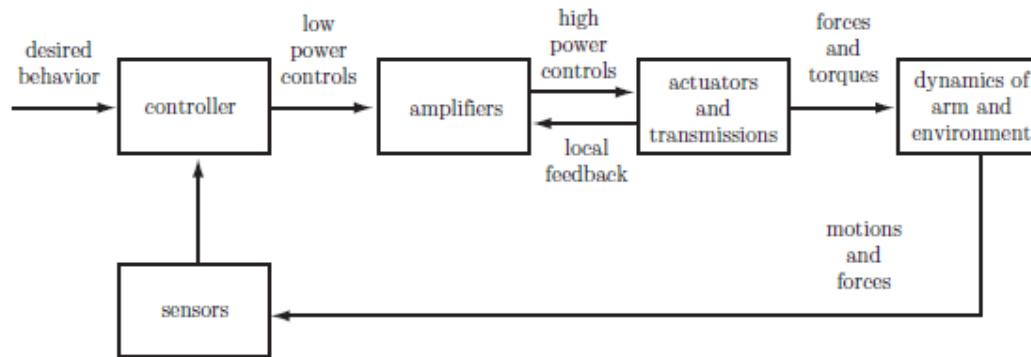


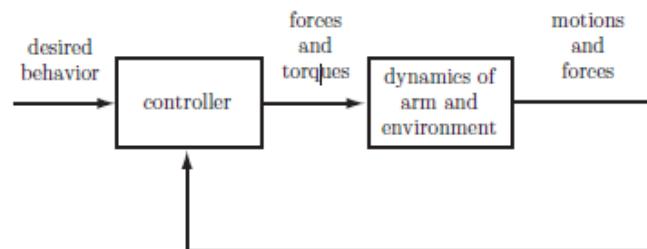
Robot Control

Overview

- Typical control system
 - Types: motion control / force control
 - Actual block diagram



- Simplified block diagram



Error Dynamics

- Joint error

$$\theta_e(t) = \theta_d(t) - \theta(t) \quad \text{desired joint position is } \theta_d(t) \quad \text{actual joint position is } \theta(t)$$

- Error Dynamics

– Differential equations for the joint error (ex) $\ddot{\theta}_e(t) + \frac{b}{m}\dot{\theta}_e(t) + \frac{k}{m}\theta_e(t) = 0$

- Error Response

$\theta_e(t), t > 0$ for the initial conditions

$$\theta_e(0) = 1 \quad \dot{\theta}_e(0) = \ddot{\theta}_e(0) = \dots = 0$$

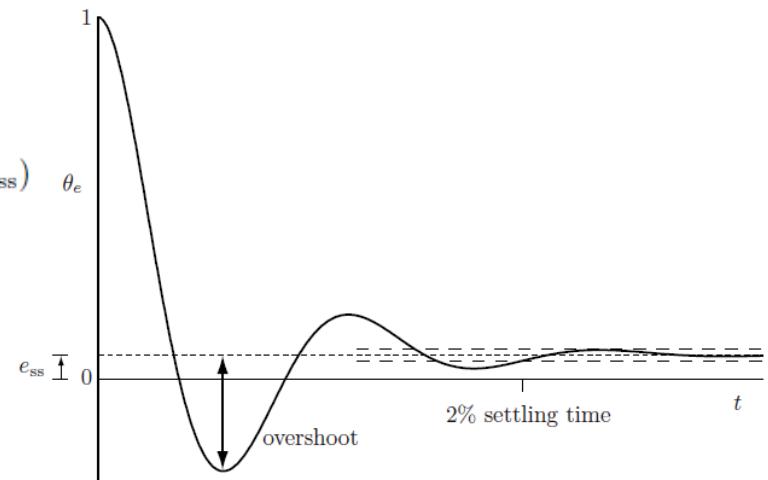
1) Steady state error e_{ss}
asymptotic error as $t \rightarrow \infty$

2) (2%) Settling time

the first time T such that $|\theta_e(t) - e_{ss}| \leq 0.02(\theta_e(0) - e_{ss})$
for all $t \geq T$

3) Overshoot

$$\text{overshoot} = \left| \frac{\theta_{e,\min} - e_{ss}}{\theta_e(0) - e_{ss}} \right| \times 100\%,$$



Error Dynamics

- Linear error dynamics
 - Linear ordinary differential equations

$$a_p \theta_e^{(p)} + a_{p-1} \theta_e^{(p-1)} + \cdots + a_2 \ddot{\theta}_e + a_1 \dot{\theta}_e + a_0 \theta_e = c.$$

$c = 0$: homogeneous
 $c \neq 0$: nonhomogeneous

$$\begin{aligned}\theta_e^{(p)} &= -\frac{1}{a_p}(a_{p-1} \theta_e^{(p-1)} + \cdots + a_2 \ddot{\theta}_e + a_1 \dot{\theta}_e + a_0 \theta_e) \\ &= -a'_{p-1} \theta_e^{(p-1)} - \cdots - a'_2 \ddot{\theta}_e - a'_1 \dot{\theta}_e - a'_0 \theta_e.\end{aligned}$$

- Matrix form
 - State vector $\mathbf{x} = (x_1, \dots, x_p)$

$$x_1 = \theta_e,$$

$$x_2 = \dot{x}_1 = \dot{\theta}_e,$$

$$\vdots \quad \vdots$$

$$x_p = \dot{x}_{p-1} = \theta_e^{(p-1)}$$

$$\dot{x}_p = -a'_0 x_1 - a'_1 x_2 - \cdots - a'_{p-1} x_p.$$

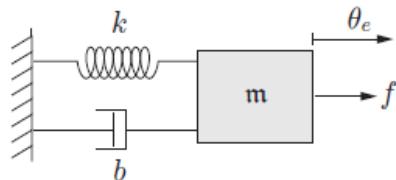
- State equation

$$\dot{\mathbf{x}}(t) = A\mathbf{x}(t)$$

$$A = \begin{bmatrix} 0 & 1 & 0 & \cdots & 0 & 0 \\ 0 & 0 & 1 & \cdots & 0 & 0 \\ \vdots & \vdots & \vdots & \ddots & \vdots & \vdots \\ 0 & 0 & 0 & \cdots & 1 & 0 \\ 0 & 0 & 0 & \cdots & 0 & 1 \\ -a'_0 & -a'_1 & -a'_2 & \cdots & -a'_{p-2} & -a'_{p-1} \end{bmatrix}$$

Error Dynamics

- mass-spring-damper system



$$m\ddot{\theta}_e + b\dot{\theta}_e + k\theta_e = f$$

- First-order error dynamics ($m=0, f=0$)

$$\dot{\theta}_e(t) + \frac{k}{b}\theta_e(t) = 0$$

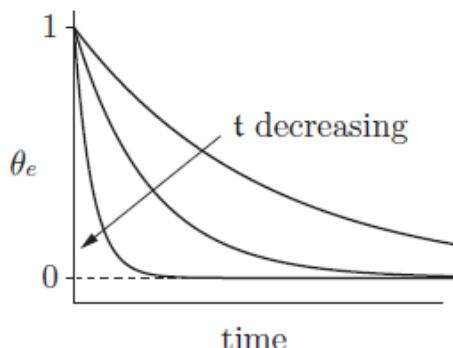


$$\dot{\theta}_e(t) + \frac{1}{t}\theta_e(t) = 0$$

$$\theta_e(t) = e^{-t/t} \theta_e(0)$$

t: time constant

decayed to 37% of initial value



✓ 2% settling time $\approx 4 t$

$$\frac{\theta_e(t)}{\theta_e(0)} = 0.02 = e^{-t/t}$$

$$\ln 0.02 = -t/t \rightarrow t = 3.91t,$$

Error Dynamics

- Second-order error dynamics ($f=0$)

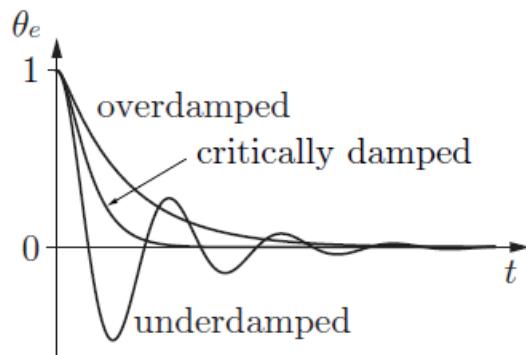
$$\ddot{\theta}_e(t) + \frac{b}{m}\dot{\theta}_e(t) + \frac{k}{m}\theta_e(t) = 0 \quad \omega_n = \sqrt{k/m}, \zeta = b/2\sqrt{km}$$

→ $\ddot{\theta}_e(t) + 2\zeta\omega_n\dot{\theta}_e(t) + \omega_n^2\theta_e(t) = 0$, ω_n : natural frequency, ζ : damping ratio

→ $s^2 + 2\zeta\omega_n s + \omega_n^2 = 0$ (characteristic equation)

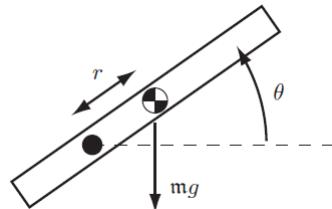
$$s_1 = -\zeta\omega_n + \omega_n\sqrt{\zeta^2 - 1} \quad \text{and} \quad s_2 = -\zeta\omega_n - \omega_n\sqrt{\zeta^2 - 1}. \quad \Rightarrow \text{Stable condition: } \zeta\omega_n > 0$$

- Overdamped ($\zeta > 1$) $\theta_e(t) = c_1 e^{s_1 t} + c_2 e^{s_2 t}$
- Critically damped ($\zeta = 1$) $\theta_e(t) = (c_1 + c_2 t)e^{-\omega_n t}$
- Underdamped ($\zeta < 1$) $\theta_e(t) = (c_1 \cos \omega_d t + c_2 \sin \omega_d t) e^{-\zeta \omega_n t}$



Motion Control of a Single Joint

- Arm dynamics
 - Single motor attached to a single link



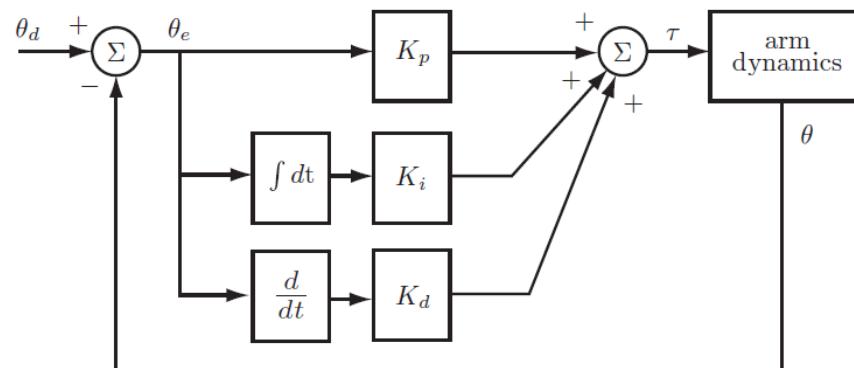
$$\begin{aligned}\tau &= M\ddot{\theta} + mgr \cos \theta + b\dot{\theta} \\ &= M\ddot{\theta} + h(\theta, \dot{\theta})\end{aligned}$$

τ : motor's torque
 θ : angle of link
 M : inertia of link
 m : mass of link
 r : distance from axis to center of mass
 g : gravitational accel.
 b : viscous coeff.

- Feedback control: PID control

$$\tau = K_p \theta_e + K_i \int \theta_e(t) dt + K_d \dot{\theta}_e$$

$$\theta_e = \theta_d - \theta$$



Motion Control of a Single Joint

- PD Control ($g=0$)
 - System dynamics ($\dot{\theta}_d = \ddot{\theta}_d = 0$)

$$M\ddot{\theta} + b\dot{\theta} = K_p(\theta_d - \theta) + K_d(\dot{\theta}_d - \dot{\theta})$$

$$\Rightarrow \boxed{\ddot{\theta}_e + \frac{b + K_d}{M}\dot{\theta}_e + \frac{K_p}{M}\theta_e = 0}$$

$$\Rightarrow \ddot{\theta}_e + 2\zeta\omega_n\dot{\theta}_e + \omega_n^2\theta_e = 0 \quad \zeta = \frac{b + K_d}{2\sqrt{K_p M}} \quad \text{and} \quad \omega_n = \sqrt{\frac{K_p}{M}}$$

- Stable condition

$$b + K_d > 0 \quad K_p > 0$$

- Critical damping: $\zeta = 1$

Increasing $K_p \Rightarrow$ decreasing $\zeta \Rightarrow$ underdamped

Increasing $K_d \Rightarrow$ increasing $\zeta \Rightarrow$ overdamped / reduce settling time

- Steady-state error = 0 ($t \rightarrow \infty \Rightarrow \dot{\theta}_e = \ddot{\theta}_e = 0 \Rightarrow \theta_e = 0$)

Motion Control of a Single Joint

- PD Control ($g > 0$)
 - System dynamics

$$M\ddot{\theta}_e + (b + K_d)\dot{\theta}_e + K_p\theta_e = mgr \cos \theta$$

- Steady-state error

$$\theta_e = \frac{mgr \cos \theta}{K_p}$$

- PID Control ($g > 0$)
 - System dynamics

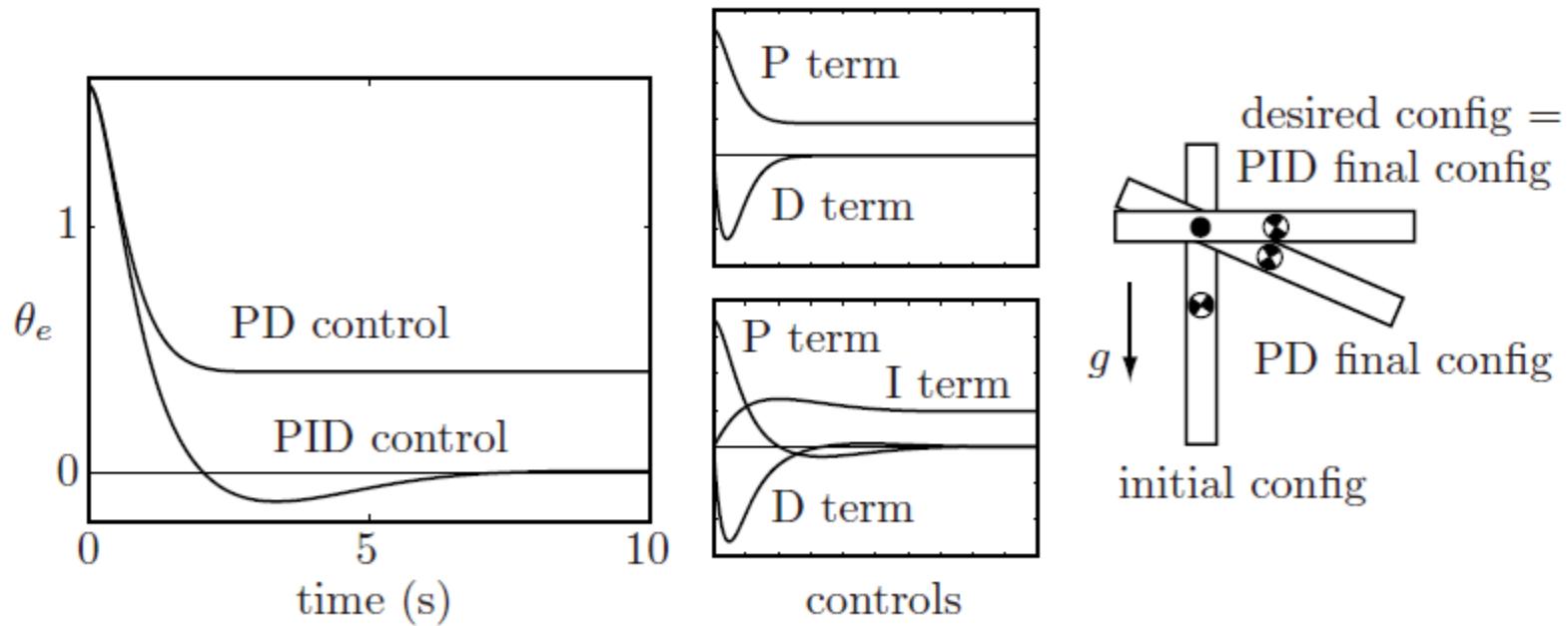
$$M\ddot{\theta}_e + (b + K_d)\dot{\theta}_e + K_p\theta_e + K_i \int \theta_e(t)dt = \tau_{\text{dist}}$$

$$\rightarrow \boxed{M\theta_e^{(3)} + (b + K_d)\ddot{\theta}_e + K_p\dot{\theta}_e + K_i\theta_e = \dot{\tau}_{\text{dist}}}$$

- Steady state error = 0 (if $\dot{\tau}_{\text{dist}}=0$)

Motion Control of a Single Joint

- PD vs. PID



Motion Control of a Single Joint

- Pseudocode for PID control
-

```
time = 0                      // dt = servo cycle time
eint = 0                       // error integral
qprev = senseAngle             // initial joint angle q
loop
    [qd,qdotd] = trajectory(time) // from trajectory generator

    q = senseAngle              // sense actual joint angle
    qdot = (q - qprev)/dt       // simple velocity calculation
    qprev = q

    e = qd - q
    edot = qdotd - qdot
    eint = eint + e*dt

    tau = Kp*e + Kd*edot + Ki*eint
    commandTorque(tau)

    time = time + dt
end loop
```

☞ Arm dynamics 고려하지 않음

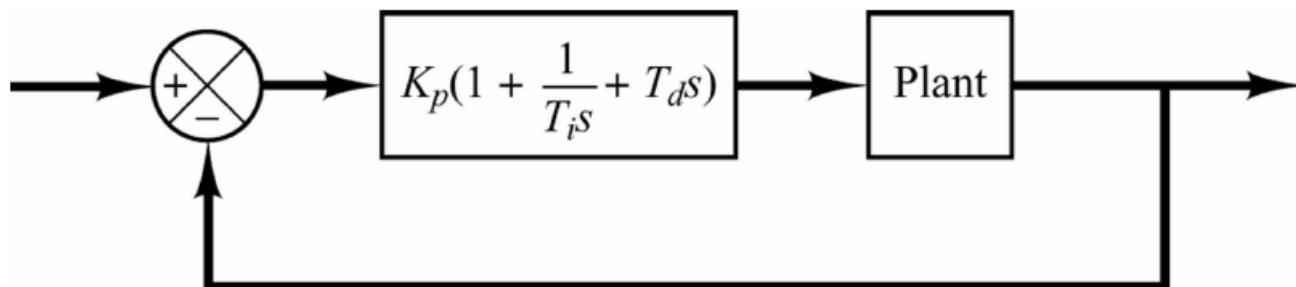
PID Tuning

- P, I, D Gain 의 관계

	Overshoot	Settling Time	Steady State Error
Kp	Increase	Small change	Decrease
Kd	Decrease	Decrease	None
Ki	Increase	Increase	Eliminate

PID Tuning

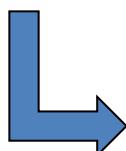
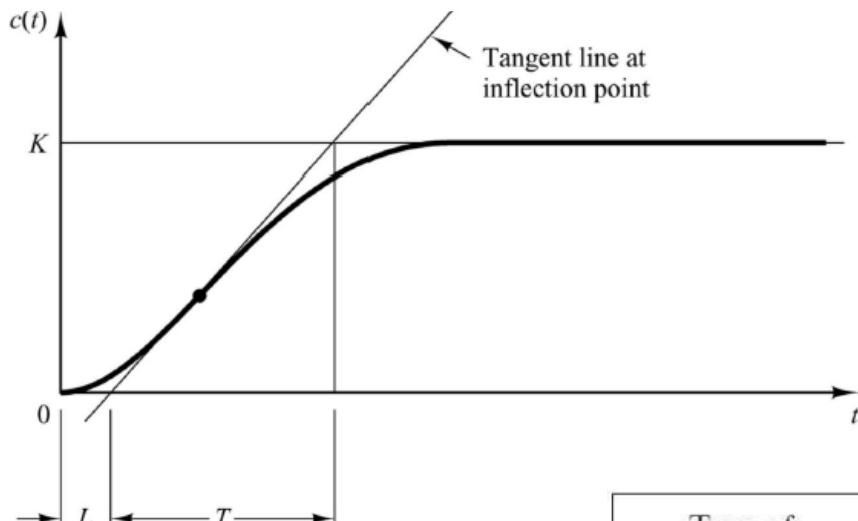
- Ziegler-Nichols Method
 - Plant에 대한 step response (transient state)로 부터 K_p , K_d , K_i 를 설정하는 실험적 방법



$$\frac{U(s)}{E(s)} = G_{PID}(s) = K_P + K_I \frac{1}{s} + K_D s = K_P \left(1 + \frac{1}{T_I s} + T_D s \right)$$

PID Tuning

- Ziegler-Nichols Method-Case 1
 - S-shaped step response

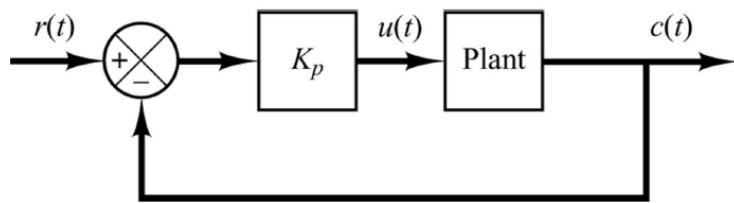


Type of Controller	K_p	T_i	T_d
P	$\frac{T}{L}$	∞	0
PI	$0.9 \frac{T}{L}$	$\frac{L}{0.3}$	0
PID	$1.2 \frac{T}{L}$	$2L$	$0.5L$

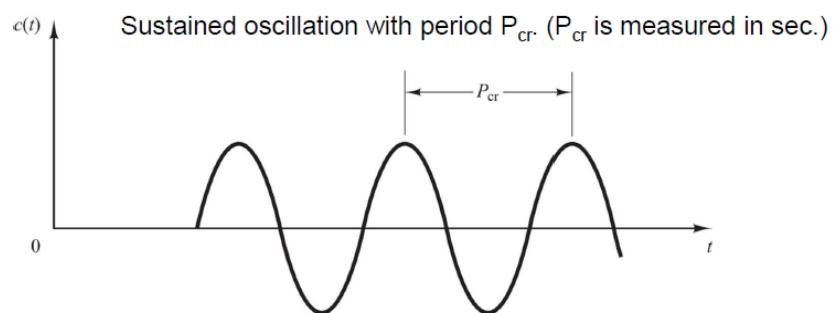
PID Tuning

- Ziegler-Nichols Method-Case 2

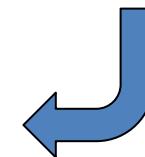
- Start with Closed-loop system with a proportional controller.
- Begin with a low value of gain, K_p
- Potential of this method to go unstable or cause damage.



- Begin with a low/zero value of gain K_p
- Increase until a steady-state oscillation occurs, note this gain as K_{cr}



Type of Controller	K_p	T_i	T_d
P	$0.5K_{cr}$	∞	0
PI	$0.45K_{cr}$	$\frac{1}{1.2}P_{cr}$	0
PID	$0.6K_{cr}$	$0.5P_{cr}$	$0.125P_{cr}$



Motion Control of a Single Joint

- Nonlinear arm dynamics

$$\tau = M(\theta)\ddot{\theta} + h(\theta, \dot{\theta})$$

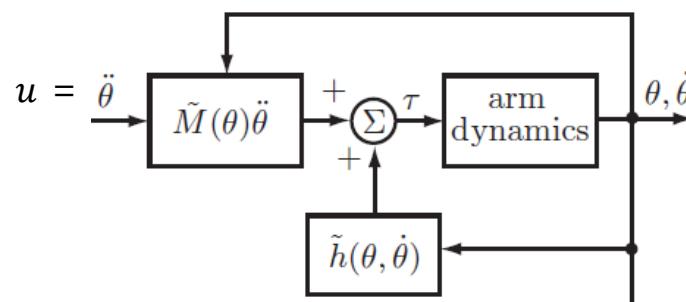
- Computed torque

$$\tau = \tilde{M}(\theta)\ddot{\theta} + \tilde{h}(\theta, \dot{\theta}). \quad \text{Ideal case : } \tilde{M}(\theta) = M(\theta), \tilde{h}(\theta, \dot{\theta}) = h(\theta, \dot{\theta})$$

- Feedback linearization

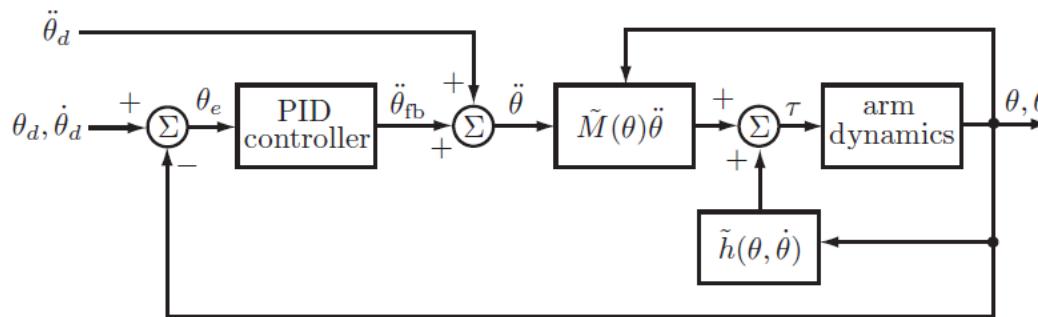
- Feedback 을 통하여 비선형 시스템을 선형시스템으로 전환
- Feedback 에 dynamics 계산 과정 포함
- Dynamics 계산 오차가 큰 경우 성능저하

$$\begin{aligned}\tau &= M(\theta)\ddot{\theta} + h(\theta, \dot{\theta}) \\ &= \tilde{M}(\theta)u + \tilde{h}(\theta, \dot{\theta})\end{aligned}\quad \xrightarrow{\text{Ideal case}} \quad \ddot{\theta} = u \quad \text{Linear system}$$



Motion Control of a Single Joint

- Computed torque control
 - PID control + feedback linearization
 - Feedback linearization 을 통하여 비선형 arm dynamics 을 선형화 (linearization)
 - 선형 시스템과 같이 PID control 쉽게 적용



- Control law

$$\ddot{\theta}_e + K_d \dot{\theta}_e + K_p \theta_e + K_i \int \theta_e(t) dt = c \quad \ddot{\theta} = \ddot{\theta}_d - \ddot{\theta}_e$$

$$\Rightarrow \ddot{\theta} = \ddot{\theta}_d + K_d \dot{\theta}_e + K_p \theta_e + K_i \int \theta_e(t) dt$$

$$\Rightarrow \boxed{\tau = \tilde{M}(\theta) \left(\ddot{\theta}_d + K_p \theta_e + K_i \int \theta_e(t) dt + K_d \dot{\theta}_e \right) + \tilde{h}(\theta, \dot{\theta})}$$

Motion Control of a Single Joint

- Psedocode for computed torque control
-

```
time = 0                                // dt = cycle time
eint = 0                                 // error integral
qprev = senseAngle                        // initial joint angle q
loop
    [qd,qdotd,qdotdotd] = trajectory(time) // from trajectory generator

    q = senseAngle                         // sense actual joint angle
    qdot = (q - qprev)/dt                 // simple velocity calculation
    qprev = q

    e = qd - q
    edot = qdotd - qdot
    eint = eint + e*dt

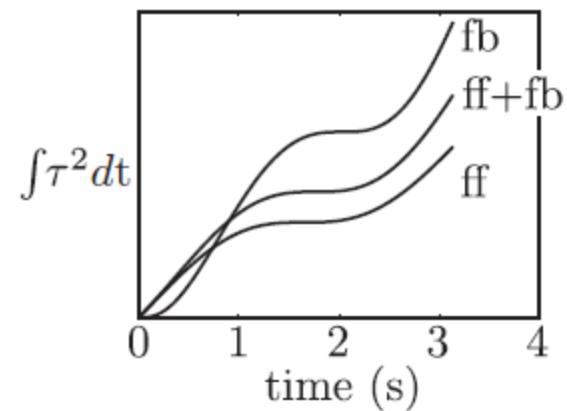
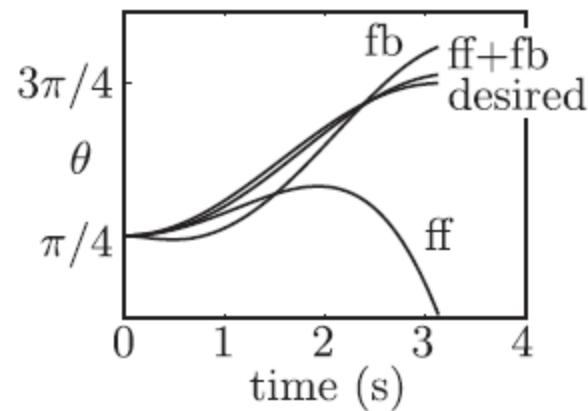
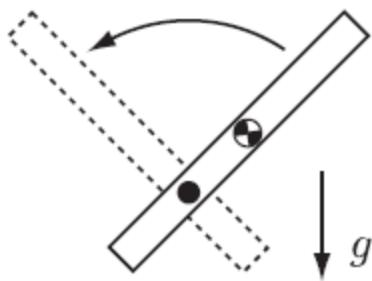
    tau = Mtilde(q)*(qdotdotd+Kp*e+Kd*edot+Ki*eint) + htilde(q,qdot)
    commandTorque(tau)

    time = time + dt
end loop
```

☞ Arm dynamics 고려함

Motion Control of a Single Joint

- Performance



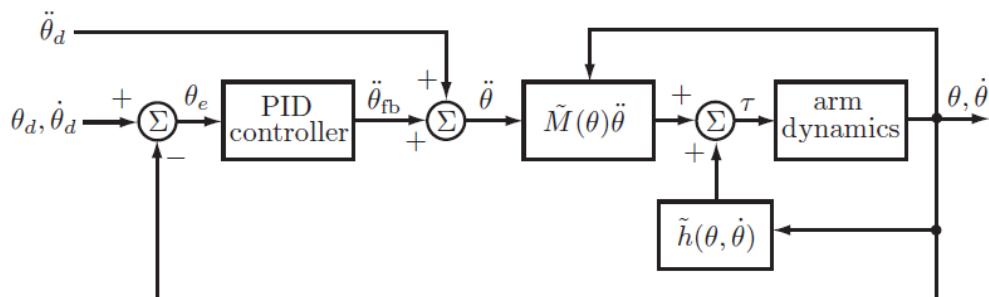
Multi-Joint Control

1. Decentralized control

- Arm dynamics 가 decoupling 된 경우 (joint 간 상호영향이 없음)
(ex) $M(\theta)$: diagonal matrix
Cartesian type manipulator case, Geared motor case
- Independent joint control: 각 joint 별 제어
 - PID control or computed torque control

2. Centralized control

- Arm dynamics 가 decoupling 되지 않은 경우
- Generalized computed torque control



$\theta, \theta_d, \tau: n \times 1$ vector

$\tilde{M}(\theta) : n \times n$ matrix

$K_p, K_I, K_D : n \times n$ matrix

$$\tau = \tilde{M}(\theta) \left(\ddot{\theta}_d + K_p \theta_e + K_i \int \theta_e(t) dt + K_d \dot{\theta}_e \right) + \tilde{h}(\theta, \dot{\theta})$$