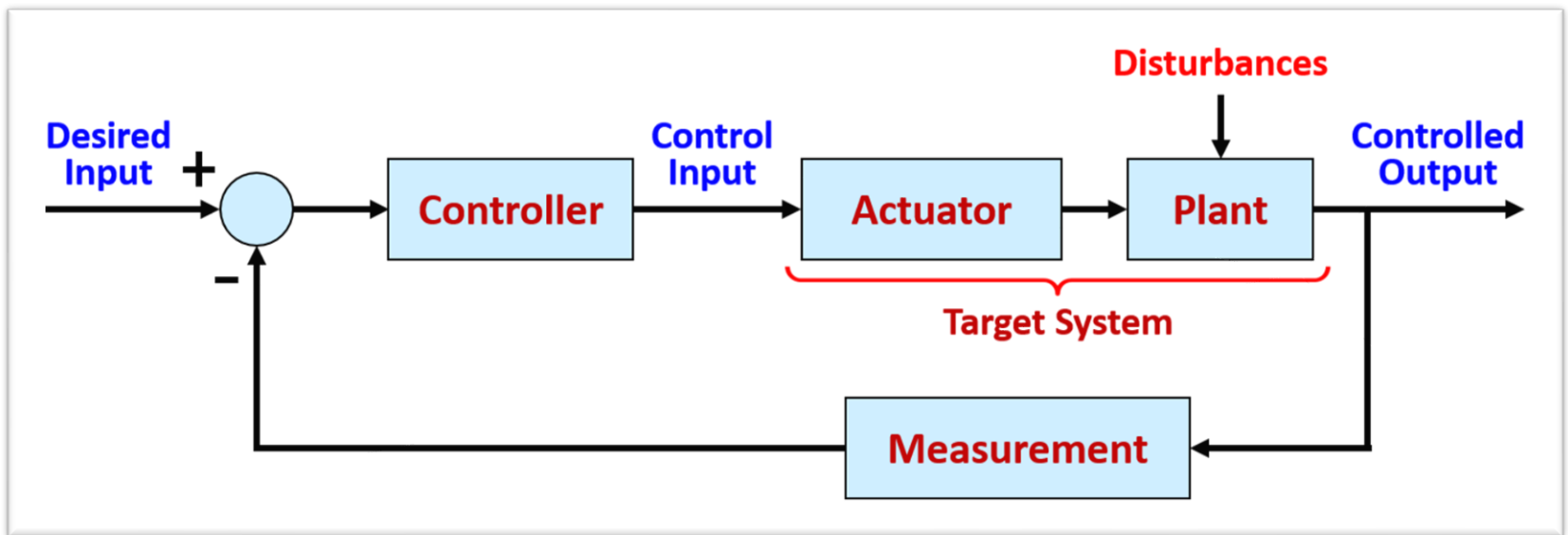


Analysis of Feedback 1

Lecture 6:

- Overview of Feedback & PID Control
- Example of PID Control System

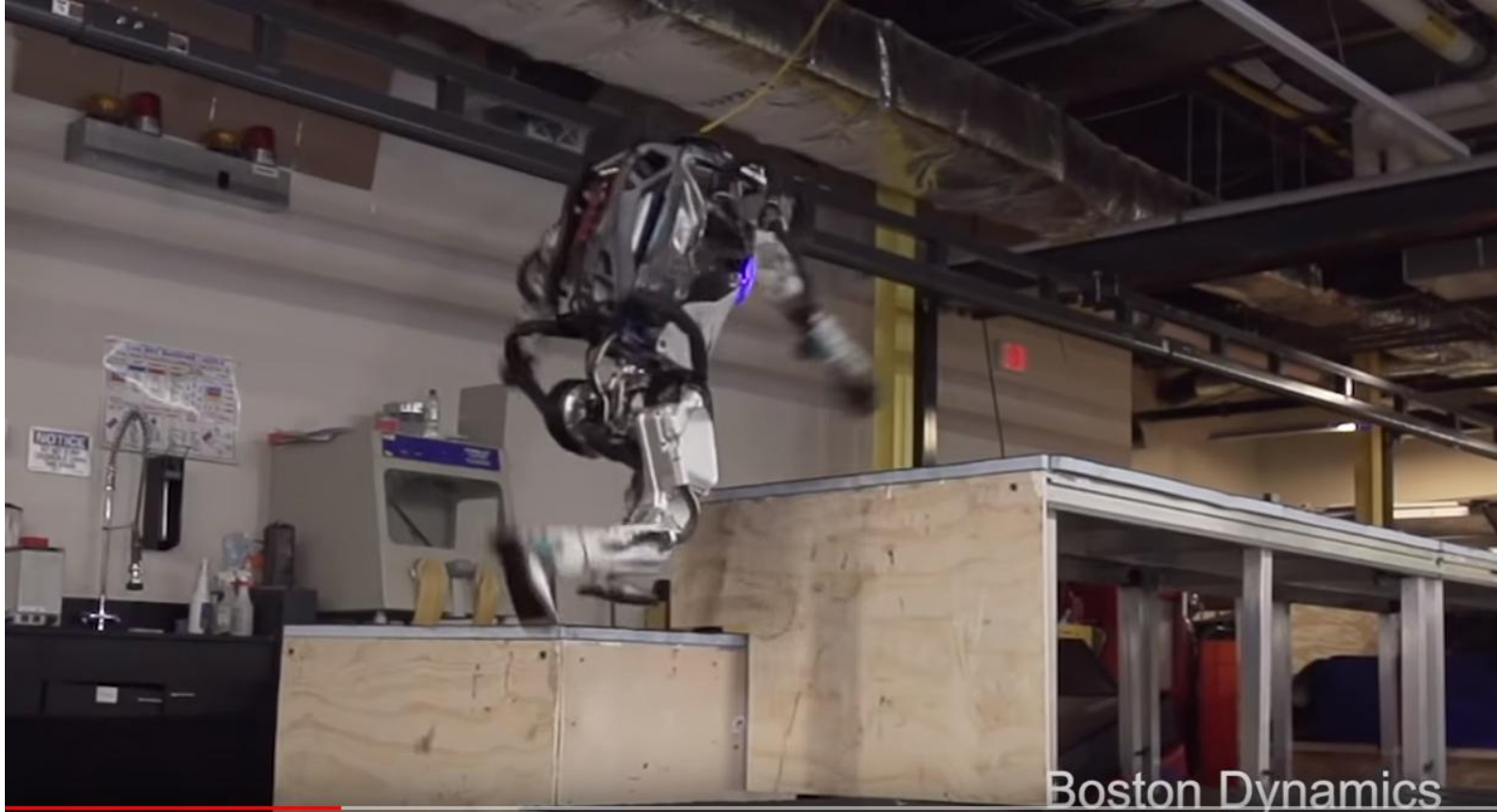


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New Arrived Robots from Boston Dynamics!!

❖ Parkour Atlas



<https://www.youtube.com/watch?v=LikxFZZO2sk>

Newly Arrived Robots from Boston Dynamics!!

❖ SpotMini



<https://www.youtube.com/watch?v=fUyU3IKzoio>

Newly Arrived Robots from Boston Dynamics!!

❖ Robustness Test for Disturbances!!



<https://www.youtube.com/watch?v=aFuA50H9uek>

Basic Equations of Control

❖ Open-Loop System

- The **controlled output** is given by

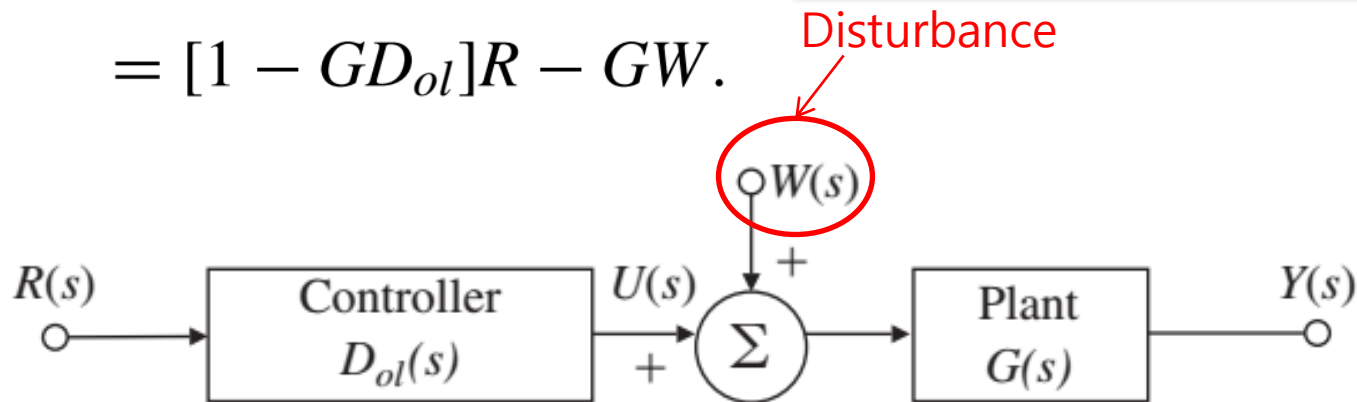
$$Y_{ol} = GD_{ol}R + GW,$$

- **Error**, difference btw **reference input (R)** and **output (Y)** is given by

$$\begin{aligned} E_{ol} &= R - Y_{ol}, \\ &= R - [GD_{ol}R + GW], \\ &= [1 - GD_{ol}]R - GW. \end{aligned}$$

- **Important Questions:**

- How to minimize the error?
(error \rightarrow zero or $R = Y$)



Basic Equations of Control (cont'd)

❖ Closed-Loop System

- The **controlled output** is given by

$$Y_{cl} = \frac{GD_{cl}}{1 + GD_{cl}} R + \frac{G}{1 + GD_{cl}} W - \frac{GD_{cl}}{1 + GD_{cl}} V,$$

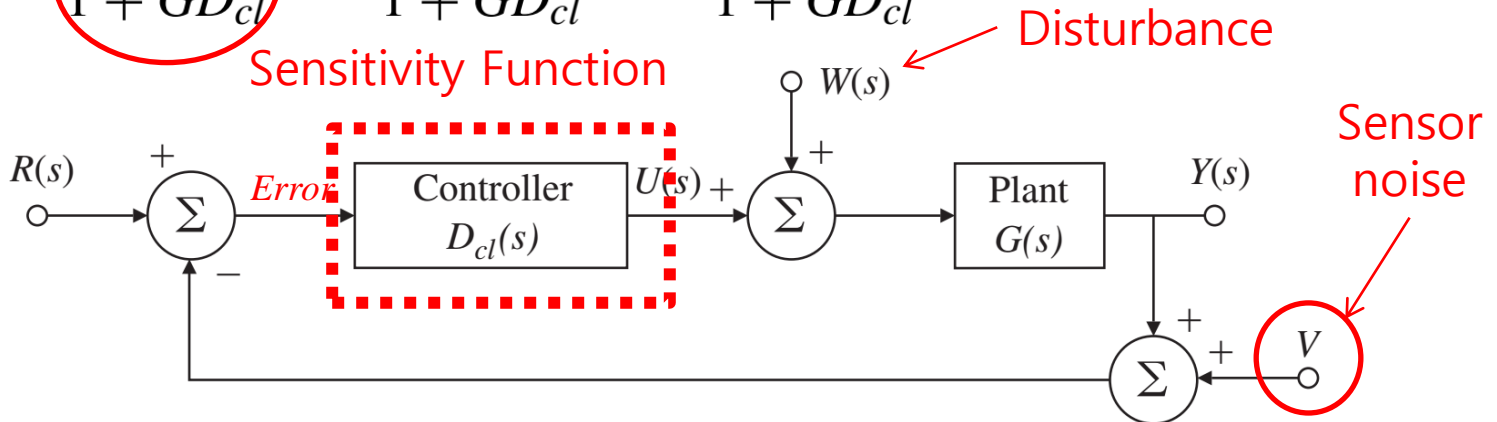
C-L Transfer Function

- Error**, difference btw **reference input (R)** and **output (Y)** is given by

$$E_{cl} = R - \left[\frac{GD_{cl}}{1 + GD_{cl}} R + \frac{G}{1 + GD_{cl}} W - \frac{GD_{cl}}{1 + GD_{cl}} V \right],$$

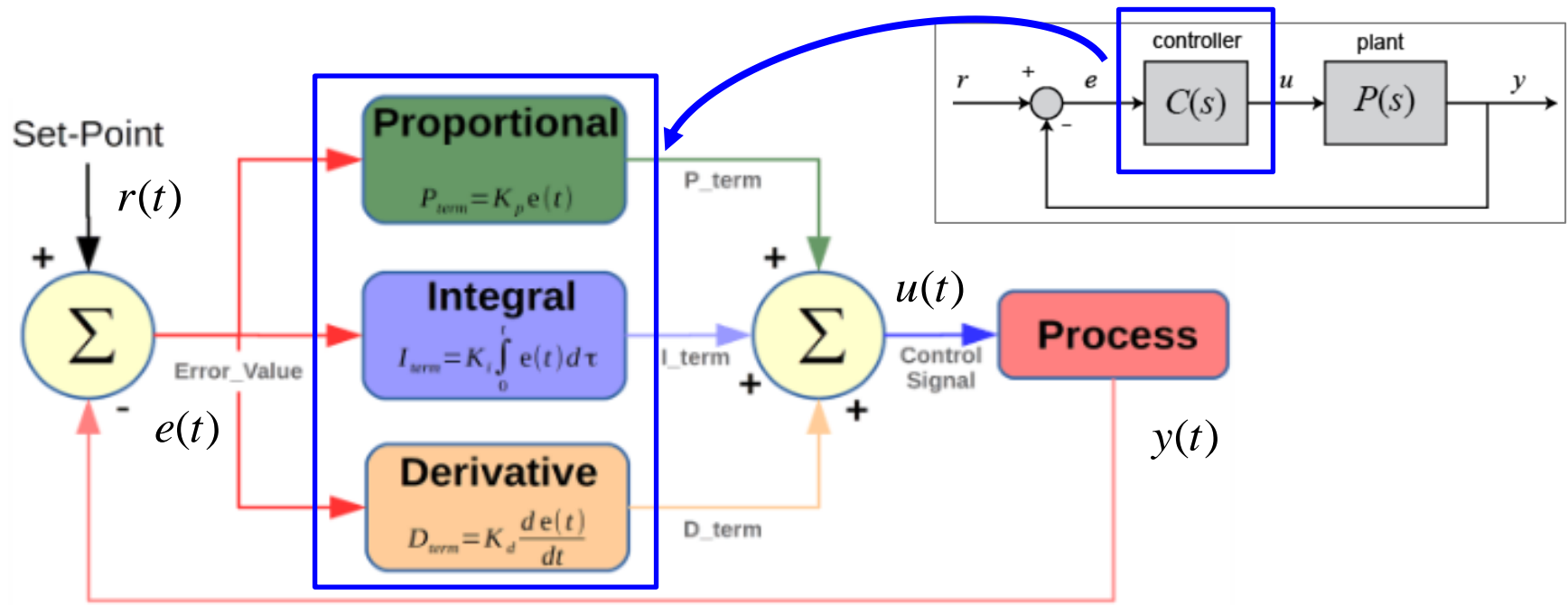
$$= \frac{1}{1 + GD_{cl}} R - \frac{G}{1 + GD_{cl}} W + \frac{GD_{cl}}{1 + GD_{cl}} V.$$

Sensitivity Function



- Important Questions:**
 - How to minimize the error?
(Objectives: error \rightarrow zero)

Three-Term Controller: PID Control



- ❖ The control signal of a **PID controller** in the time-domain

$$u(t) = K_p e(t) + K_i \int e(t) dt + K_d \frac{de(t)}{dt}$$

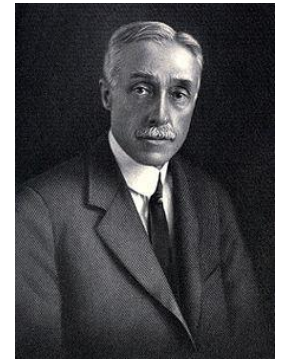
where,

error value, $e(t) = r(t) - y(t)$

Brief History of PID control

❖ The First real PID-type Controlled by Elmer Sperry in 1911.

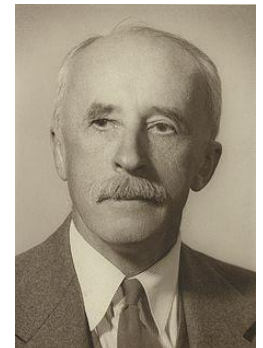
- Gyroscopic compass & stabilizer application



Elmer Ambrose Sperry
(1860~1930)

❖ The first theoretical analysis of a PID controller was published by Nicolas Minorsky in 1922.

- Automatic steering systems for US Navy ships.
- Developed by observation of a helmsman, steering ships based on not only **current error (P-control)** but also, **past error (I)** as well as **the rate of change (D)**



Nicolas Minorsky
(1885~1970)

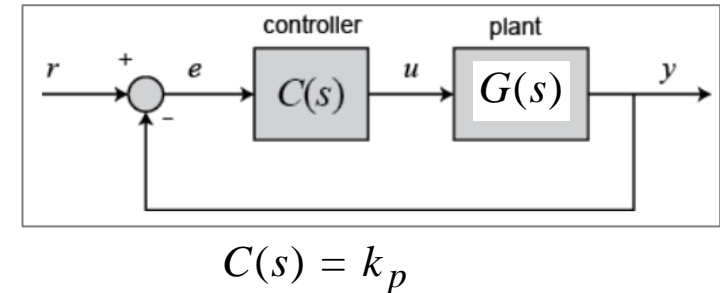
Three-Term Controller: PID Control



❖ Proportional Control (P)

- Linearly proportional to system error

$$u(t) = k_p e(t),$$



- Assuming plant transfer function can be given by

$$G(s) = \frac{A}{s^2 + a_1 s + a_2}. \quad \Rightarrow \quad \frac{Y(s)}{R(s)} = T(s) = \frac{C(s)G(s)}{1 + C(s)G(s)} = \frac{k_p A}{s^2 + a_1 s + a_2 + k_p A}$$

Applying model matching condition (i.e., comparing denominators)

$$s^2 + \underline{a_1 s} + \underline{a_2 + k_p A}$$

Damping term
including
natural frequency

Natural frequency term

$$T(s) = \frac{\omega_n^2}{s^2 + 2\zeta \omega_n s + \omega_n^2}.$$

- Important questions:**
 - ω_n vs. rising time ??

Dynamic Response (Revisited)

(5) Control Performance Index: Step Response (cont'd)

(3) Rise Time

$$y(t) = 1 - \frac{1}{\sqrt{1-\zeta^2}} e^{-\zeta\omega_n t} \sin(\omega_d t + \phi) \quad \text{for } \zeta < 1$$

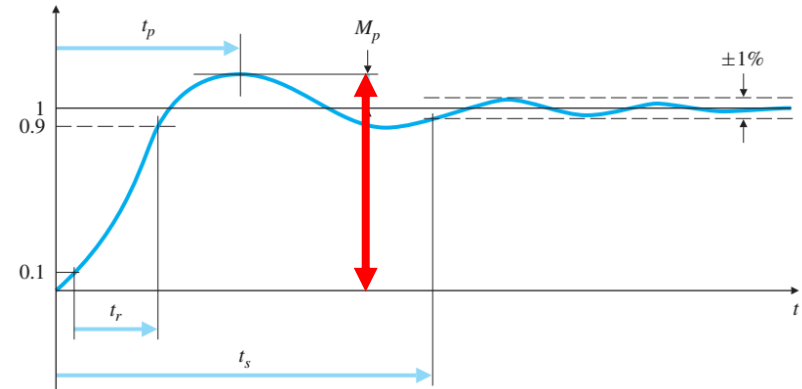
$y(t) = 1$ @ rising time (T_r)

$$\sin(\omega_d T_r + \phi) = 0$$

or

$$\therefore T_r = \frac{\pi - \phi}{\omega_d} \quad \text{where,} \quad \omega_d = \omega_n \sqrt{1 - \zeta^2}$$

$$\cos \phi = \zeta$$



$$i) \zeta = 0.5$$

$$\Rightarrow \phi = \cos^{-1}(0.5) = 1.05$$

$$\therefore T_r = \frac{3.14 - 1.05}{\omega_n \sqrt{1 - 0.5^2}} \approx \frac{2.4}{\omega_n}$$

$$i) \zeta = 0.7$$

$$\Rightarrow \phi = \cos^{-1}(0.7) \approx 0.8$$

$$\therefore T_r = \frac{3.14 - 0.8}{\omega_n \sqrt{1 - 0.7^2}} \approx \frac{3.3}{\omega_n}$$

❖ Discussion & Question:

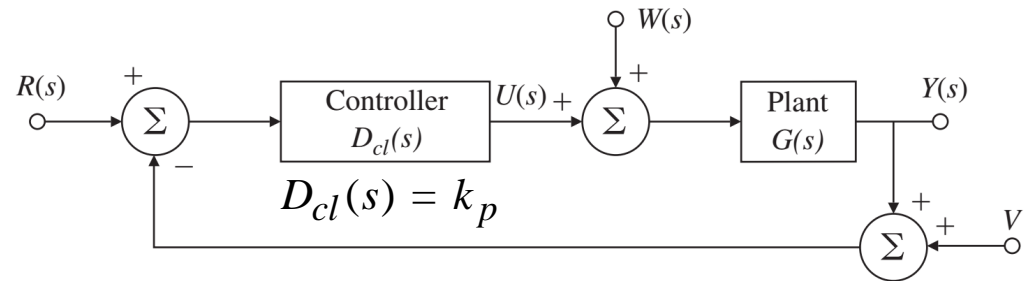
- How does **damping coefficient & natural frequency** work for the rising time ??

Three-Term Controller: PID Control

❖ Proportional Control (P) – cont'd

- Closed-Loop transfer function of P-control

$$\frac{Y(s)}{R(s)} = T(s) = \frac{k_p G(s)}{1 + k_p G(s)}$$

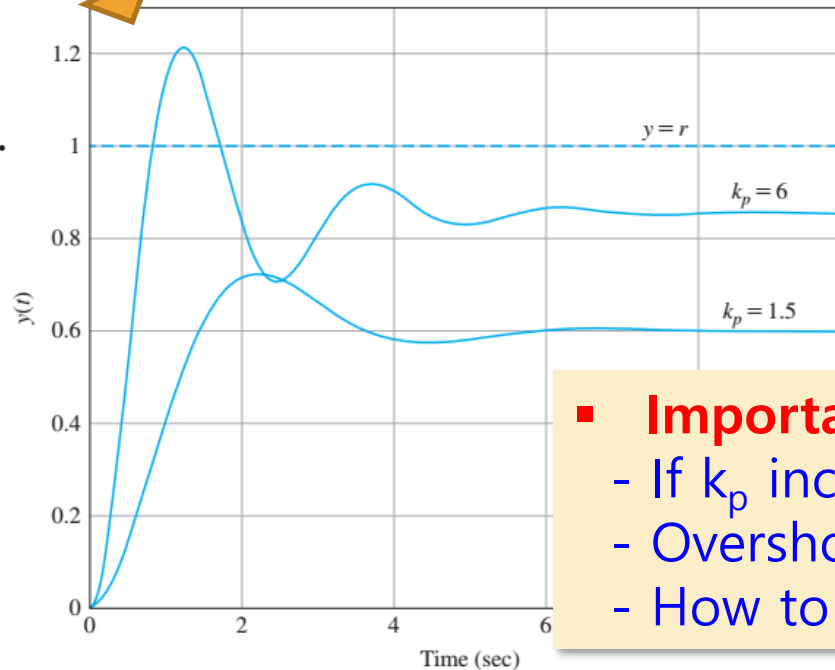


Simulation

$$G(s) = \frac{A}{s^2 + a_1 s + a_2}$$

where,

$$a_1 = 1.4, a_2 = 1, A = 1$$



- **Important questions:**
 - If k_p increases?
 - Overshoot value?
 - How to reject the error?

Three-Term Controller: PID Control

❖ Proportional Control (P) – cont'd

▪ Closed-loop TF

$$\frac{Y(s)}{R(s)} = T(s) = \frac{k_p G(s)}{1 + k_p G(s)}$$

▪ Sensitivity TF



$$\frac{E(s)}{R(s)} = S(s) = \frac{1}{1 + k_p G(s)}$$

- Using **final value theorem** at **$G(0) = 1$** & **Step input $R(s) = 1/s$**

$$\lim_{t \rightarrow \infty} f(t) = \lim_{s \rightarrow 0} sF(s) \quad \text{if all the poles of } sF(s) \text{ are in the left half plane (LHP)}$$

$$y(\infty) = Y(0) = \cancel{s} \frac{k_p G(0)}{1 + k_p G(0)} \frac{1}{\cancel{s}}$$

$$e(\infty) = E(0) = \cancel{s} \frac{1}{1 + k_p G(0)} \frac{1}{\cancel{s}}$$

▪ Important Findings:

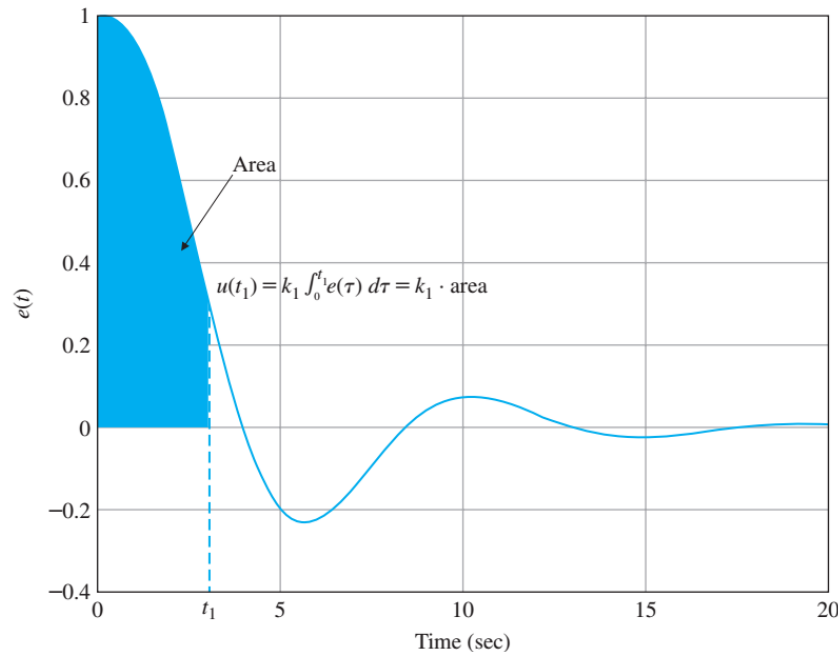
- Proportional control (P) vs. regulation error ??
- Can we have **Zero SSE** with P-control ?? (If not, How??)

Three-Term Controller: PID Control

❖ Integral Control (I)

- Control law of integral feedback is given by,

$$u(t) = k_I \int_{t_0}^t e(\tau) d\tau, \quad \mathcal{L} \Rightarrow \frac{U(s)}{E(s)} = D_{cl}(s) = \frac{k_I}{s},$$



Three-Term Controller: PID Control

❖ Integral Control (I) – cont'd

- Closed-loop TF is given by,

$$\frac{Y(s)}{R(s)} = \mathcal{T}(s) = \frac{\frac{k_I}{s} G(s)}{1 + \frac{k_I}{s} G(s)} = \frac{k_I G(s)}{s + k_I G(s)}.$$

- Sensitivity TF is given by,

$$\frac{E(s)}{R(s)} = \frac{1}{1 + \frac{k_I}{s} G(s)} = \frac{s}{s + k_I G(s)},$$

- Using final value theorem with $G(0) = 1$ & Step input $R(s) = 1/s$

$$y(\infty) = \frac{k_I G(0)}{0 + k_I G(0)} = 1,$$

$$e(\infty) = \frac{0}{0 + k_I G(0)} = 0,$$

From previous slide,

$$y(\infty) = Y(0) = \cancel{s} \frac{k_p G(0)}{1 + k_p G(0)} \frac{1}{\cancel{s}}$$

$$e(\infty) = E(0) = \cancel{s} \frac{1}{1 + k_p G(0)} \frac{1}{\cancel{s}}$$

- Important Findings:
 - Integral control vs. SSE ??

Three-Term Controller: PID Control

❖ Integral Control (I) – cont'd

▪ Example:

$$C(s) = \frac{k_i}{s} \quad G(s) = \frac{b}{s + a}$$

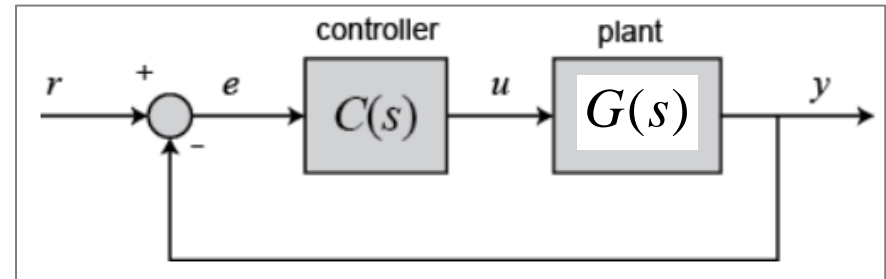
$$T(s)_{CL} = \frac{C(s)G(s)}{1 + C(s)G(s)}$$

$$= \frac{\frac{k_i}{s} \frac{b}{s + a}}{1 + \frac{k_i}{s} \frac{b}{s + a}}$$

$$= \frac{k_i b}{s^2 + as + k_i b}$$

Damping term
including
natural frequency

Natural frequency term



$$T(s) = \frac{\omega_n^2}{s^2 + 2\zeta\omega_n s + \omega_n^2}$$

▪ Important questions:

- ω_n vs. rising time ??
- I-control vs. damping term ??
- I-control vs. rising time ??

Three-Term Controller: PID Control

❖ Derivative Control (D)

- Control law of derivative feedback is given by,

$$u(t) = k_D \dot{e}(t), \quad \xrightarrow{\mathcal{L}} \quad \frac{U(s)}{E(s)} = D_{cl}(s) = k_D s.$$

▪ Important Findings:

- Derivative control is almost never used by itself !!. Why??
 - (1) The derivative does not supply information on the desired end state.
 - (2) if $e(t)$ were to remain constant, the output of a derivative controller would be zero.

☞ Thus, a proportional or integral control would be needed to provide a control signal at this time.

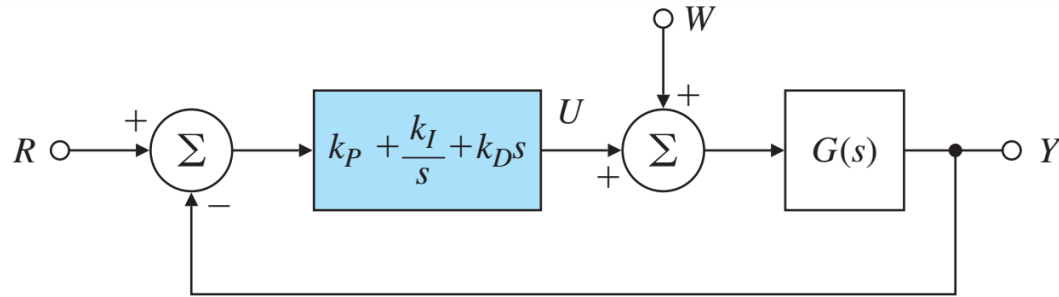
※ An important effect of the derivative term is that it gives a sharp response to suddenly changing signals.

Three-Term Controller: PID Control

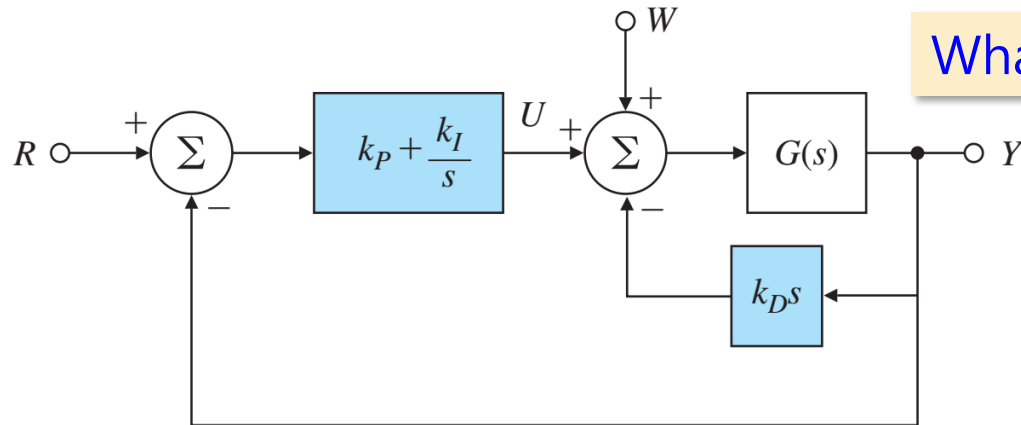
❖ Derivative Control (D) – cont'd

- Two types of derivative control applications – PID vs. PIV

(1) D-term in the forward path – General PID



(2) D-term in the feedback path (or velocity feedback) - PIV

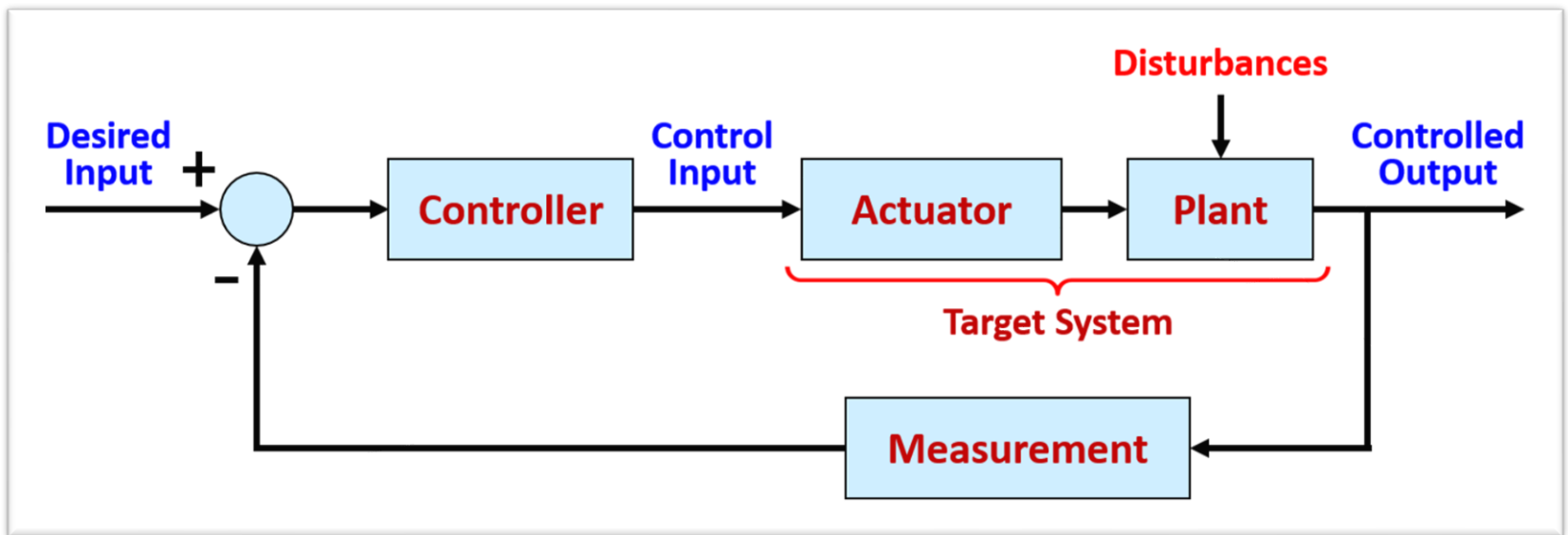


What advantage??

Analysis of Feedback 1

Lecture 6:

- Overview of Feedback & PID Control
- Example of PID Control System

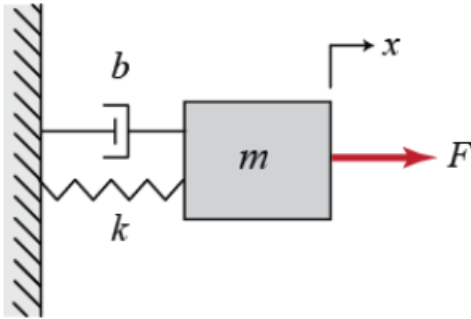


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Three-Term Controller: PID Control

❖ Example 1: Spring-Damper-Mass system



- Step 1 : Equation of Motion (EOM) of this system $m\ddot{x} + b\dot{x} + kx = F$
- Step 2 : Taking Laplace transform of EOM $(ms^2 + bs + k)X(s) = F(s)$
- Step 3 : TF btw the displacement $\{X(s)\}$ and force $\{F(s)\}$

$$\frac{X(s)}{F(s)} = \frac{1}{ms^2 + bs + k}$$

Three-Term Controller: PID Control

❖ Example 1: Spring-Damper-Mass system (cont'd)

- Let suppose each parameter, and get TF

$$m = 1[\text{kg}]$$

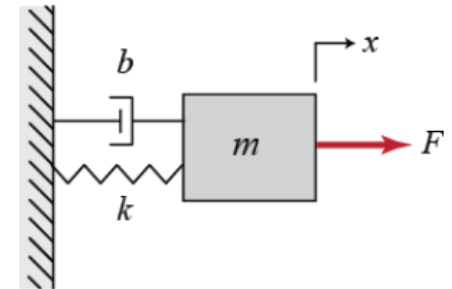
$$b = 10[\text{Ns/m}]$$

$$k = 20[\text{N/m}]$$

$$F = 1[\text{N}]$$



$$\frac{X(s)}{F(s)} = \frac{1}{s^2 + 10s + 20}$$

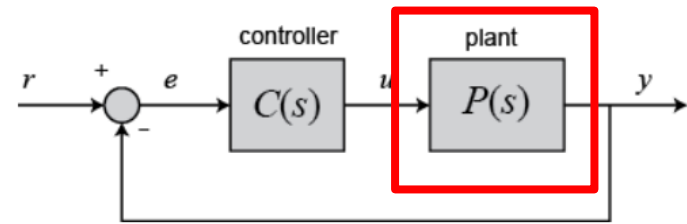


$$G(s) = \frac{1}{s^2 + 2\zeta\omega_n s + \omega_n^2}$$

▪ Objectives: Design PID controller to obtain

1. Rise time < 0.2 sec
2. Settling time < 0.5 sec
3. Maximum overshoot < 5%
4. No steady-state error < 0.01

Three-Term Controller: PID



❖ Example 1: Spring-Damper-Mass system (cont'd)

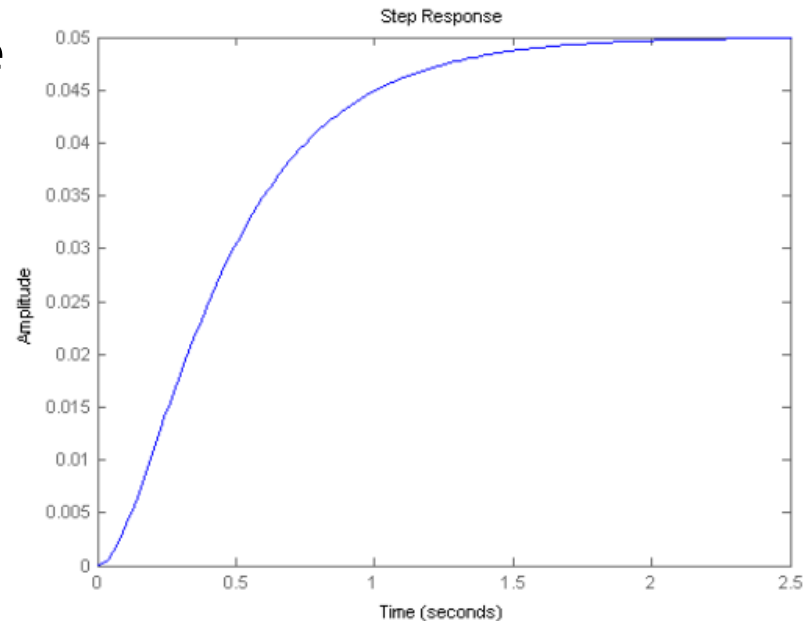
- **Check** : Open-Loop Step Response



```
s = tf('s');  
P = 1/(s^2 + 10*s + 20);  
step(P)
```



$$\frac{X(s)}{F(s)} = \frac{1}{s^2 + 10s + 20}$$



❖ Findings:

- Rise time is ~1.5sec
- Settling time is ~2sec
- Steady-state error is about 0.95



❖ Design PID controller:

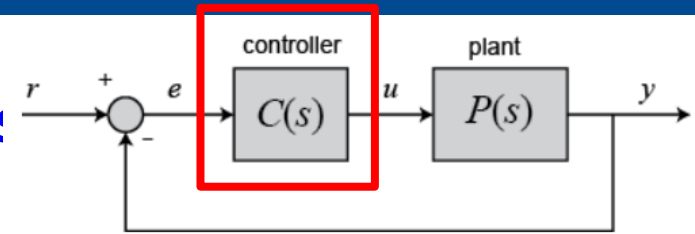
- reduce rise time (<0.2)
- reduce settling time (<0.5)
- eliminate SSE (<0.01)

Three-Term Controller: PID Control

❖ Example 1: Spring-Damper-Mass

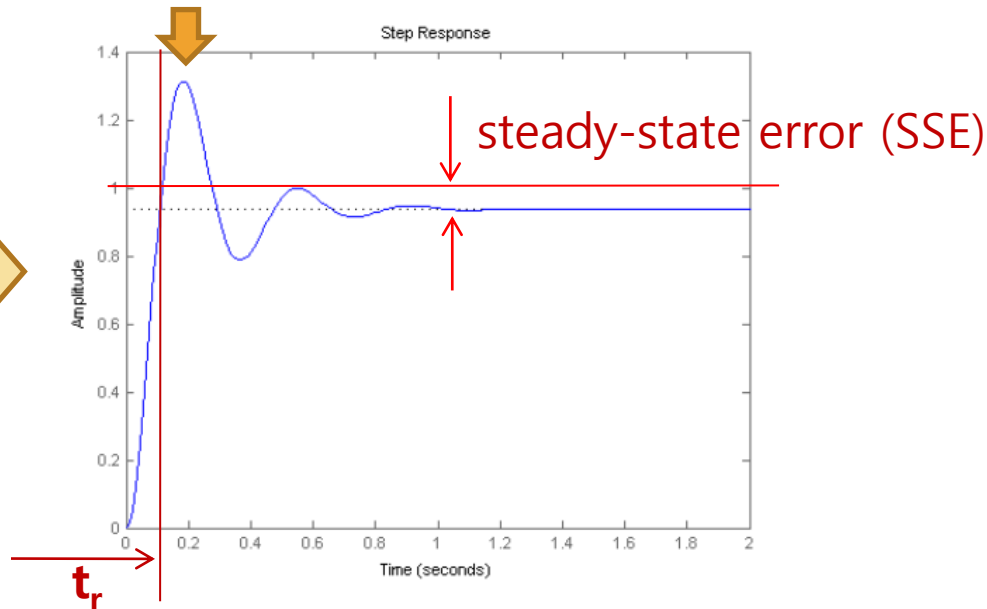
▪ Case I : Proportional (P)

$$C(s) = K_p \quad P(s) = \frac{1}{s^2 + 10s + 20} \quad \Rightarrow \quad \frac{X(s)}{F(s)} = \frac{C(s)P(s)}{1 + C(s)P(s)} = \frac{K_p}{s^2 + 10s + (20 + K_p)}$$



```
Kp = 300;
C = pid(Kp)
T = feedback(C*P,1)

t = 0:0.01:2;
step(T,t)
```



- K_p reduces rise time ($1.5 \rightarrow 0.1\text{sec}$) and SSE ($0.95 \rightarrow 0.05$), but overshoot (30%) !! Then, How to reduce overshoot ??

Three-Term Controller: PID Control

❖ Example 1: Spring-Damper-Mass system (cont'd)

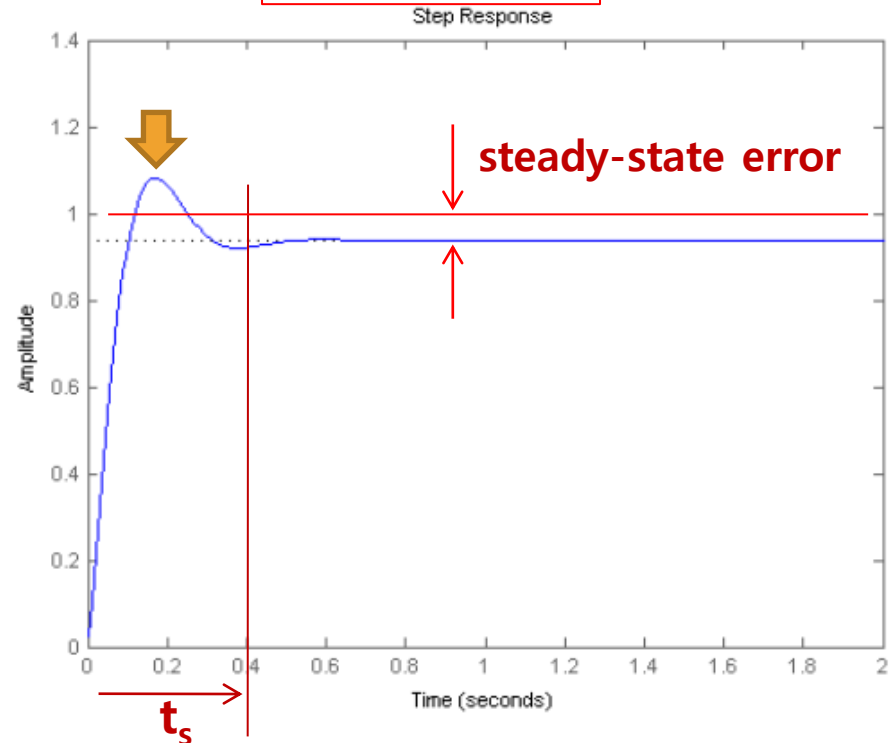
- **Case II : Proportional + Derivative (PD)** $C(s)_{PD} = K_p + K_d s$

$$\left. \frac{X(s)}{F(s)} \right|_{CL} = \frac{K_d s + K_p}{s^2 + (10 + K_d)s + (20 + K_p)}$$

$$G(s)_{CL} = \frac{K_d s + K_p}{s^2 + 2\zeta\omega_n s + \omega_n^2}$$



```
Kp = 300;  
Kd = 10;  
C = pid(Kp,0,Kd)  
T = feedback(C*P,1)  
  
t = 0:0.01:2;  
step(T,t)
```



- PD reduces overshoot (30% → 15%) and settling time (1.0 → 0.4sec) !!
But, there is still the steady-state error (~0.05). How to eliminate SSE ??

Three-Term Controller: PID Control

❖ Example 1: Spring-Damper-Mass system (cont'd)

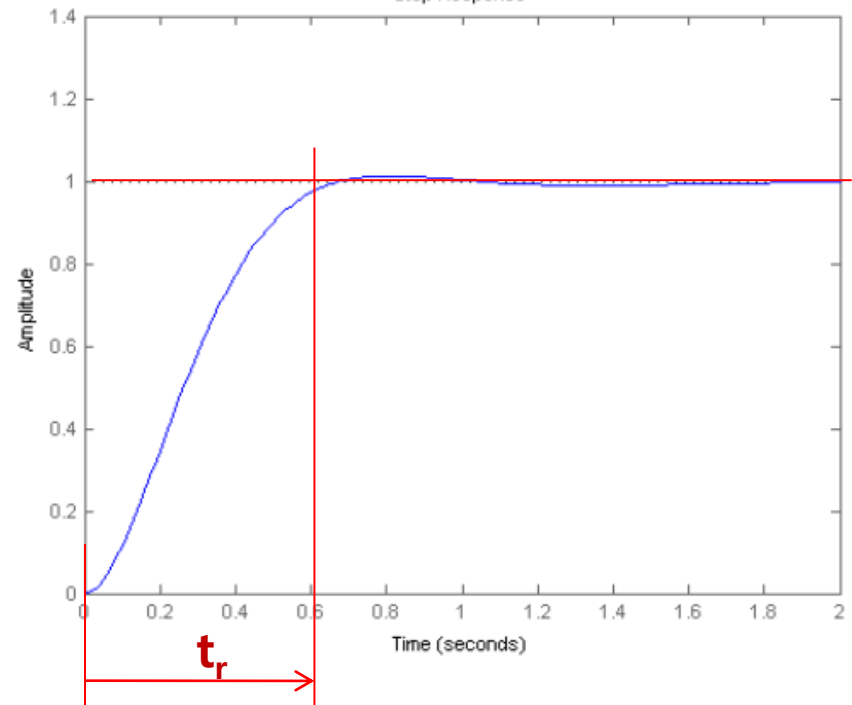
▪ Case III : Proportional + Integral (PI)

$$C(s)_{PI} = K_p + \frac{K_i}{s}$$

$$\left. \frac{X(s)}{F(s)} \right|_{CL} = \frac{K_p s + K_i}{s^3 + 10s^2 + (K_p + 20)s + K_i}$$



```
Kp = 30;  
Ki = 70;  
C = pid(Kp,Ki)  
T = feedback(C*P,1)  
  
t = 0:0.01:2;  
step(T,t)
```



- PI control eliminates the steady-state error (0.05 → almost zero) !!
But, rising time (0.1 → 0.6) & settling time (0.4 → 0.8) becomes longer !!

Three-Term Controller: PID Control

❖ Example 1: Spring-Damper-Mass system (cont'd)

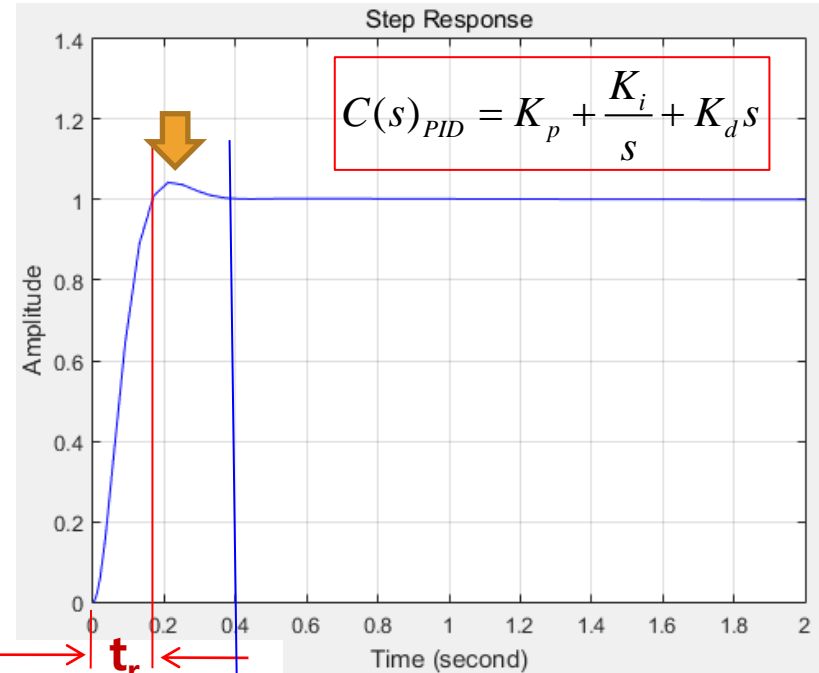
▪ Case IV : Proportional + Integral + Derivative (PID)

$$\left. \frac{X(s)}{F(s)} \right|_{CL} = \frac{K_d s^2 + K_p s + K_i}{s^3 + (10 + K_d)s^2 + (20 + K_p)s + K_i}$$



```
Kp = 350;
Ki = 300;
Kd = 15;
C = pid(Kp,Ki,Kd)
T = feedback(C*P,1);

t = 0:0.01:2;
step(T,t)
```

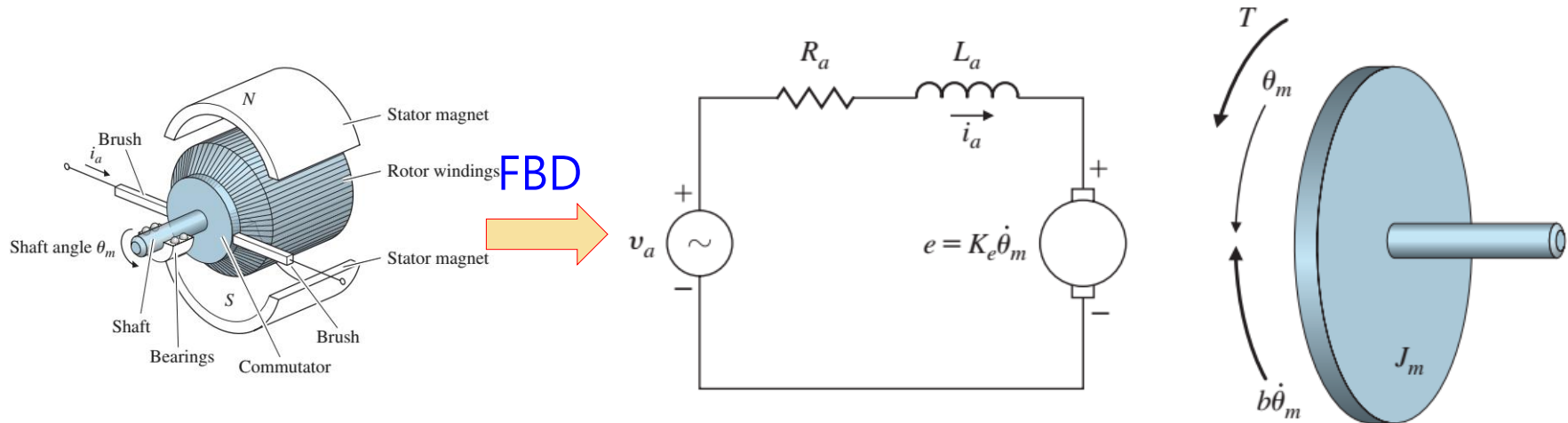


▪ All goals are satisfied !!

1. Fast rise time (t_r) less than 0.2 sec t_s
2. Settling time less than 0.4 sec
3. Maximum overshoot less than 5%
4. No steady-state error almost zero (< 0.001)

Three-Term Controller: PID Control

❖ Example 2: DC Motor – Speed Control



■ Part I: Mechanical motion

$$J_m \ddot{\theta}_m + b \dot{\theta}_m = K_t i_a.$$



$$\frac{\theta_m(s)}{I_a(s)} = \frac{K_t}{J_m s^2 + b s}$$

■ Part II: Electric circuit equation

$$L_a \frac{di_a}{dt} + R_a i_a = v_a - K_e \dot{\theta}_m.$$



$$(L_a s + R_a) I_a(s) = V_a(s) - (K_e s \theta_m)(s)$$

Three-Term Controller: PID Control

❖ Example 2: DC Motor – Speed Control (cont'd)

$$(L_a s + R_a)I_a(s) = V_a(s) - (K_e s \theta_m)(s) \qquad I_a(s) = \frac{J_m s^2 + b s}{K_t} \theta(s)$$

 Arranging

$$\frac{\Theta_m(s)}{V_a(s)} = \frac{K_t}{s[(J_m s + b)(L_a s + R_a) + K_t K_e]}.$$

But, practically $L_a \ll J_m$ or R_a , Thus it is negligible !!

 Re-arranging

$$\begin{aligned} \frac{\Theta_m(s)}{V_a(s)} &= \frac{\frac{K_t}{R_a}}{J_m s^2 + \left(b + \frac{K_t K_e}{R_a}\right) s} \\ &= \frac{K}{s(\tau s + 1)}, \end{aligned}$$

Where,

$$\begin{aligned} K &= \frac{K_t}{b R_a + K_t K_e}, \\ \tau &= \frac{R_a J_m}{b R_a + K_t K_e}. \end{aligned}$$

$$\frac{\Omega(s)}{V_a(s)} = s \frac{\Theta_m(s)}{V_a(s)} = \frac{K}{\tau s + 1}.$$

Velocity Model

Three-Term Controller: PID Control

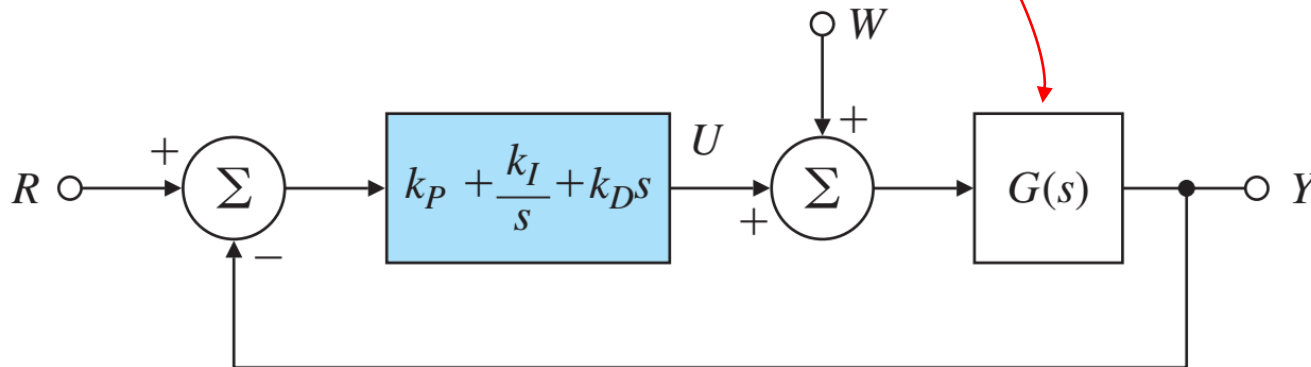
❖ Example 2: DC Motor – Speed Control (cont'd)

- **Transfer function** of DC motor speed control (output)

$$\frac{\Omega(s)}{V_a(s)} = s \frac{\Theta_m(s)}{V_a(s)} = \frac{K}{\tau s + 1}, \quad K = \frac{K_t}{bR_a + K_t K_e}, \quad \tau = \frac{R_a J_m}{bR_a + K_t K_e}.$$

$J_m = 1.13 \times 10^{-2}$ N·m·sec ² /rad,	$b = 0.028$ N·m·sec/rad,	$L_a = 10^{-1}$ H,
$R_a = 0.45 \Omega$,	$K_t = 0.067$ N·m/amp,	$K_e = 0.067$ V·sec/rad.

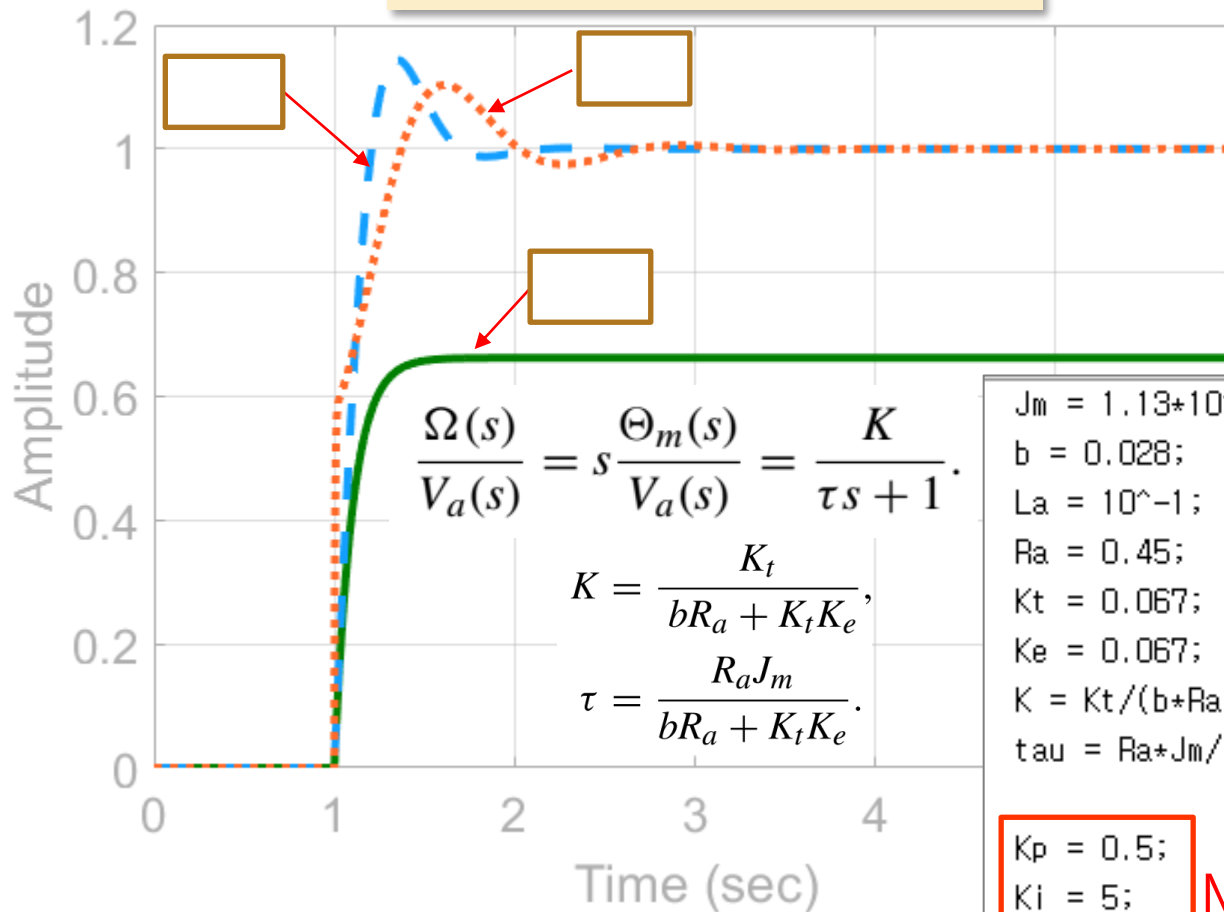
- **Block diagram of closed-loop with PID controller**



Three-Term Controller: PID Control

❖ Example 2: DC Motor – Speed Control (cont'd)

P vs PI vs PID ??



```
Jm = 1.13*10^-2; % Nm.sec^2/rad  
b = 0.028; % Nm.sec/rad  
La = 10^-1; % H  
Ra = 0.45; % ohm  
Kt = 0.067; % Nm/A  
Ke = 0.067; % V.sec/rad  
K = Kt/(b*Ra + Kt*Ke);  
tau = Ra*Jm/(b*Ra + Kt*Ke);
```

```
Kp = 0.5;  
Ki = 5;  
Kd = 0.1;
```

Manually tuned !!

PID Controller on Discrete Time

❖ Implementation

- The analysis for designing a **digital implementation** of a PID controller in a **microcontroller (MCU)** or **FPGA device** requires the standard form of the PID controller to be **discretized**.
- **The integral term** is discretized, with a sampling time Δt , as follows,

$$\int_0^{t_k} e(t) dt = \sum_{k=1}^n e(t_k) \Delta t$$

- **The derivative term** is approximated as,

$$\frac{de(t)}{dt} = \frac{e(t_k) - e(t_{k-1})}{\Delta t}$$

It is called **“backward finite difference”**
(It is the nature of the **feedback**)



• **FPGA:**
Field
Programmable
Gate
Array

https://en.wikipedia.org/wiki/Field-programmable_gate_array

PID Controller on Discrete Time (cont'd)

❖ Implementation (cont'd)

- Thus, a PID algorithm for implementation of the **discretized PID controller in a MCU** is obtained by differentiating $y(t)$, using the numerical definitions of the first and second derivative and solving for $y(t_k)$ and finally obtaining:

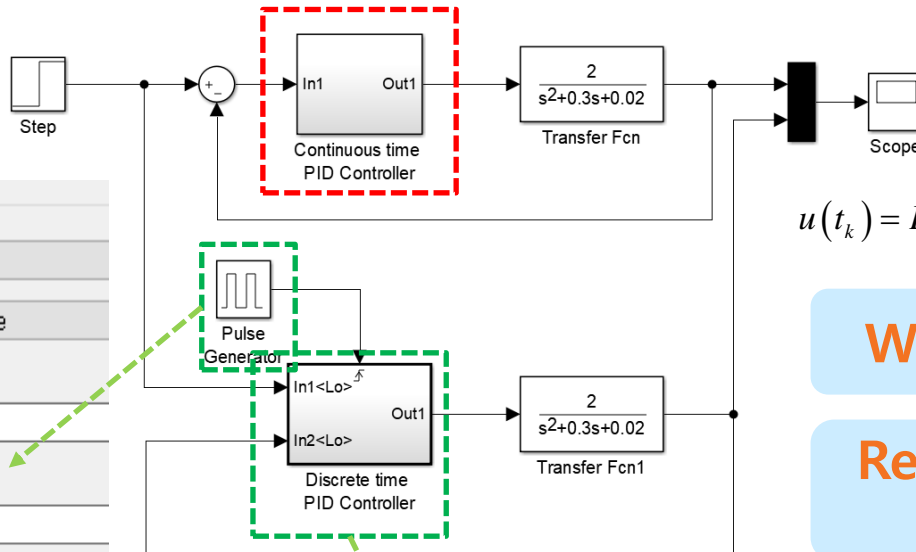
$$u(t) = K_p e(t) + K_i \int e(t) dt + K_d \frac{de(t)}{dt}$$



$$u(t_k) = K_p e(t_k) + K_i \sum_{k=1}^n e(t_k) \Delta t + K_d \frac{e(t_k) - e(t_{k-1})}{\Delta t}$$

PID Controller on Discrete Time (cont'd)

❖ Example: Implementation with C-code



$$u(t_k) = K_p e(t_k) + K_i \sum_{k=1}^n e(t_k) \Delta t + K_d \frac{e(t_k) - e(t_{k-1})}{\Delta t}$$

What is a S-Function?

Require an installation of MEX-compiler.

Parameters

Pulse type: Time based

Time (t): Use simulation time

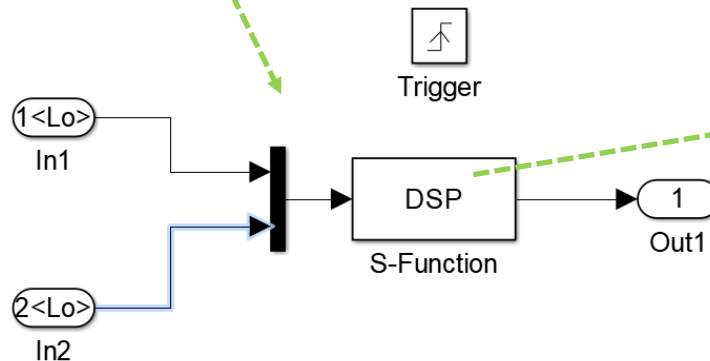
Amplitude: 1

Period (secs): 100e-6

Pulse Width (% of period): 50

Phase delay (secs): 0

☒ Interpret vector parameters as 1-D



```

1 % S-Function for a discrete-time PID controller
2 % Inputs: In1 (error), In2 (reference)
3 % Output: Out1 (control signal)
4 % Parameters: Kp, Ki, Kd, Ts
5 %
6 % This function implements the discrete-time PID control law:
7 % u(t_k) = Kp * e(t_k) + Ki * sum(e(t_k) * Ts) + Kd * (e(t_k) - e(t_{k-1})) / Ts
8 %
9 % The function is called from the MATLAB/Simulink environment.
10 %
11 % The function returns the control signal Out1.
12 %
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94 %
95 % The function returns the control signal Out1.
96 %
97 % The function is called from the MATLAB/Simulink environment.
98 %
99 % The function returns the control signal Out1.
100 %

```


PID Controller on Discrete Time (cont'd)

❖ PID pseudo code for the discrete-time,

$$u(t_k) = K_p e(t_k) + K_i \sum_{k=1}^n e(t_k) \Delta t + K_d \frac{e(t_k) - e(t_{k-1})}{\Delta t}$$

```
error_prior = 0
integral = 0
Kp = Some value you need to come up (see tuning section below)
Ki = Some value you need to come up (see tuning section below)
KD = Some value you need to come up (see tuning section below)

while(1){
    error = desired_value - actual_value
    integral = integral + (error*iteration_time)
    derivative = (error - error_prior)/iteration_time
    output = Kp*error + Ki*integral + KD*derivative + bias
    error_prior = error
    sleep(iteration_time)
}
```

PID Controller on Discrete Time (cont'd)

❖ PID C++ code for the discrete-time: PID + Saturation

```
double PIDImpl::calculate( double setpoint, double pv )
{
    // Calculate error
    double error = setpoint - (pv;

    // Proportional term
    double Pout = _Kp * error;

    // Integral term
    _integral += error * _dt;
    double Iout = _Ki * _integral;

    // Derivative term
    double derivative = (error - _pre_error) / _dt;
    double Dout = _Kd * derivative;

    // Calculate total output
    double output = Pout + Iout + Dout;

    // Restrict to max/min
    if( output > _max )
        output = _max;
    else if( output < _min )
        output = _min;

    // Save error to previous error
    _pre_error = error;

    return output;
}
```

Measured output (or filtered output)

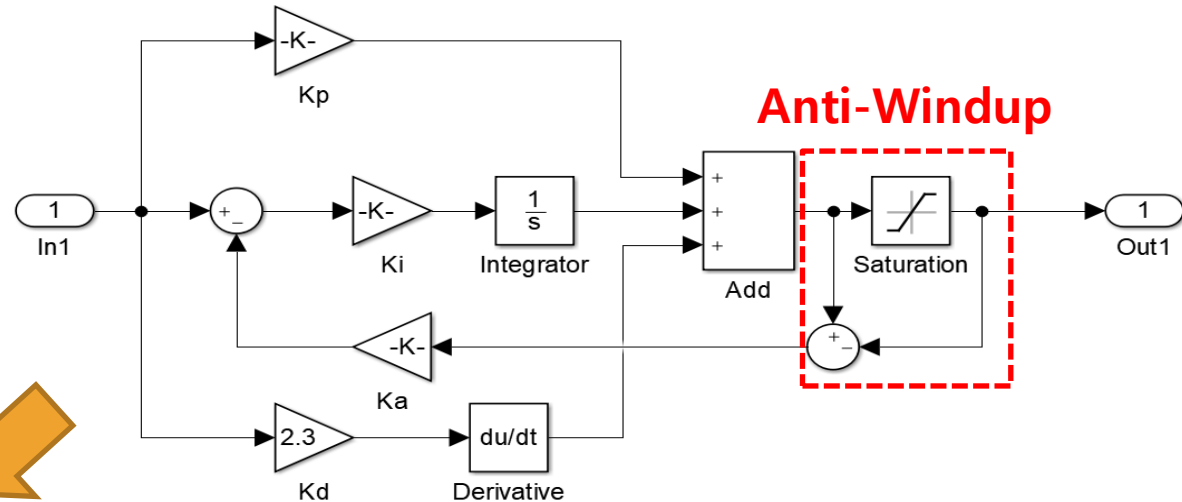
Saturation (Restriction)

<https://gist.github.com/bradley219/5373998>

PID Controller on Discrete Time (cont'd)

❖ Example: PID with Anti-Windup in C-code (cont'd)

■ With Anti-Windup



■ C-language code

```
#define TS      100e-6
#define Out_MAX 10.0

double err;
double err_old;
double out;
double kp;
double ki;
double kd;
double integ;
double ref;
double feed;
double ka;
double out_sat;
```



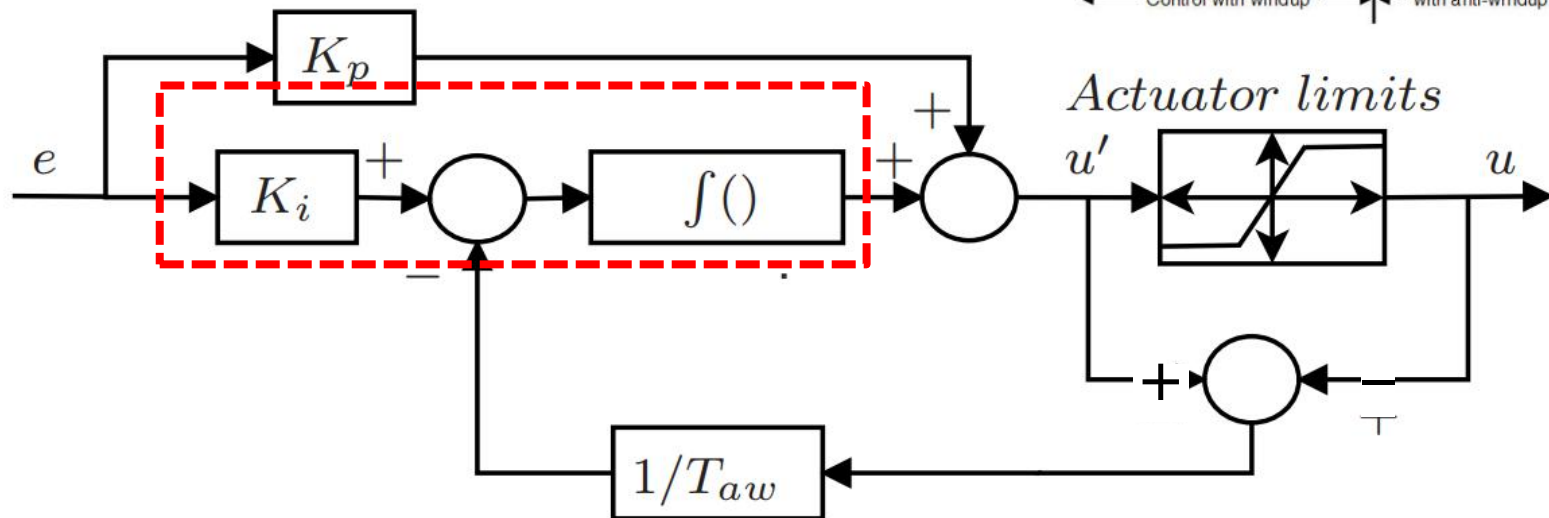
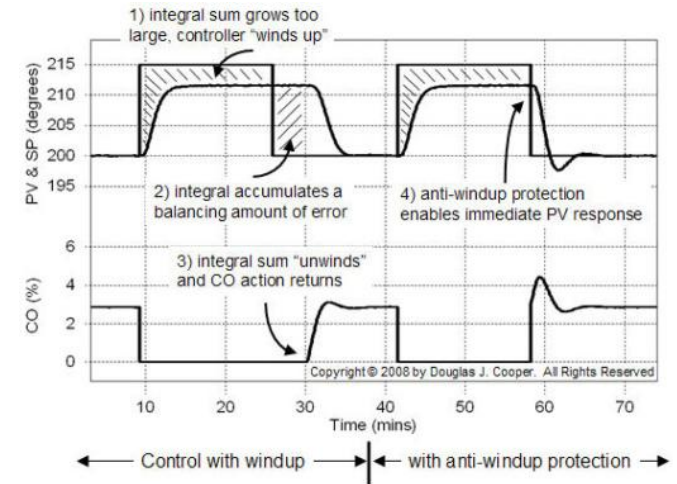
```
err = 0.0;
kp = 10.01;
ki = 11.12 * TS;
kd = 2.3 / TS;
ka = 1/(6*kp);

err = ref - feed;
integ += err - (ka*(out-out_sat));
out = (kp*err) + (ki*integ) + (kd*(err-err_old));
out_sat = (out > Out_MAX) ? Out_MAX : (out < -Out_MAX) ? -Out_MAX : out;
err_old = err;
```

PID Controller on Discrete Time (cont'd)

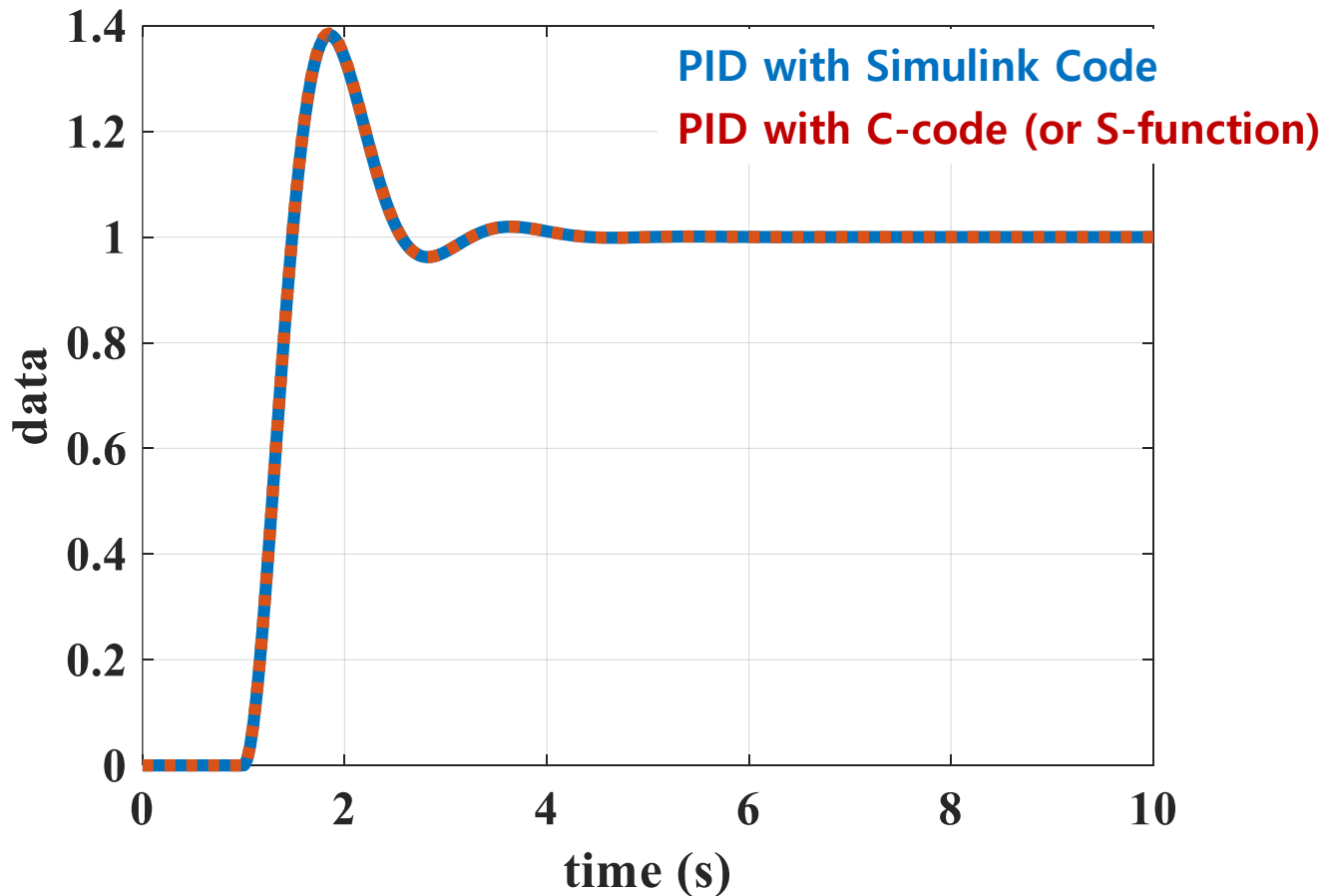
❖ Example: Implementation with C-code (cont'd)

■ Anti-Windup for the Integral Control



PID Controller on Discrete Time (cont'd)

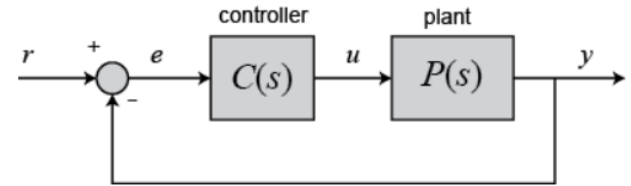
❖ Example: Implementation with C-code (cont'd)



Summary: PID Controller

❖ Summary of PID

$$u(t) = \underline{K_p e(t)} + \underline{K_i \int e(t) dt} + \underline{K_d \frac{de(t)}{dt}}$$



■ Proportional (P)

- **reduce the rise time** and reduce the steady-state error (SSE)
- but, **never eliminate the SSE**
(e.g., certain amount of error will be actuated by input constraints)

■ Integral (I)

- **eliminate the SSE** for a constant or step input,
(by accumulating error between $r(t)$ and $y(t)$)
- but, **worse transient response**(settling time or overshoot)

■ Derivative (D)

- Improve the transient response (**settling time**), **reduce the overshoot**
- but, **amplify higher frequency measurement (sensor) or process noise**

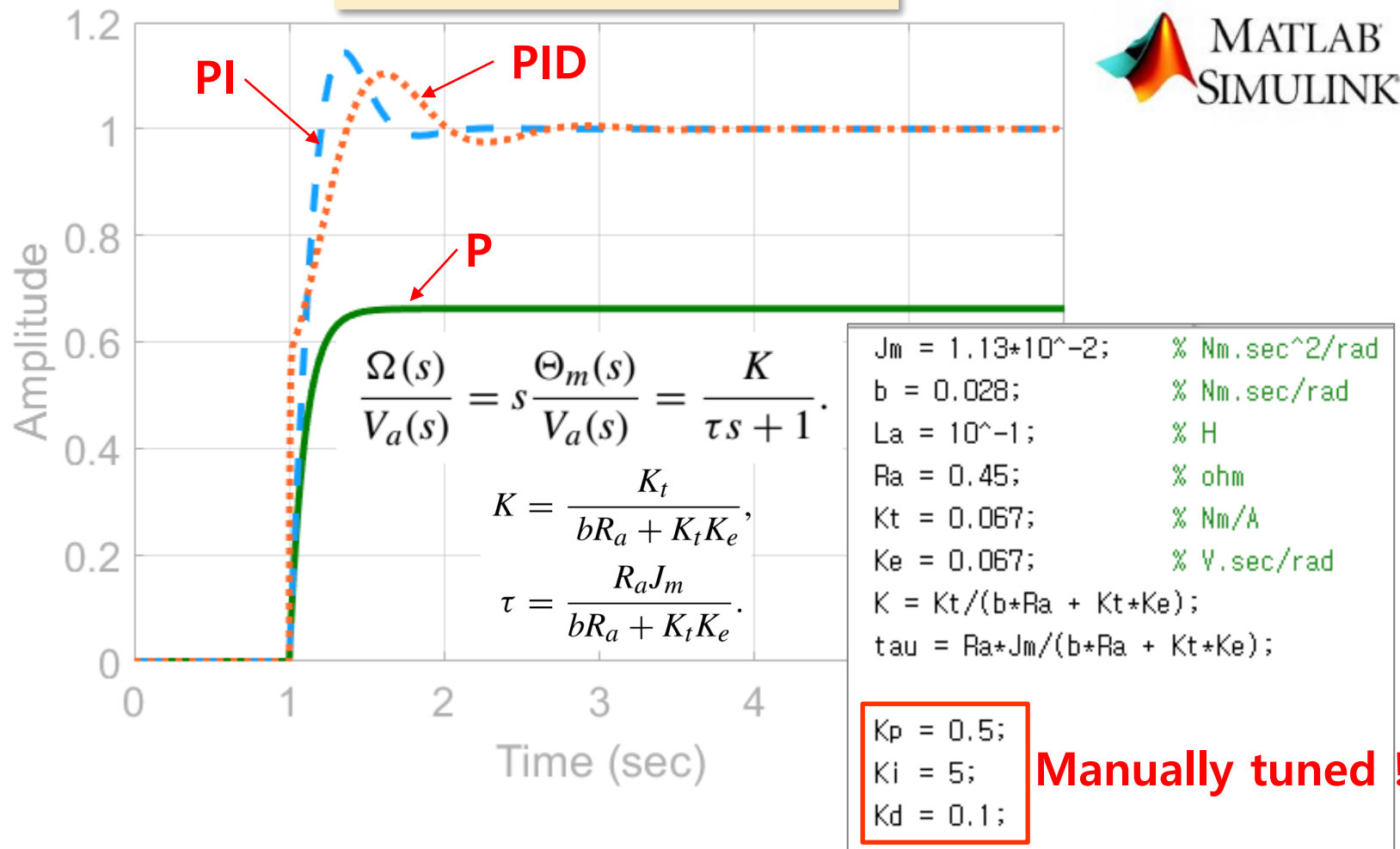
Limitations of PID & Modifications

- **PID is Feedback !! 📌 Thus, response is reactive!!**
 - ✓ **Feed-forward control** with the knowledge about the process model will be able to increase responding performance !!
- **PID has constant parameters (or gains) !!**
 - 📌 Thus, if system variations exist, performance gets worse !!
 - ✓ **Changing the control parameters (i.e., gains)** based on the process variations (e.g., gain scheduling and adaptive control)
- **PID control is no direct knowledge of the process !!**
 - ✓ **Identify the process model** and optimize controller gain (e.g., by using Matlab tool(e.g., PID tuner), auto-tuning method, model matching condition and etc)
- **Integral wind-up & High-frequency noise amplification on Derivative !!**
 - (1) **Anti-windup schemes** (e.g., temporally stopping integral action)
 - (2) **Low-pass-filter !!** but, slow response is following.

Three-Term Controller: PID Control (**Again**)

❖ Example 2: DC Motor – Speed Control (cont'd)

P vs PI vs PID ??



Summary

❖ Summary:

- Transfer function of open- & closed-loop system.
- PID control design and how it works.
- PID Control with C-code.
- Limitation and modification of PID.