

CSE 590K: Analysis and Control of Computing Systems Using Linear Discrete-Time System Theory: Common Controllers & Controller Design

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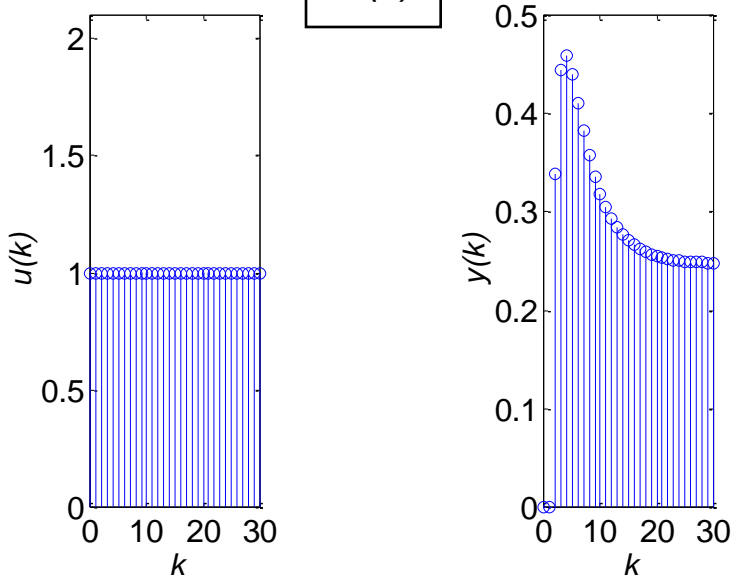
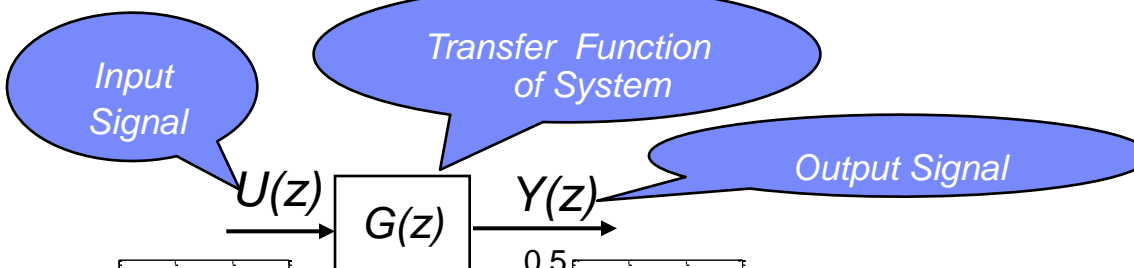
Microsoft Corporation

February 11, 2008

Agenda

- Common SISO (Single Input, Single Output) Controllers
- Design of SISO control
- Lab: Control Analysis

Summary of LTI Results

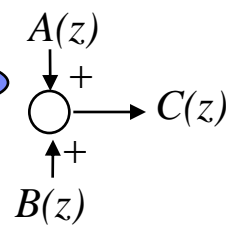


Stable system if $|a| < 1$, where a is the largest pole of $G(z)$

Settling time $\approx \frac{-4}{\ln |a|}$, where $|a|$ is the largest pole of $G(z)$

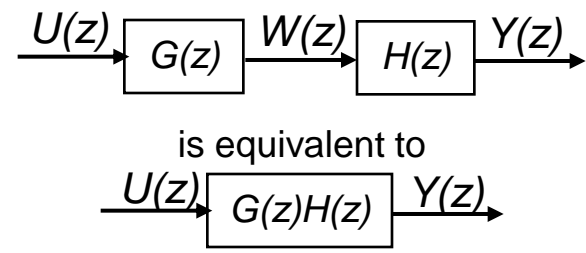
Steady state gain of $G(z)$ is $\frac{y(\infty)}{u(\infty)} = G(1)$

Adding signals:

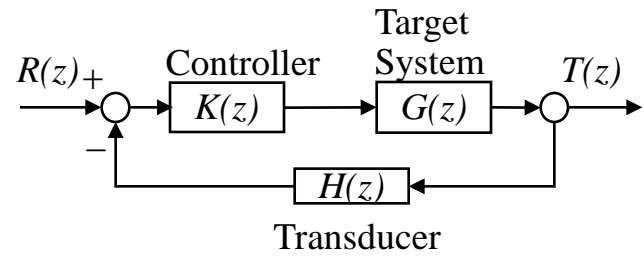


$\{c(k)=a(k)+b(k)\}$ has Z-Transform $A(z)+B(z)$.

Transfer functions in series

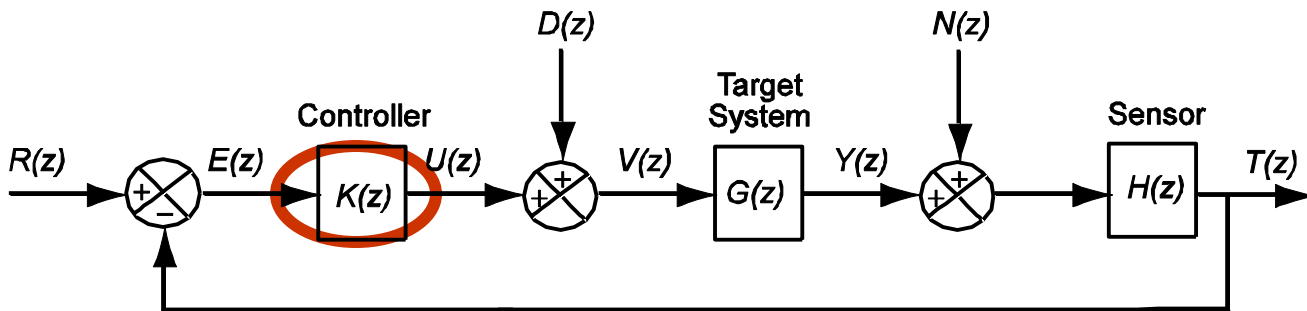


Transfer function of a feedback loop



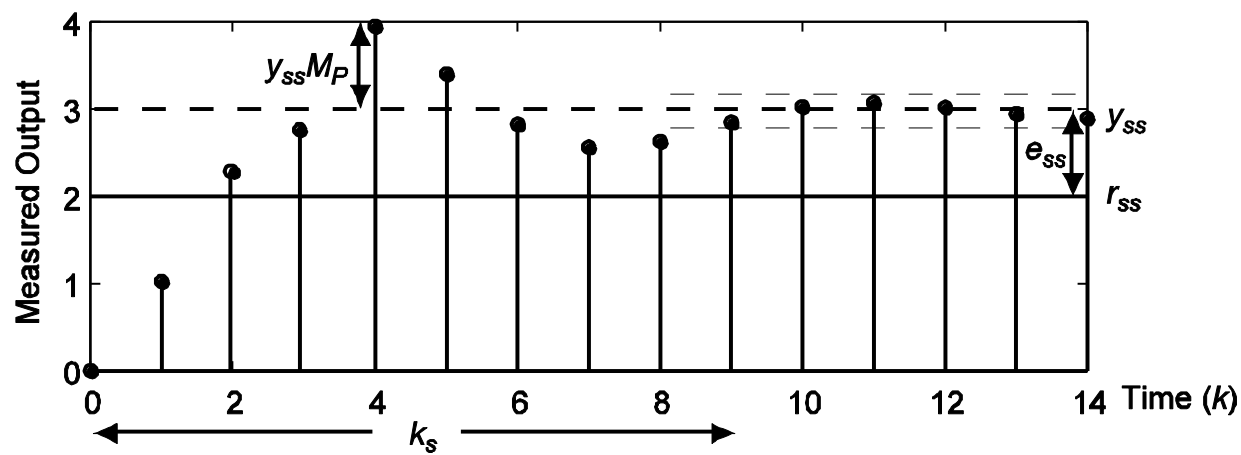
$$F_R(z) = \frac{T(z)}{R(z)} = \frac{K(z)G(z)}{1 + H(z)K(z)G(z)}$$

Basic Controllers



Basic controller

- Input: $E(z)$
- Output: $U(z)$



Given

- Target system t.f. $G(z)$
- Transducer t.f. $H(z)$
- Controller t.f. $K(z)$

Find

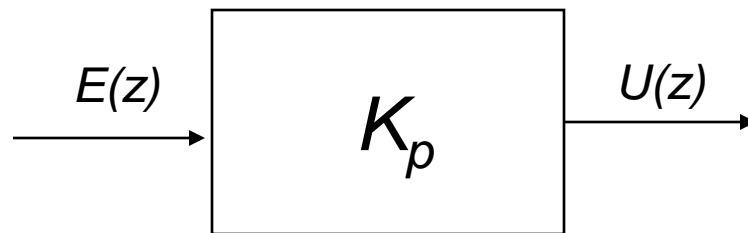
- Stability, accuracy, settling times
- Poles, steady state gain

Proportional Control

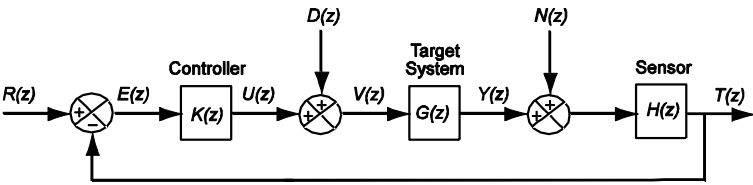
$$u(k) = K_p e(k)$$

$$K(z) = \frac{U(z)}{E(z)} = K_p$$

Control gain
(or just gain)



Performance of Proportional Control



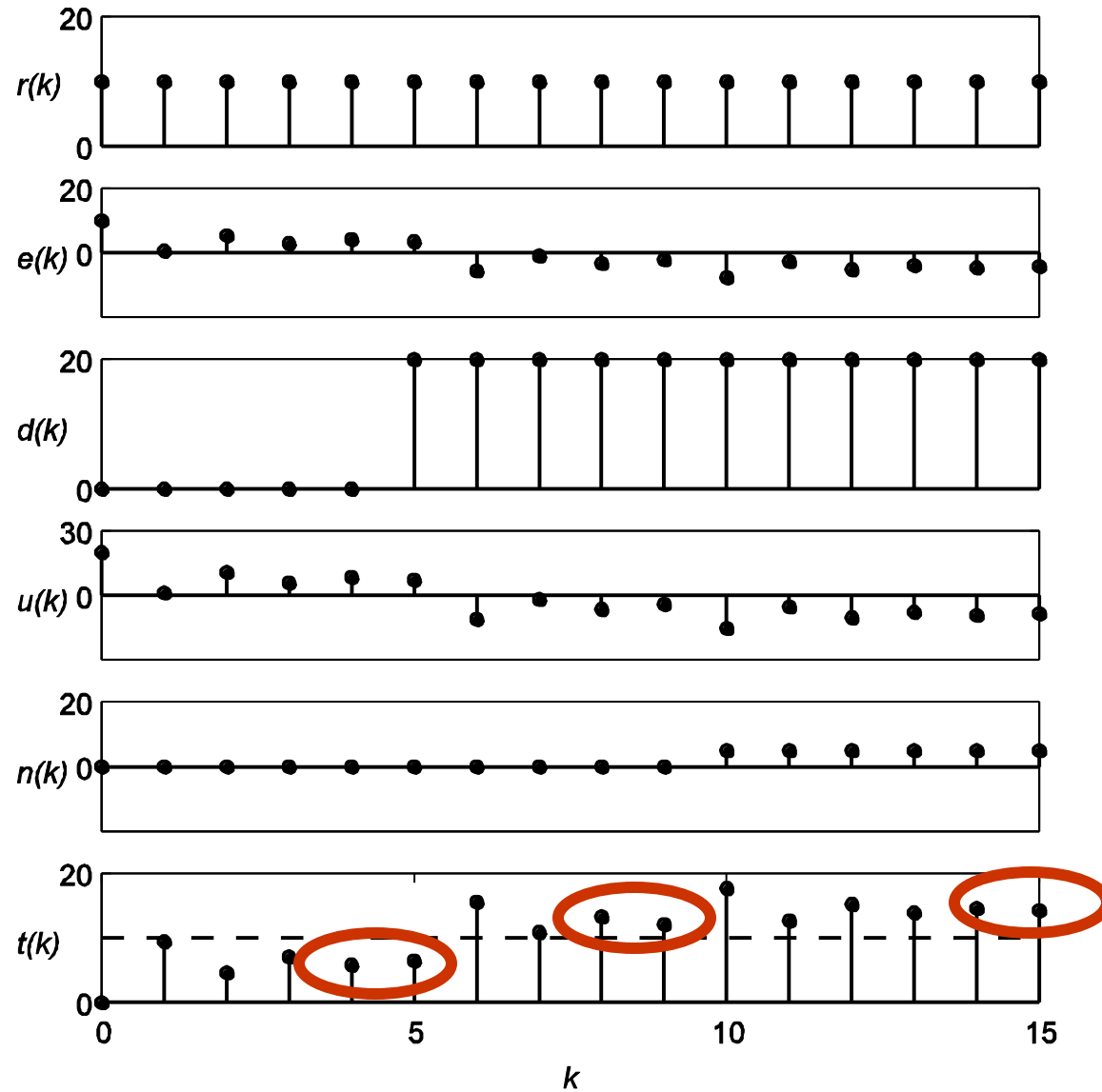
$$K(z) = K_P = 2$$

$$G(z) = \frac{0.47}{z - 0.43}$$

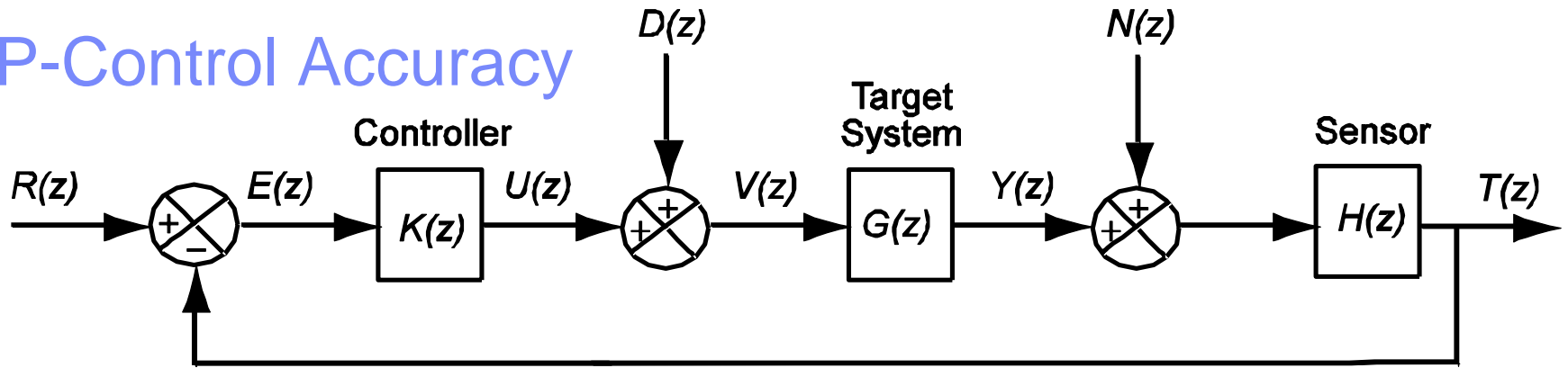
$$H(z) = 1$$

How does K_P affect:

- Stability
- Accuracy
- Settling time



P-Control Accuracy



Why?

$$K(z) = K_p$$

$$F_R(z) = \frac{Y(z)}{R(z)} = \frac{K_p G(z) H(z)}{1 + K_p G(z) H(z)}$$

$$F_D(z) = \frac{Y(z)}{D(z)} = \frac{G(z) H(z)}{1 + K_p G(z) H(z)}$$

$$F_N(z) = \frac{T(z)}{N(z)} = \frac{H(z)}{1 + K_p G(z) H(z)}$$

Want:

$$F_R(1) = \frac{K_p G(1) H(1)}{1 + K_p G(1) H(1)} = 1$$

$$F_D(1) = \frac{G(1) H(1)}{1 + K_p G(1) H(1)} = 0$$

$$F_N(1) = \frac{H(1)}{1 + K_p G(1) H(1)} = 0$$

Accuracy of Closed-loop Transfer Functions

For $K_P = 2$

$$G(z) = \frac{Y(z)}{U(z)} = \frac{0.47}{z - 0.43}$$

$$F_R(z) = \frac{0.47K_P}{z - 0.43 + 0.47K_P}$$

$$F_R(1) = \frac{0.47K_P}{0.57 + 0.47K_P} = 0.62 < 1$$

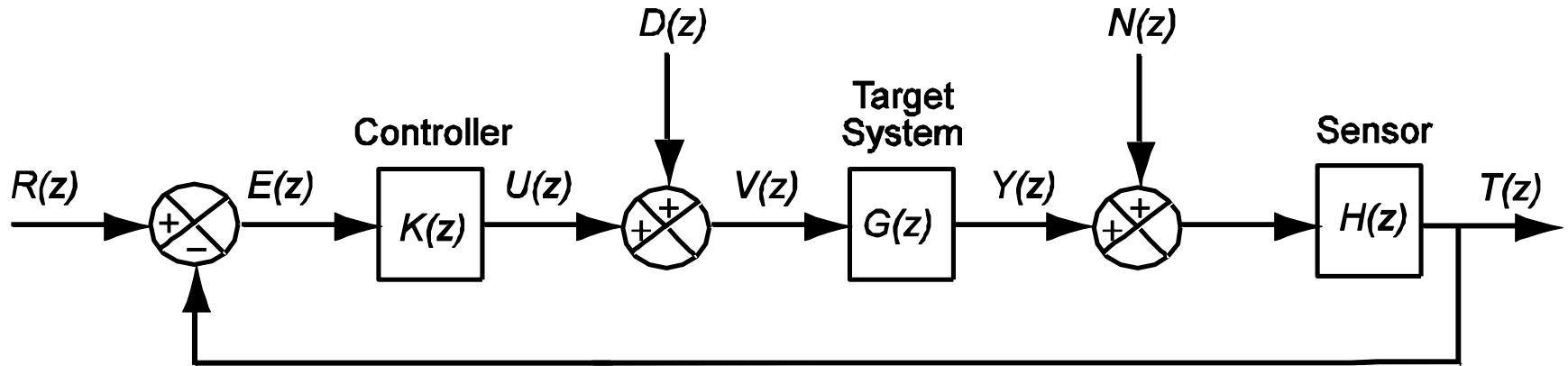
$$F_D(1) = \frac{0.47}{0.57 + 0.47K_P} = 0.31 > 0$$

$$F_N(1) = \frac{1}{0.57 + 0.47K_P} = 0.66 > 0$$

Observations

- Inherent inaccuracy of P-control
- Want large K_P

P-Control Stability and Settling Times



$$K(z) = K_p$$

$$F_R(z) = \frac{Y(z)}{R(z)} = \frac{K_p G(z) H(z)}{1 + K_p G(z) H(z)}$$

$$F_D(z) = \frac{Y(z)}{D(z)} = \frac{G(z) H(z)}{1 + K_p G(z) H(z)}$$

$$F_N(z) = \frac{T(z)}{N(z)} = \frac{H(z)}{1 + K_p G(z) H(z)}$$

Observation:

- Transfer functions have the same poles

Defn: **Characteristic polynomial**

- Denominator of the transfer function

Defn: **Characteristic equation**

- Set characteristic polynomial to 0

Poles of Closed-loop Transfer Functions

Characteristic equation:

$$1 + K_p G(z)H(z) = 0$$

Poles are solutions to characteristic equation.

Root locus

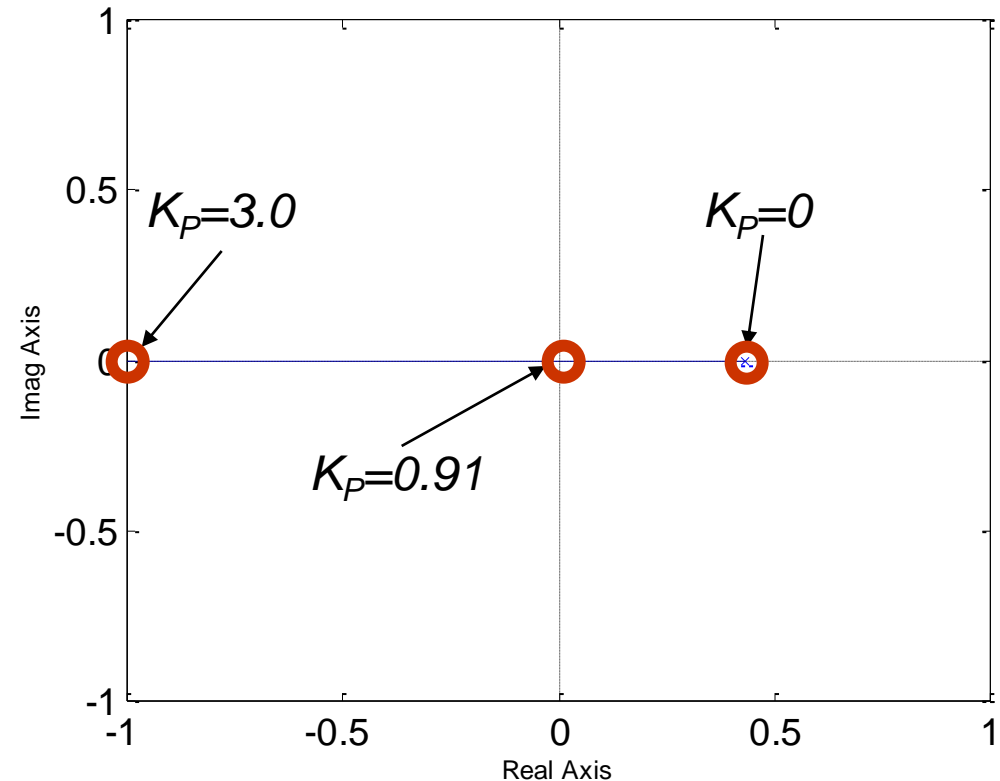
- Plot K_p that solve the characteristics equation

$$G(z) = \frac{Y(z)}{U(z)} = \frac{0.47}{z - 0.43}, \quad H(z) = 1$$

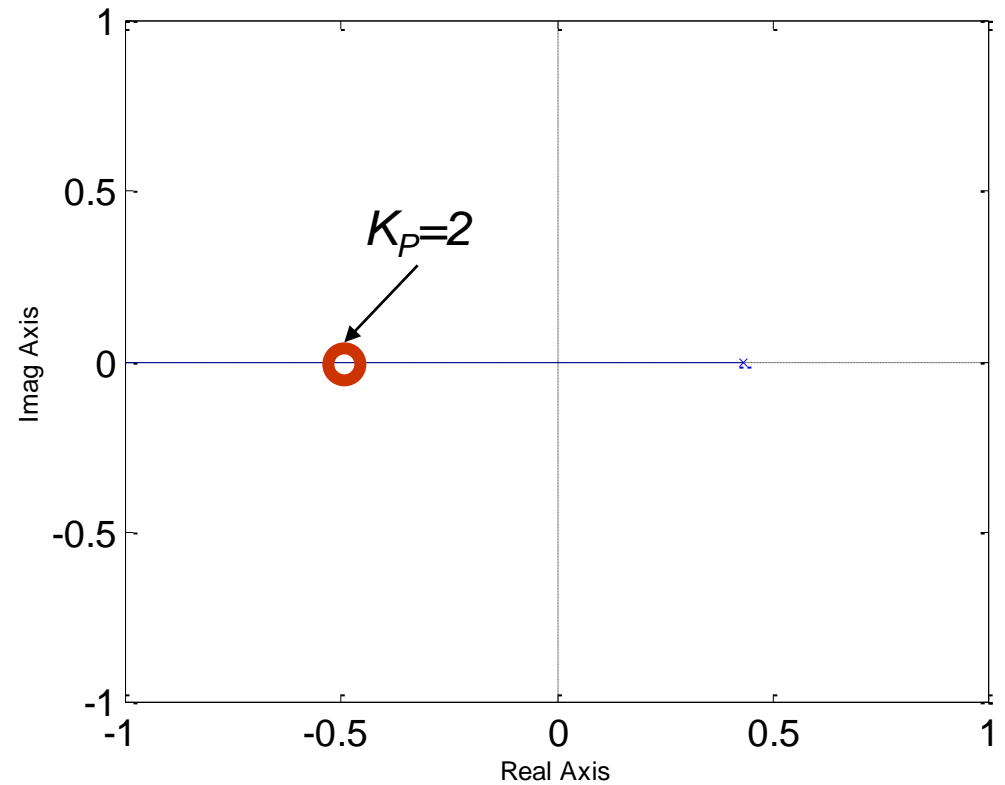
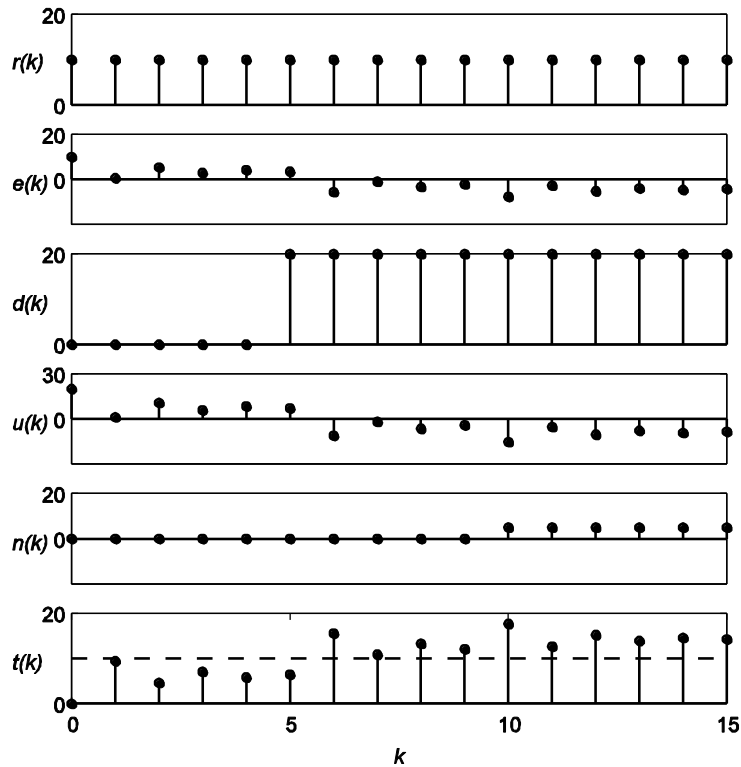
$$F_R(z) = \frac{0.47 K_p}{z - 0.43 + 0.47 K_p}$$

Why complex?

Plot $z = 0.43 - 0.47 K_p$ in the complex plane

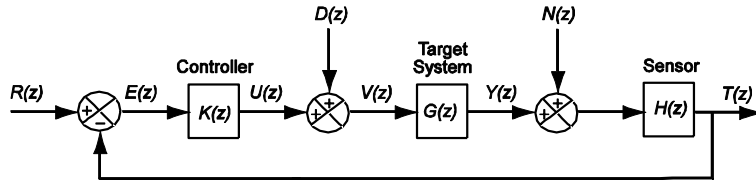


Explaining the Simulation Settling Times With Root-Locus



At $K_P = 2$, $z = 0.43 - 0.47(2) = -0.51$. $k_S \approx 6$.

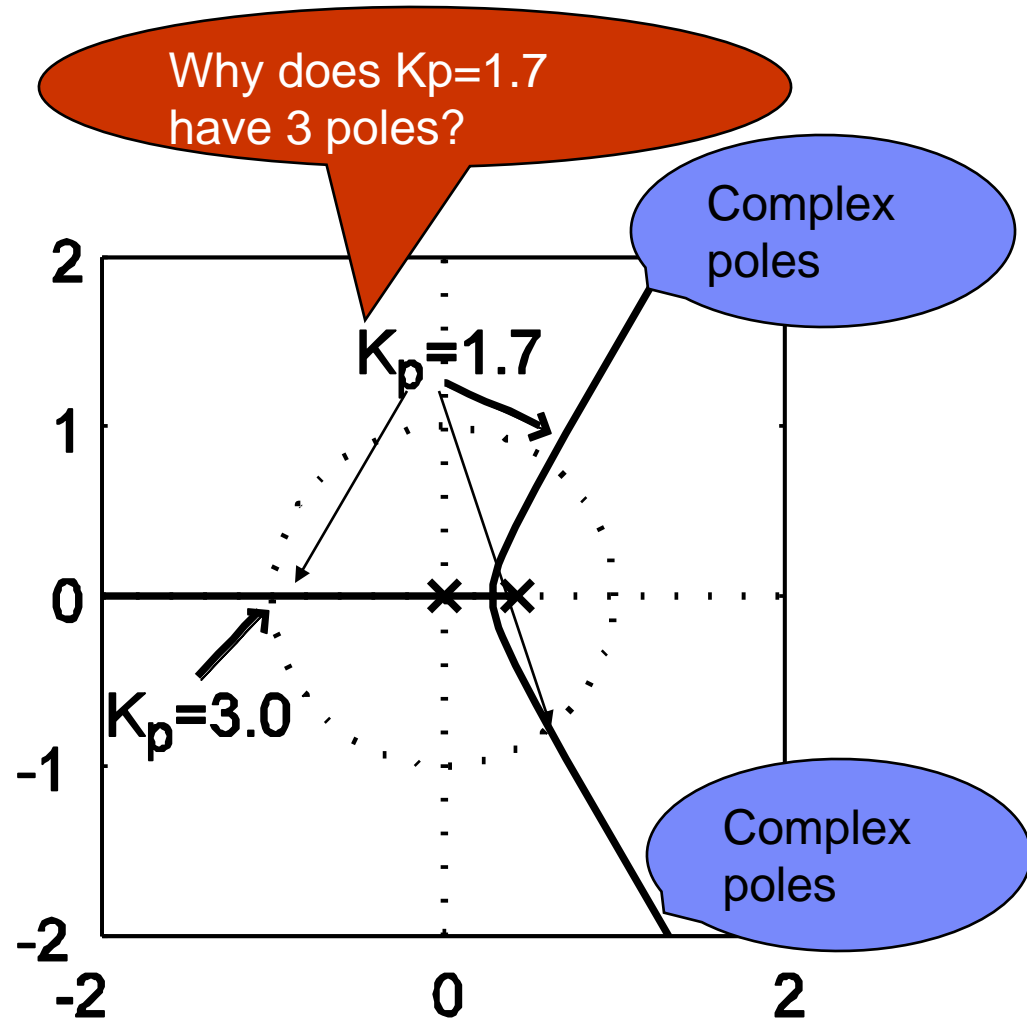
More Complicated Root-locus Plots



$$G(z) = \frac{Y(z)}{U(z)} = \frac{0.47}{z - 0.43}$$

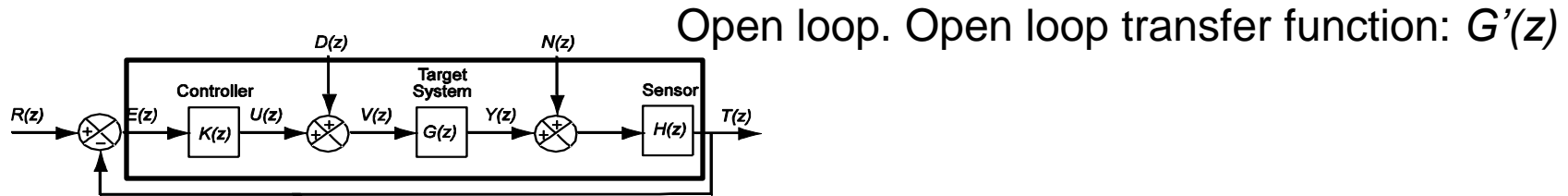
$$H(z) = \frac{1}{z^2} \quad (\text{delay of two time units})$$

$$F_R(z) = \frac{0.47K_p}{z^3 - z^2 \cdot 0.43 + 0.47K_p}$$



Why two branches for complex poles?

Towards Constructing Root-Locus Plots



$$K(z) = KK'(z)$$

$$G'(z) = K'(z)G(z)H(z)$$

$$F_R(z) = \frac{T(z)}{R(z)} = \frac{K(z)G(z)H(z)}{1 + K(z)G(z)H(z)} = \frac{KG'(z)}{1 + KG'(z)}$$

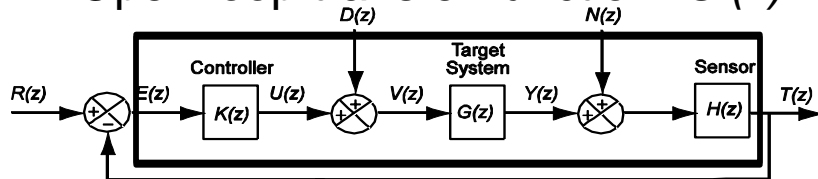
Poles are z solutions to: $1 + KG'(z) = 0$

$$\Leftrightarrow \frac{1}{K} + G'(z) = 0. \text{ At } K = \infty, \text{ poles of } G'(z).$$

$$\Leftrightarrow \frac{1}{G'(z)} + K = 0. \text{ At } K = 0, \text{ zeroes of } G'(z).$$

Outline for Constructing Root-Locus Plots

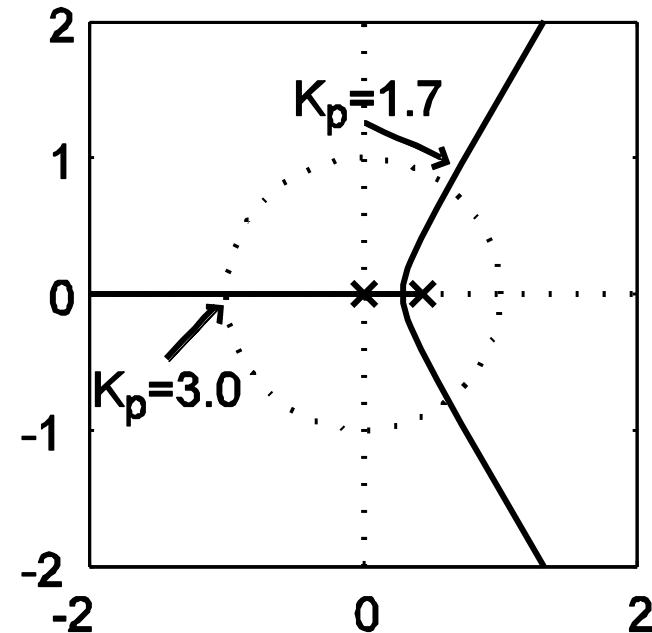
Open loop transfer function: $G'(z)$



Poles are z solutions to: $1 + KG'(z) = 0$

$$\Leftrightarrow \frac{1}{K} + G'(z) = 0. \text{ At } K = \infty, \text{ poles of } G'(z).$$

$$\Leftrightarrow \frac{1}{G'(z)} + K = 0. \text{ At } K = 0, \text{ zeroes of } G'(z).$$



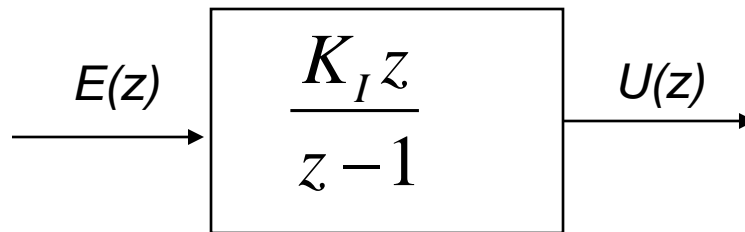
Steps

1. Indicate open loop poles with an "x"
2. Indicate open loop zeros with an "o"
3. Determine the root loci on the real axis
4. Find the break-away and break-in points
5. Draw the line in the complex plane that intersects the real axis

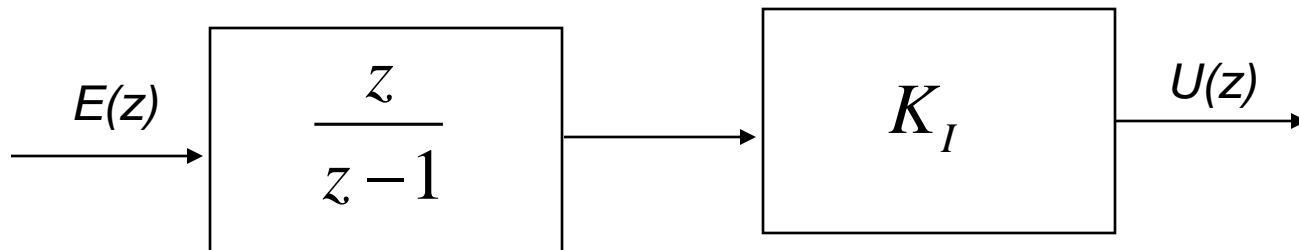
Integral Control

$$u(k + 1) = K_I u(k) + e(k + 1)$$

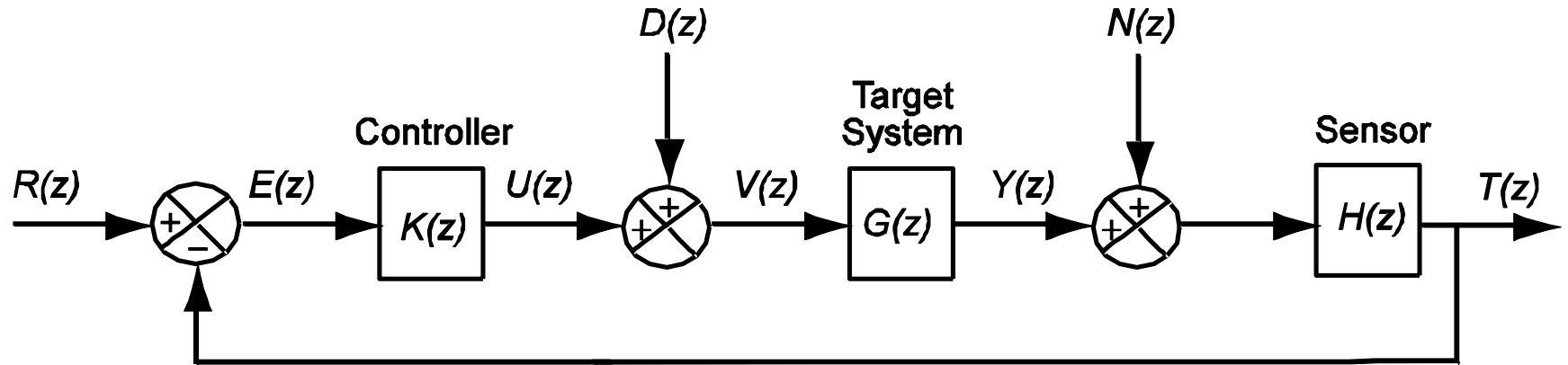
$$K(z) = \frac{U(z)}{E(z)} = \frac{K_I z}{z - 1}$$



Or



I-Control Accuracy



$$K(z) = \frac{U(z)}{E(z)} = \frac{K_I z}{z-1}, \quad H(z) = 1$$

$$F_R(z) = \frac{Y(z)}{R(z)} = \frac{zK_I G(z)}{z-1 + zK_I G(z)}$$

$$F_D(z) = \frac{Y(z)}{D(z)} = \frac{G(z)(z-1)}{z-1 + zK_I G(z)}$$

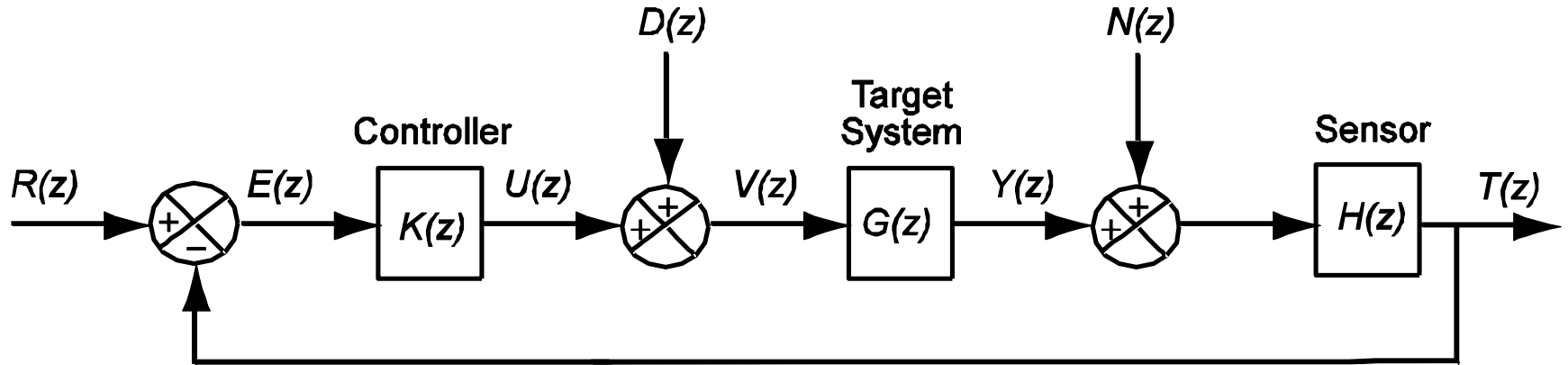
$$F_N(z) = \frac{T(z)}{N(z)} = \frac{(z-1)}{z-1 + zK_I G(z)}$$

Observe that

$$F_R(1) = \frac{K_I G(1)}{1-1 + K_I G(1)} = 1$$

$$F_D(1) = 0 = F_N(1)$$

I-Control Stability and Settling Times



$$K(z) = \frac{U(z)}{E(z)} = \frac{K_I z}{z-1}$$

$$F_R(z) = \frac{Y(z)}{R(z)} = \frac{zK_I G(z)H(z)}{z-1 + zK_I G(z)H(z)}$$

$$F_D(z) = \frac{Y(z)}{D(z)} = \frac{G(z)H(z)}{z-1 + zK_I G(z)H(z)}$$

$$F_N(z) = \frac{T(z)}{N(z)} = \frac{H(z)}{z-1 + zK_I G(z)H(z)}$$

I-Control characteristic equation:

$$0 = z - 1 + zK_I G(z)H(z)$$

P-Control characteristic equation:

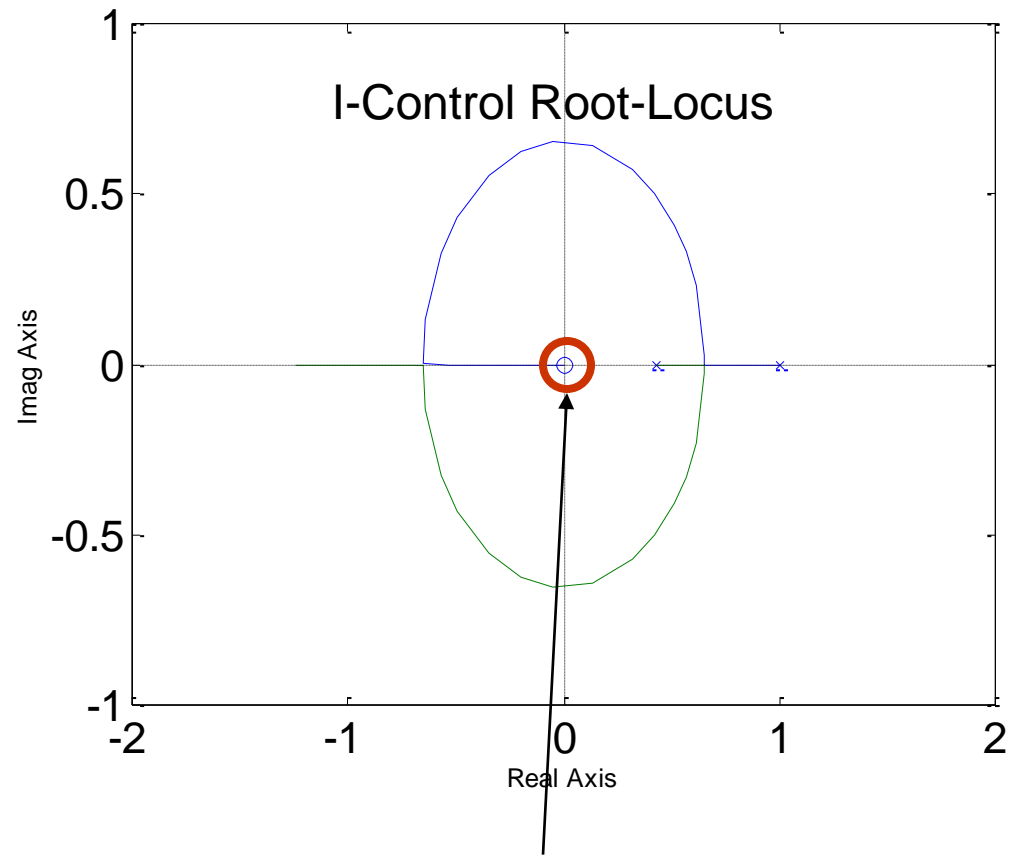
$$0 = 1 + K_P G(z)H(z)$$

I-Control results in a higher order system.

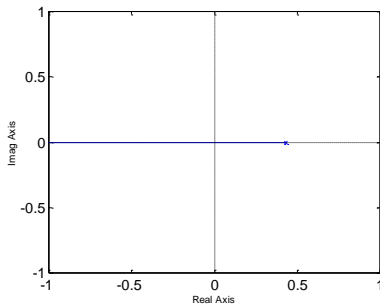
Root Locus for I-Control: No Feedback Delay

$$G(z) = \frac{Y(z)}{U(z)} = \frac{0.47}{z - 0.43}, \quad H(z) = 1$$

$$F_R(z) = \frac{0.47K_I z}{z^2 + (0.47K_I - 1.43)z + 0.43}$$

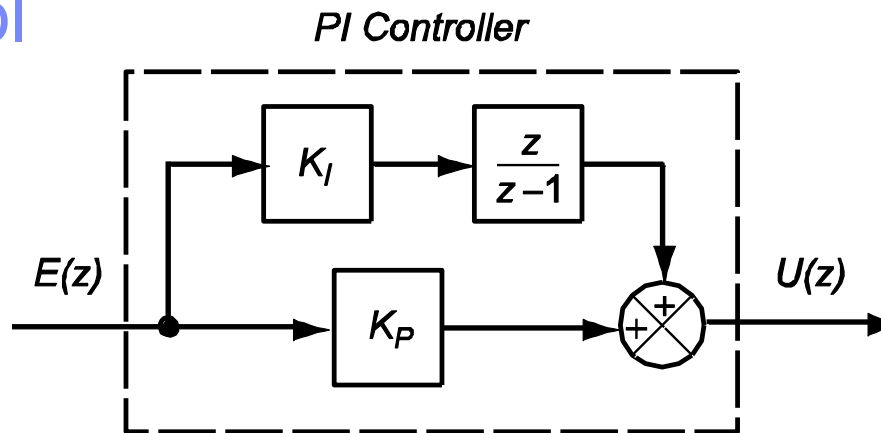


P-Control Root-Locus



Why the open-loop zero at 0?

PI Control

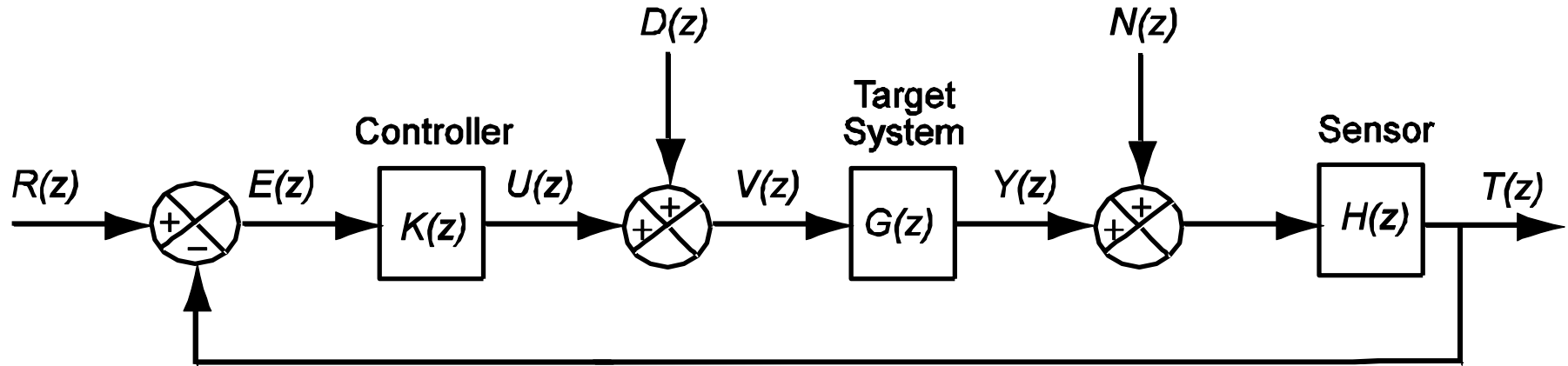


$$u(k) = u_p(k) + u_I(k)$$

$$= u(k-1) + (K_P + K_I)e(k) - K_P e(k-1)$$

$$K(z) = \frac{E(z)}{U(z)} = K_P + \frac{K_I z}{z-1} = \frac{(K_P + K_I)z - K_P}{z-1}$$

PI Control Accuracy



$$K(z) = \frac{U(z)}{E(z)} = \frac{(K_p + K_I)z - K_p}{z-1}, \quad H(z) = 1$$

$$F_R(z) = \frac{Y(z)}{R(z)} = \frac{((K_p + K_I)z - K_p)G(z)}{z-1 + ((K_p + K_I)z - K_p)G(z)}$$

$$F_D(z) = \frac{Y(z)}{D(z)} = \frac{G(z)(z-1)}{z-1 + ((K_p + K_I)z - K_p)G(z)}$$

$$F_N(z) = \frac{T(z)}{N(z)} = \frac{(z-1)}{z-1 + ((K_p + K_I)z - K_p)G(z)}$$

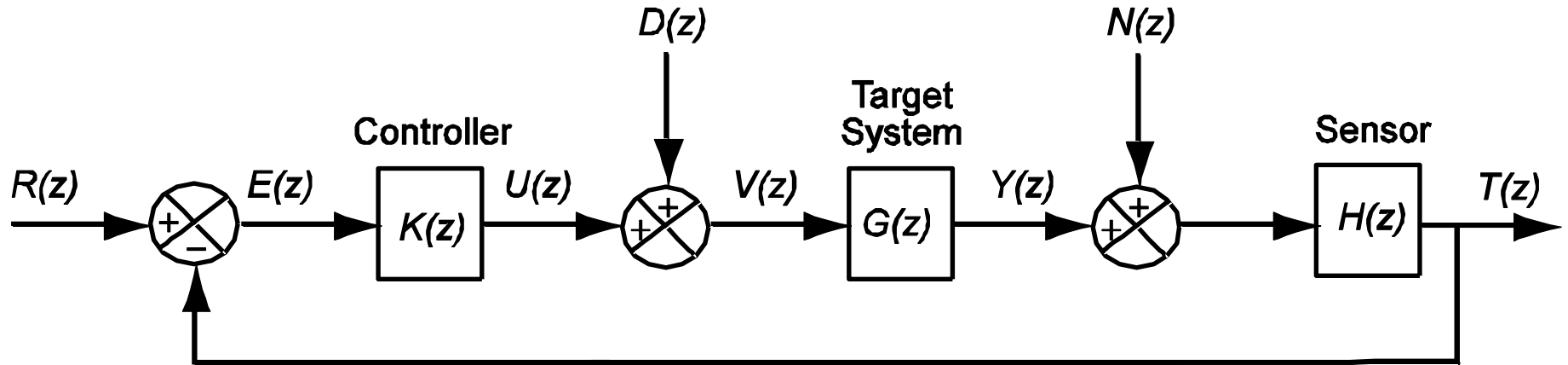
Observe that

$$F_R(1) = 1$$

$$F_D(1) = 0 = F_N(1)$$

Integral component ensures accuracy for a step response

PI Control Stability and Settling Times



$$K(z) = \frac{U(z)}{E(z)} = \frac{(K_p + K_I)z - K_p}{z - 1}, H(z) = 1$$

$$F_R(z) = \frac{Y(z)}{R(z)} = \frac{((K_p + K_I)z - K_p)G(z)}{z - 1 + ((K_p + K_I)z - K_p)G(z)}$$

$$F_D(z) = \frac{Y(z)}{D(z)} = \frac{G(z)}{z - 1 + ((K_p + K_I)z - K_p)G(z)}$$

$$F_N(z) = \frac{T(z)}{N(z)} = \frac{1}{z - 1 + ((K_p + K_I)z - K_p)G(z)}$$

I Control characteristic equation:

$$0 = z - 1 + zK_I G(z)H(z)$$

P Control characteristic equation:

$$0 = 1 + K_p G(z)H(z)$$

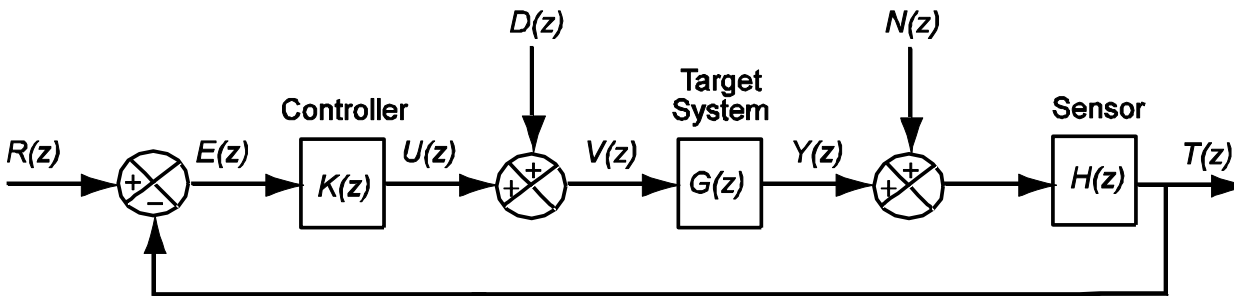
PI Control characteristic equation:

$$0 = z - 1 + ((K_p + K_I)z - K_p)G(z)$$

Root Locus with > 1 Control Gain

- Issues
 - ❖ Two parameters
 - ❖ Transfer function is not in a convenient form for root locus
- Approach
 - ❖ Look at the largest pole (and possible pole angle)
 - ❖ Can translate into settling time

PI Poles, Stability, and Settling Times: No Sensor Delays

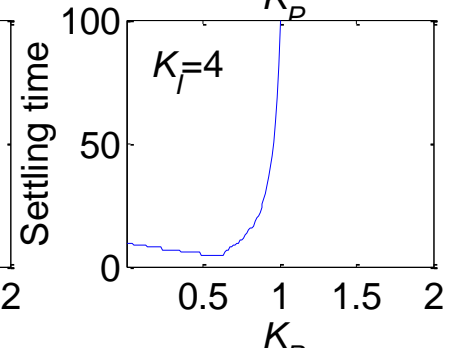
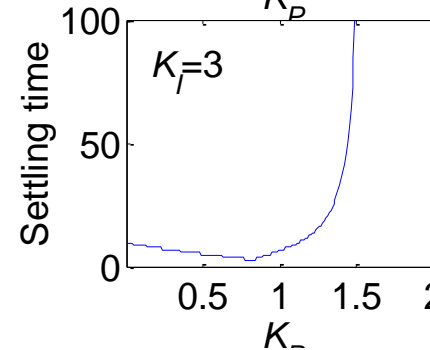
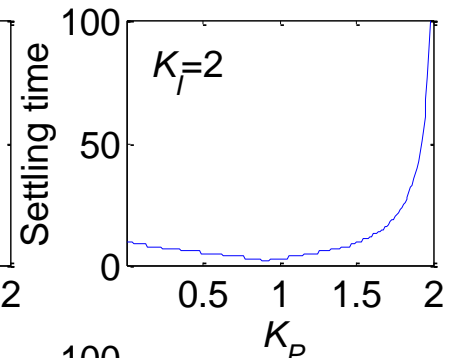
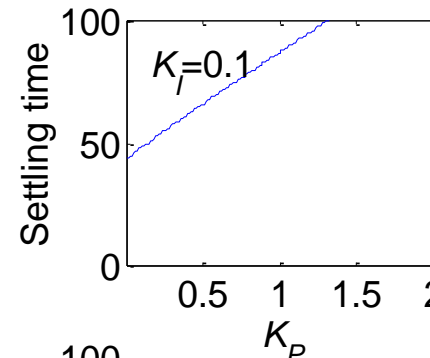
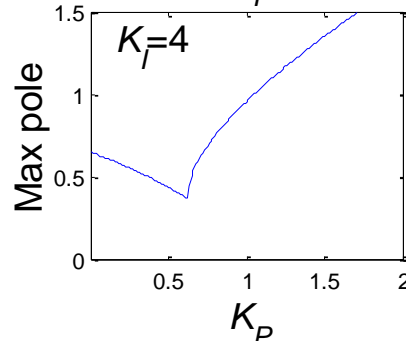
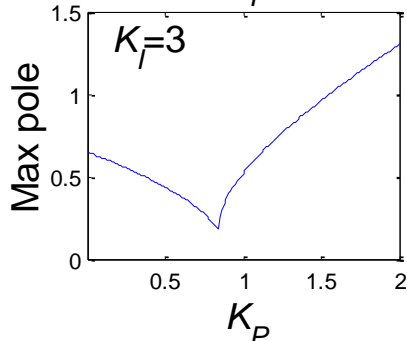
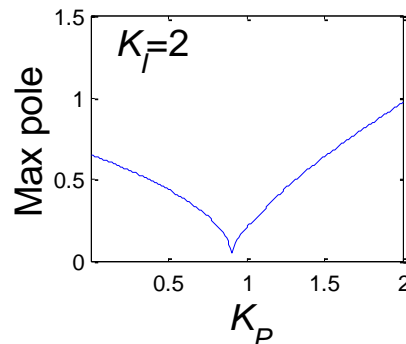
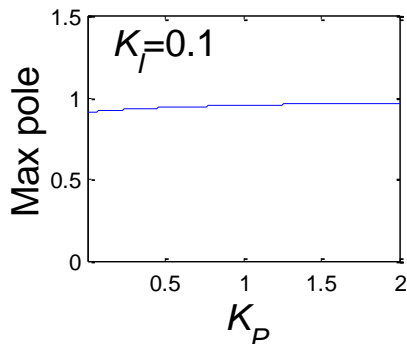


$$K(z) = \frac{U(z)}{E(z)} = \frac{(K_p + K_I)z - K_p}{z - 1}$$

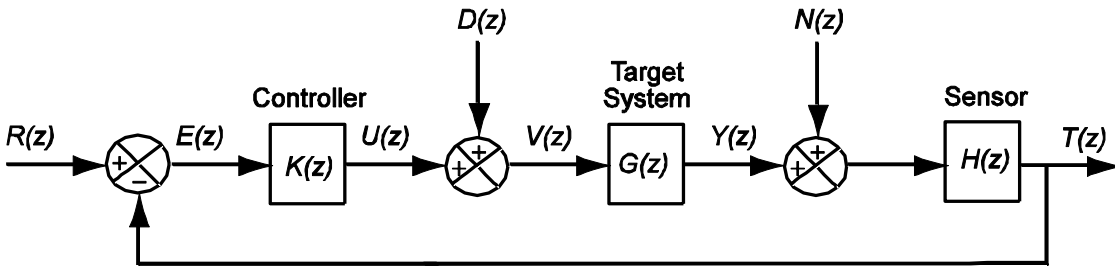
$$G(z) = \frac{Y(z)}{U(z)} = \frac{0.47}{z - 0.43}$$

$$H(z) = 1$$

$$F_R(z) = \frac{0.47(K_p + K_I)z - 0.47K_p}{z^2 + (0.47(K_p + K_I) - 1.43)z + 0.43 - 0.47K_p}$$



PI Poles, Stability, and Settling Times: With Sensor Delays

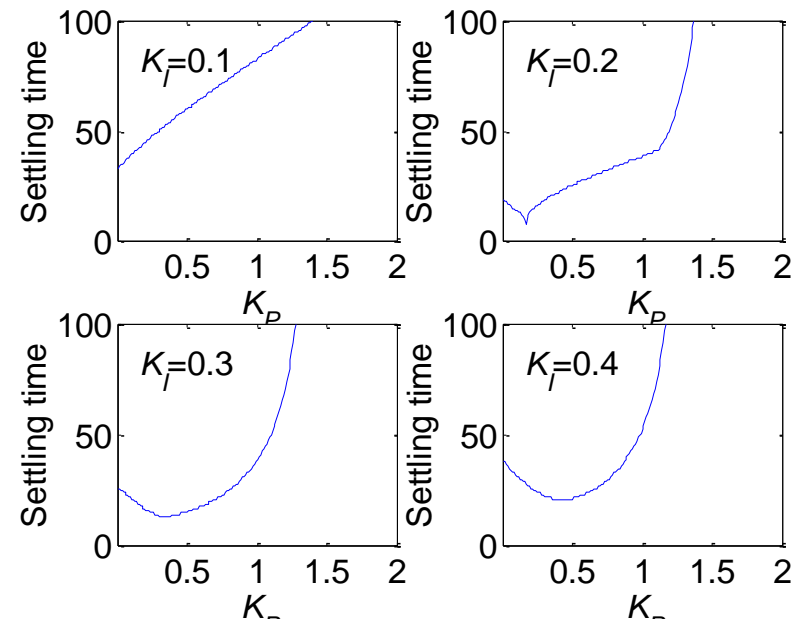
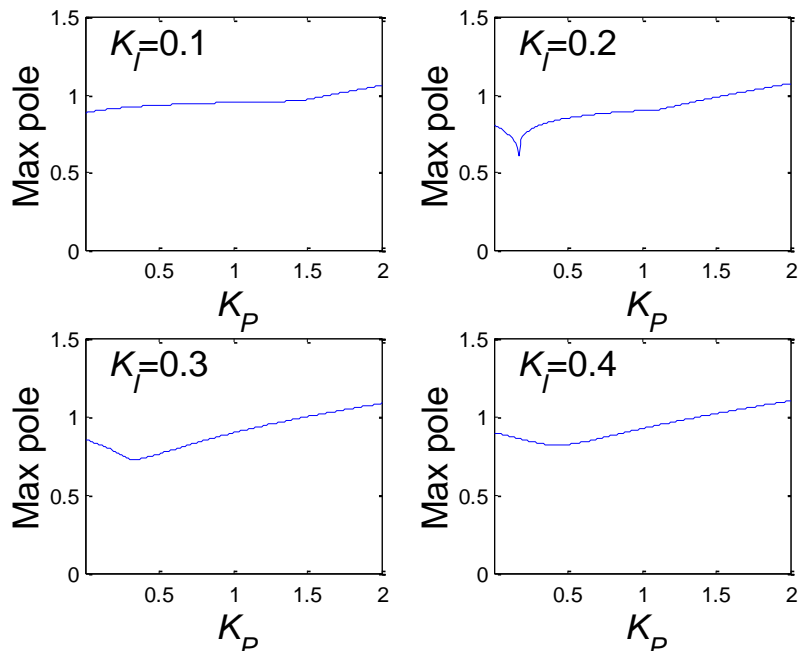


$$K(z) = \frac{U(z)}{E(z)} = \frac{(K_p + K_i)z - K_p}{z - 1}$$

$$G(z) = \frac{Y(z)}{U(z)} = \frac{0.47}{z - 0.43}$$

$$H(z) = \frac{1}{z^2}$$

$$F_R(z) = \frac{0.47(K_p + K_i)z - 0.47K_p}{z^4 - 1.43z^3 + 0.43z^2 + 0.47(K_p + K_i)z - 0.47K_p}$$



Differential Control

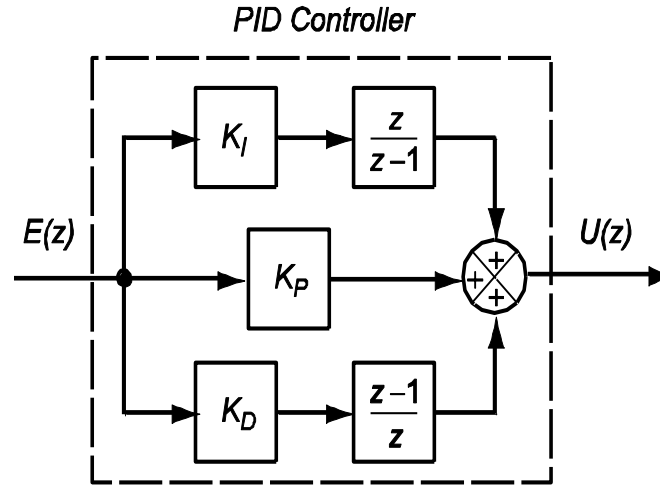
$$u_D(k) = K_D(e(k) - e(k-1))$$

$$K_D(z) = \frac{z-1}{z}$$

Always used in combination with Integral and proportional control

Appeal: Anticipate trends

PID Control

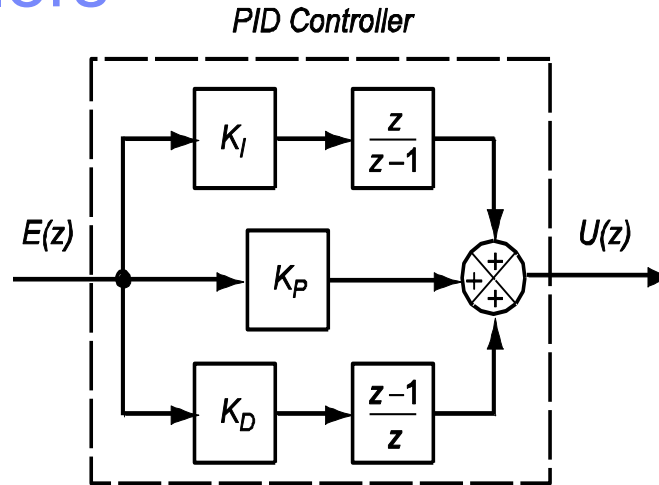


$$u(k) = u_P(k) + u_I(k) + u_D(k)$$

$$= K_P e(k) + u(k-1) + K_I e(k) + K_D (e(k) - e(k-1))$$

$$K(z) = \frac{E(z)}{U(z)} = K_P + K_I \frac{z}{z-1} + K_D \frac{z-1}{z}$$

Basic Controllers



P control $K(z) = K_P$ $u(k) = K_P e(k)$

I control $K(z) = K_I \frac{z}{z-1}$ $u(k) = u(k-1) + K_I e(k)$

D control $K(z) = K_D \frac{z-1}{z}$ $u(k) = K_D [e(k) - e(k-1)]$

PI control $K(z) = K_P + K_I \frac{z}{z-1}$ $u(k) = u(k-1) + K_P [e(k) - e(k-1)] + K_I e(k)$

PID control $K(z) = K_P + K_I \frac{z}{z-1} + K_D \frac{z-1}{z}$ $u(k) = \begin{cases} u(k-1) + K_P [e(k) - e(k-1)] + K_I e(k) \\ + K_D [e(k) - 2e(k-1) - e(k-2)] \end{cases}$

Controller Design

Intuition For Designing Controllers

- Controllers are parameterized by their gain constants
 - ❖ K_P, K_I, K_D

- Gains determine the closed-loop poles

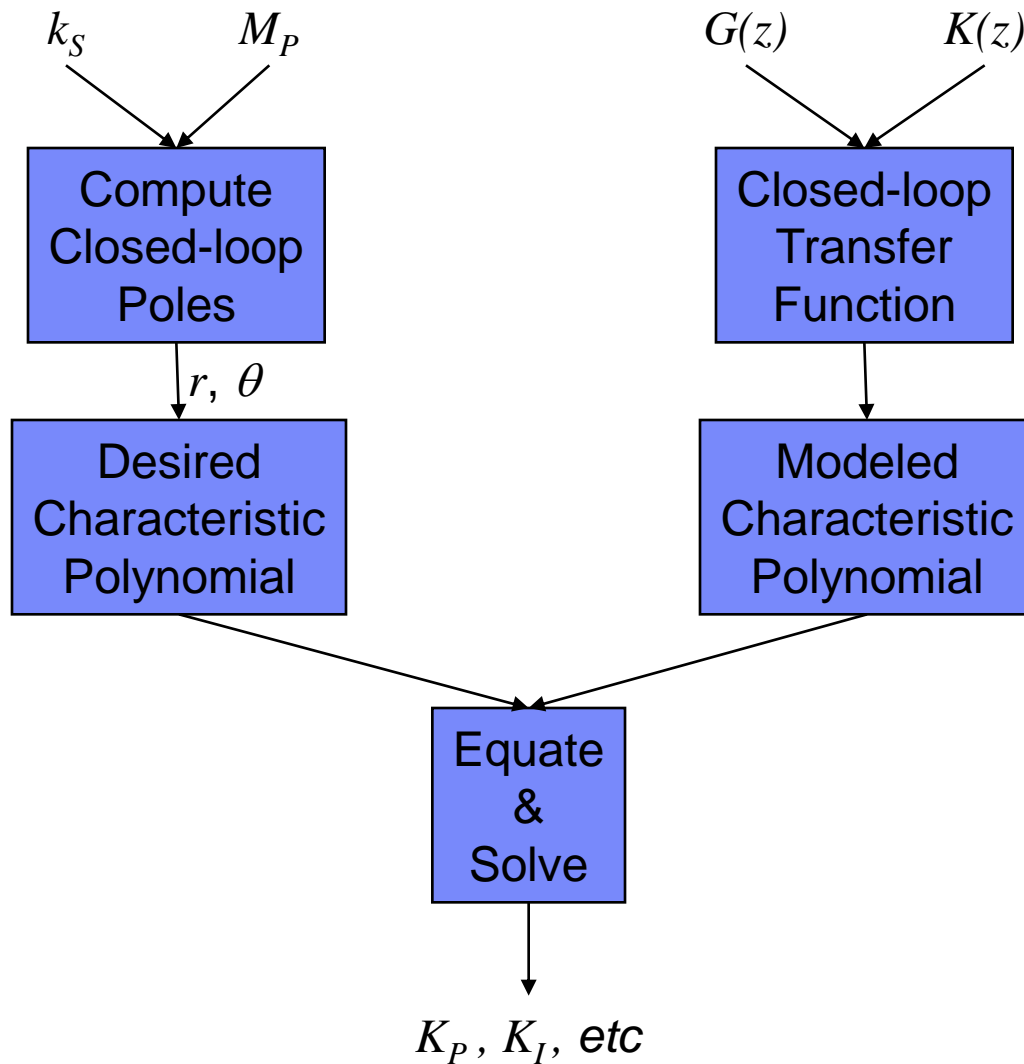
$$F_R(z) = \frac{Y(z)}{R(z)} = \frac{K(z)G(z)H(z)}{1 + K(z)G(z)H(z)}$$

- Thus, system response is determined by controller parameters
 - ❖ The effect can be determined from the characteristic equation

Controller Design Problem

- Given
 - ❖ System Model
 - Or, 1st-order approximation
 - ❖ Controller
 - ❖ Control Objective
 - Reference Tracking
 - Disturbance Rejection
 - ❖ Desired Transient response characteristics
 - Settling Time constraint
 - Overshoot constraint
 - Steady-state error [?]
- Choose
 - ❖ Controller gains

Pole Placement: General Methodology



Pole placement for I-control of Notes

Desired Characteristic Polynomial:

$$p_{1,2} = re^{\pm j\theta}$$

$$k_s \approx -\frac{4}{\log r} \Rightarrow r = e^{-4/k_s}$$

$$M_P \approx r^{\pi/\theta} \Rightarrow \theta = \pi \frac{\log r}{\log M_P}$$

$$P_D(z) = (z - re^{j\theta})(z - re^{-j\theta}) = z^2 - (2r \cos \theta)z + r^2$$

Modeled Characteristic Polynomial:

$$G(z) = \frac{0.47}{z - 0.43}, \quad K(z) = \frac{K_I z}{z - 1}$$

$$F_R(z) = \frac{0.47 K_I z}{z^2 + (0.47 K_I - 1.43)z + 0.43}$$

$$P_M(z) = z^2 + (0.47 K_I - 1.43)z + 0.43$$

$$P_D(z) = P_M(z)$$

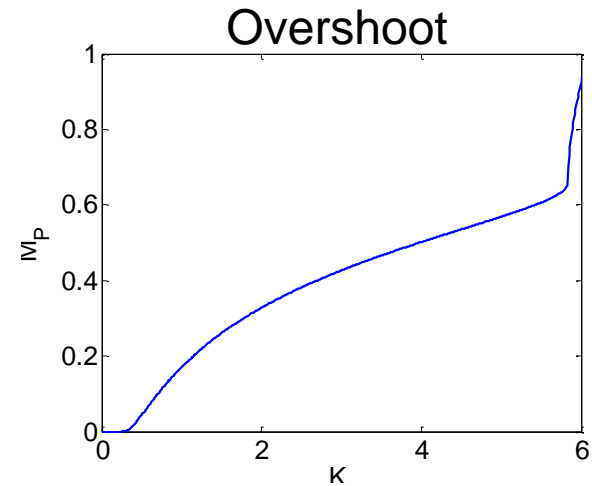
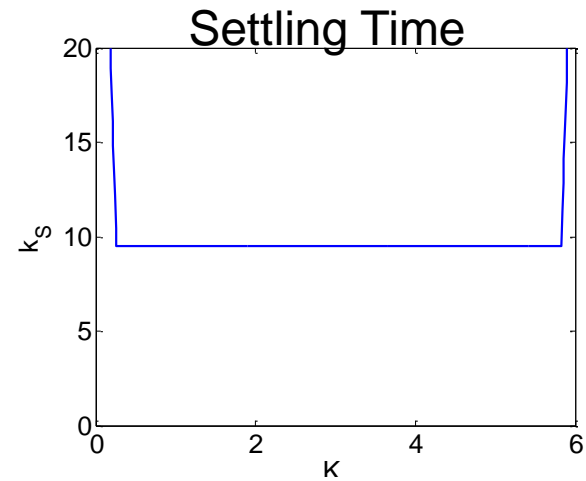
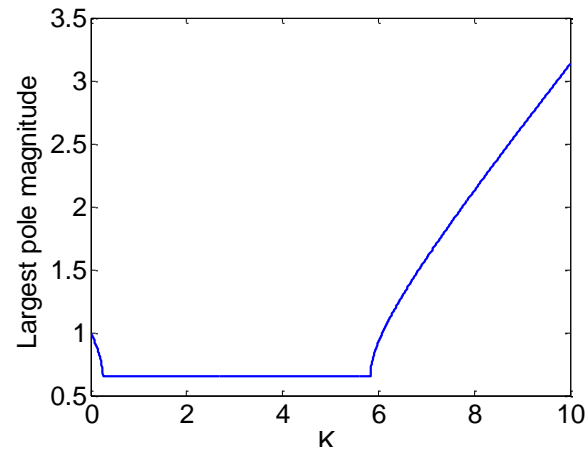
$$r^2 = 0.43$$

$$-2r \cos \theta = (0.47 K_I - 1.43)$$

PI control allows selecting settling time and overshoot

- Assume COMPLEX poles \Rightarrow *Cannot* choose k_s .
- Can repeat analysis for REAL poles.
- K_I only affects M_P .

Effect of K_f on system dynamics



Empirical Design: CHR Heuristic

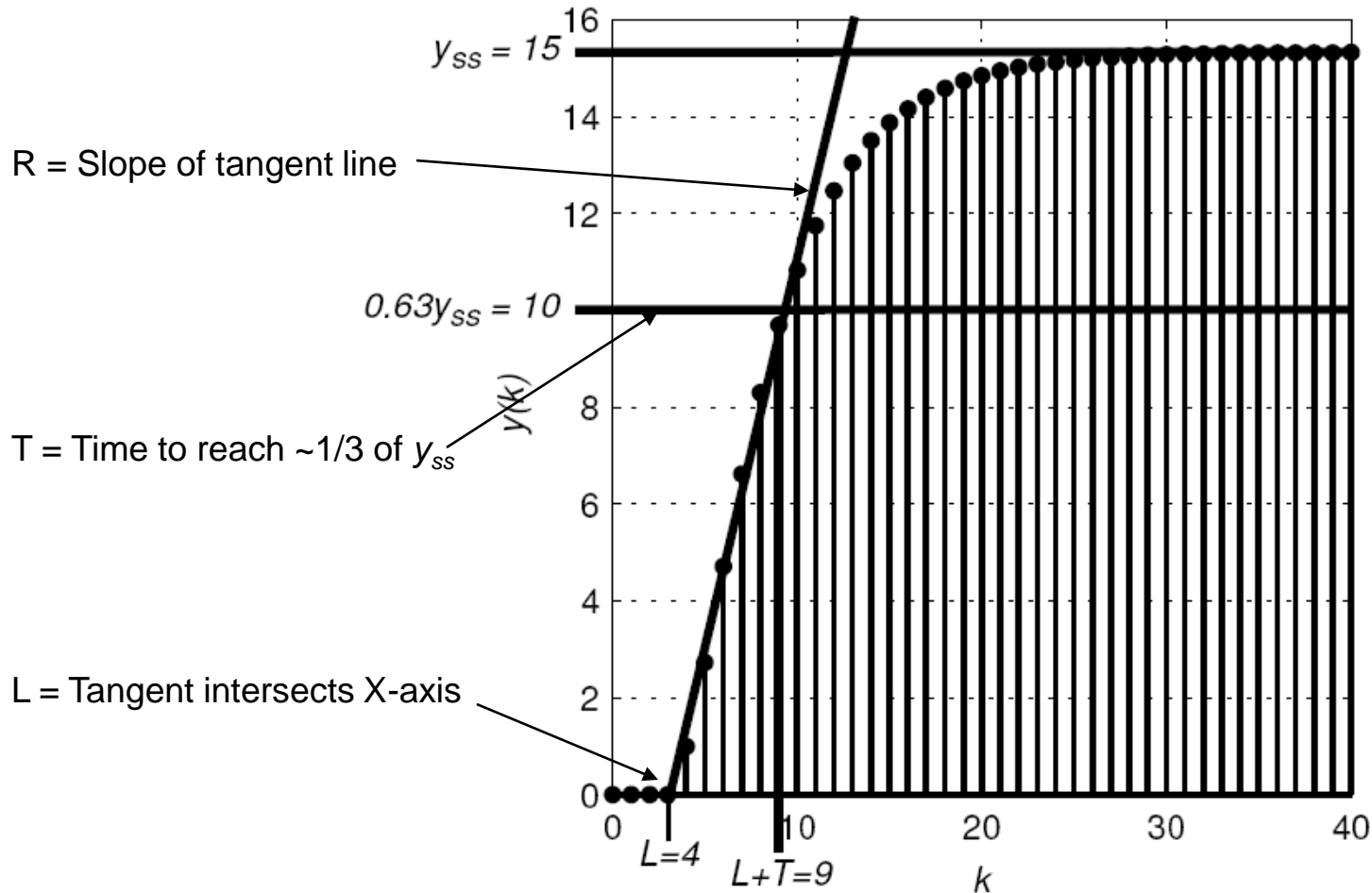
- Empirical Design Techniques

- ❖ CHR

- Bump-test for system ID
 - Approximate high-order system by combination of:
 - Pure delay
 - First-order system
 - Choose K_P , K_I based on test results

CHR: Bump Test

Step 1: Identify Parameters L, T, R



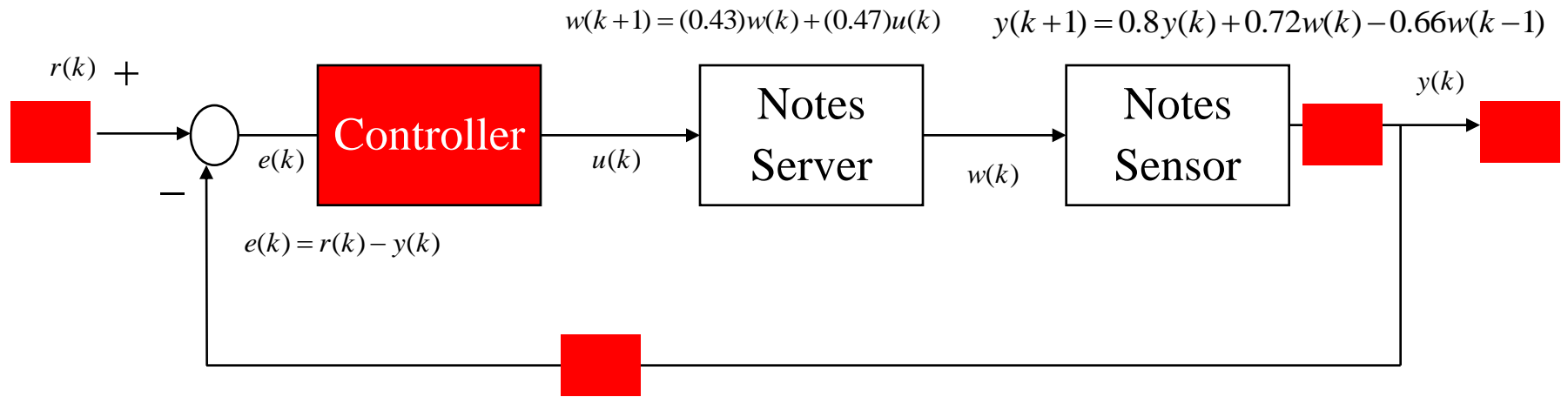
CHR: Design Rules

Design goal	Overshoot specification	Controller Gains	
		K_P	K_I
Disturbance rejection	0%	$\frac{0.6}{RL}$	$\frac{0.15}{RL^2}$
Disturbance rejection	20%	$\frac{0.7}{RL}$	$\frac{0.3}{RL^2}$
Reference tracking	0%	$\frac{0.35}{RL}$	$\frac{0.3}{RLT}$
Reference tracking	20%	$\frac{0.6}{RL}$	$\frac{0.6}{RLT}$

Lab:

Control System Analysis

Motivating Example



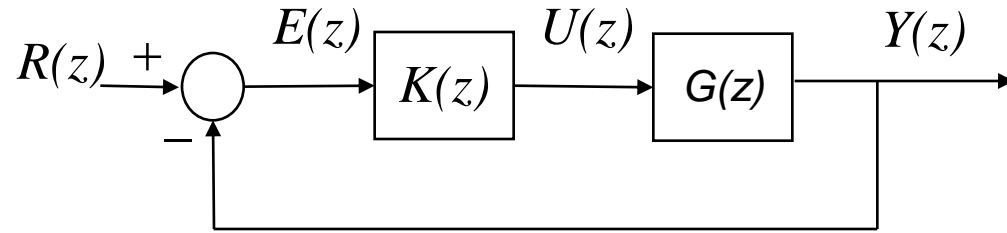
The problem

Design a control system that is stable, accurate, settles quickly, and has small overshoot.

Take a holistic approach

Design a control system, not just a controller

Basic Controllers



Proportional (P) Control

$$u(k) = K_P e(k)$$

$$K(z) = \frac{U(z)}{E(z)} = K_P$$

Integral (I) Control

$$u(k+1) = u(k) + K_I e(k+1)$$

$$zU(z) = U(z) + K_I zE(z)$$

$$K(z) = K_I \frac{z}{z-1}$$

K_P and K_I are called **control gains**.

Summary of Lab 2: P vs. I Control

Proportional (P) Control

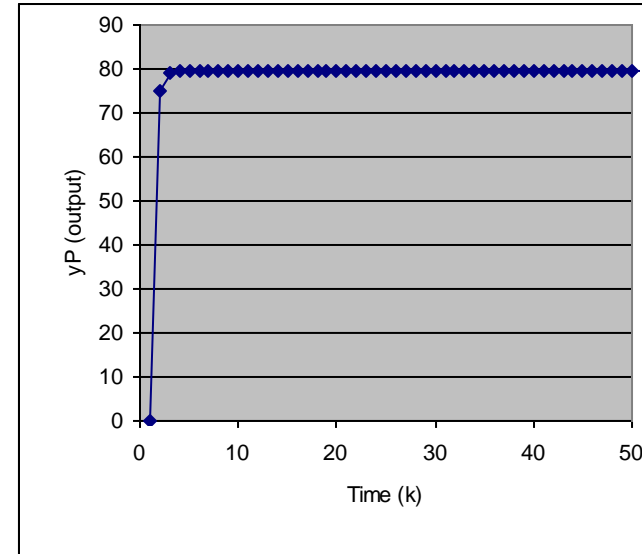
$$K(z) = K_P$$

$$eP(k) = r(k) - yP(k)$$

$$uP(k) = K_P * eP(k)$$

$$yP(k+1) = y_coef(1) * yP(k) + y_coef(2) * uP(k)$$

k	r(k)	eP(k)	uP(k)	yP(k)	KP
0	200	200	160	0	0.8
1	200	124.8	99.84	75.2	



Integral (I) Control

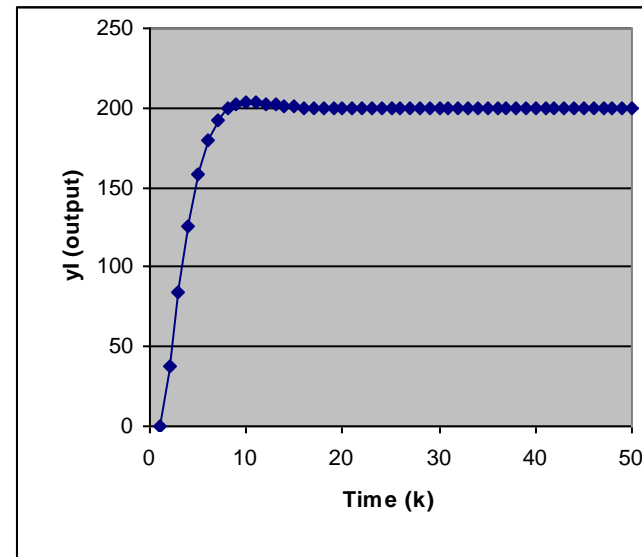
$$K(z) = \frac{K_I z}{z - 1}$$

$$eI(k) = r(k) - yI(k)$$

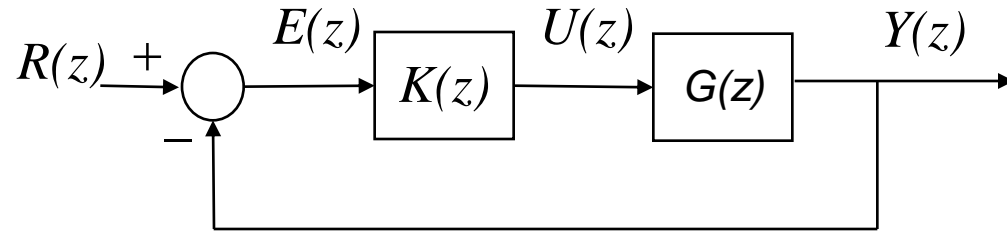
$$uI(k) = uI(k-1) + K_I * eI(k)$$

$$yI(k+1) = y_coef(1) * yI(k) + y_coef(2) * uI(k)$$

eI(k)	uI(k)	yI(k)	KI
200	80	0	0.4
162.4	144.96	37.6	



Analysis



$$F_R(z) = \frac{Y(z)}{R(z)} = \frac{K(z)G(z)}{1 + K(z)G(z)}$$

$$F_R^P(z) = \frac{Y(z)}{R(z)} = \frac{K_P \frac{0.47}{z-0.43}}{1 + K_P \frac{0.47}{z-0.43}} = \frac{K_P}{z-0.43+0.47K_P}$$

$$p_P = 0.43 - 0.47K_P$$

$$F_R^I(z) = \frac{Y(z)}{R(z)} = \frac{K_I \frac{z}{z-1} \frac{0.47}{z-0.43}}{1 + K_I \frac{z}{z-1} \frac{0.47}{z-0.43}}$$

$$= \frac{0.47K_I z}{(z-1)(z-0.43) + 0.47K_I z}$$

$$= \frac{0.47K_I z}{z^2 + (0.47K_I - 1.43)z + 0.43}$$

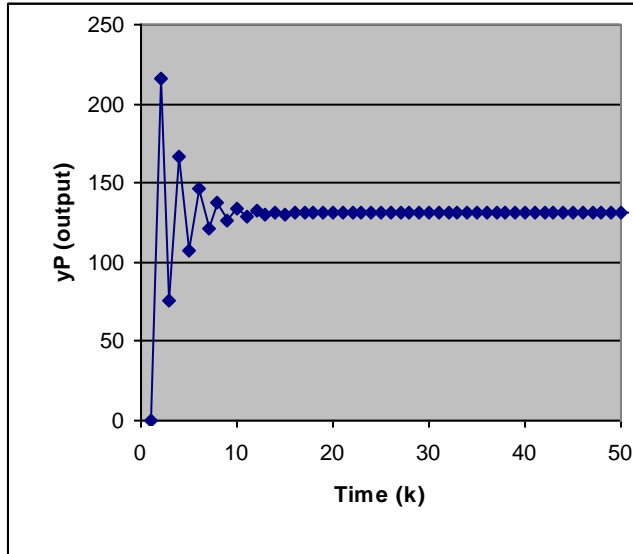
$$p_I = \frac{1.43 - 0.47K_I \pm \sqrt{(0.47K_I - 1.43)^2 - 1.72}}{2}$$

Settling Times, Steady State Gains

Ctrl Gain	P	I
0.1	5, 0.076	43, 1
0.4	3, 0.25	10, 1
3.0	198, 0.71	10, 1

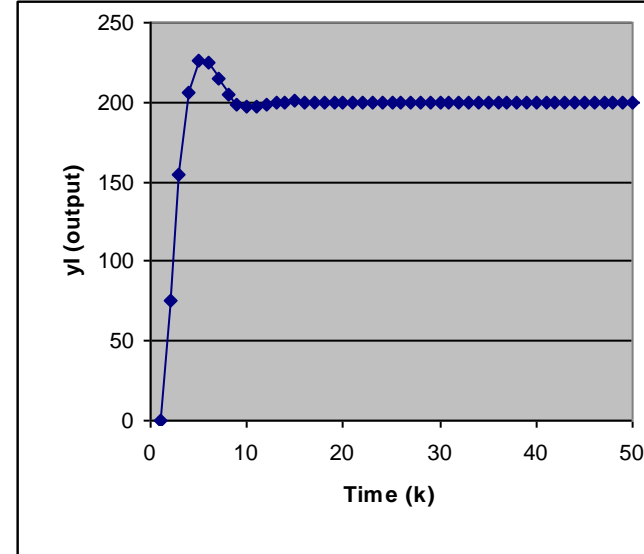
Conclusions from P vs. I Comparison

$K_P=2.3$



$r(k)=200$

$K_I=0.8$



Conclusions:

P is fast

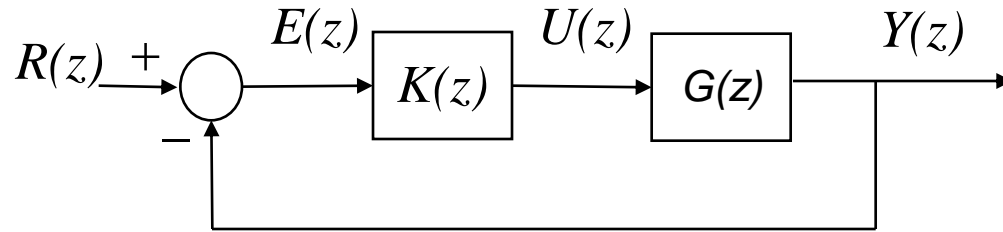
I is accurate and has less overshoot.

Design challenge:

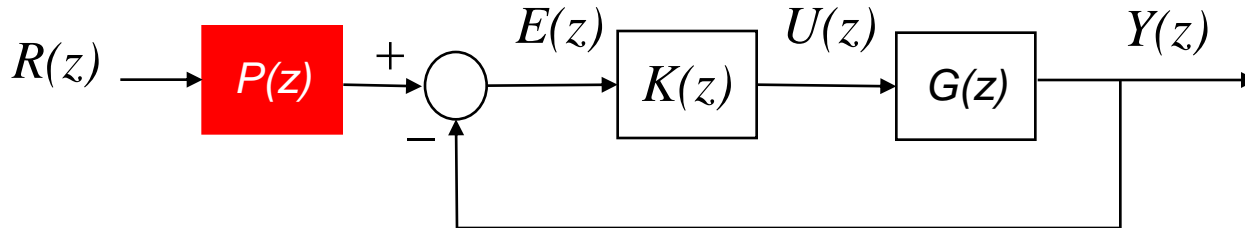
Make P accurate.

Reduce P's overshoot.

Making P Control Accurate



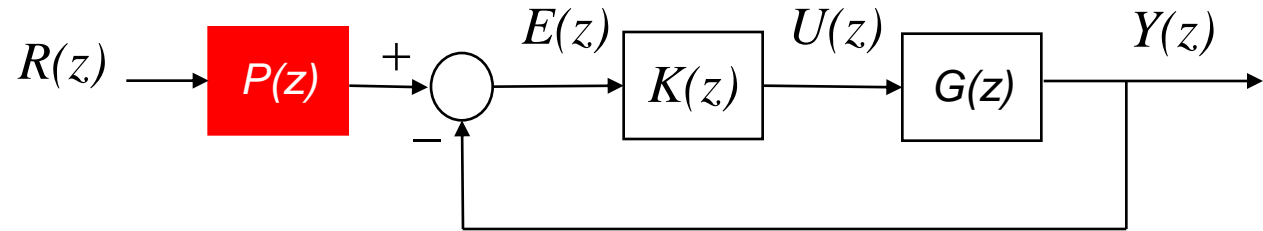
Precompensation: Adjusts the reference input so that the right output is obtained.



Lab 4: Precompensation

- Modify P control to include pre-compensation
- Find a value for the precompensator that makes P control accurate
 - ❖ Trial and error
 - ❖ Adjust based on ratio between reference and output
- What happens if the reference input changes? What if the control gain changes?
- What is the general rule for the value of the precompensator?

Computing Value of Precompensator



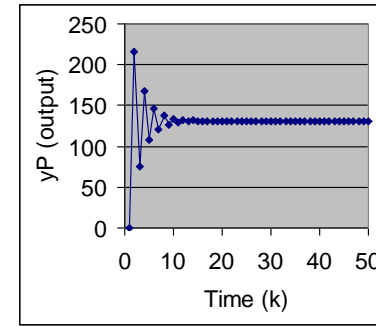
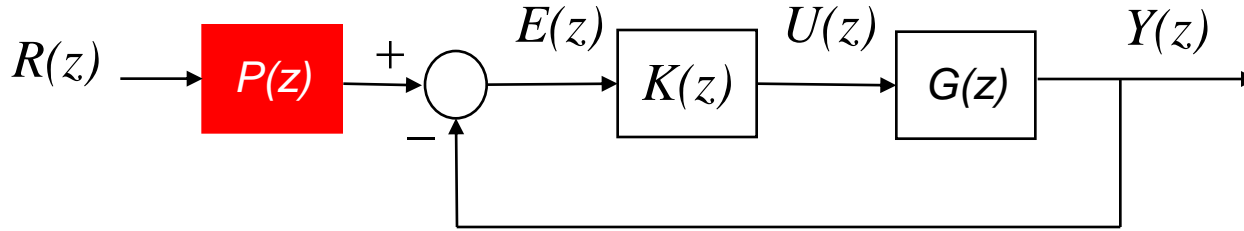
Want $R(1)P(1)F_R(1) = R(1)$

$$\text{So } P(1) = \frac{1}{F_R(1)} = \frac{1 - 0.43 + 0.47K_P}{0.47K_P}$$

Consider $K_P = 2.3$, $R(z) = 200$; then $P(z) = 1.53$

Try on spreadsheet. See if it works for other reference inputs.

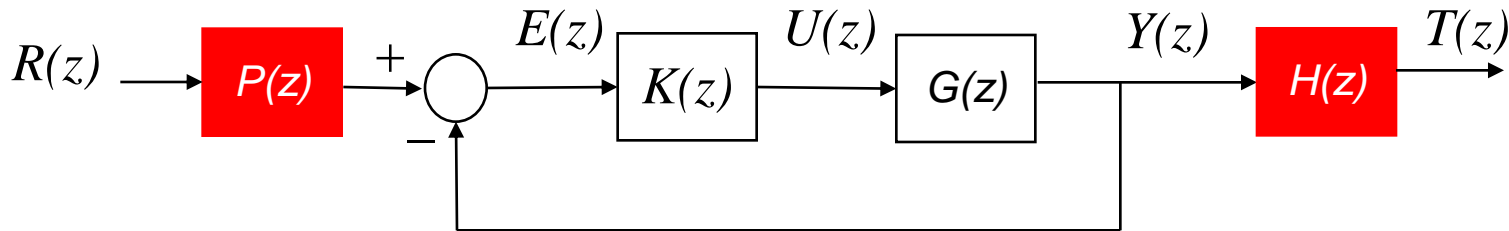
Reducing P's Overshoot



Filter. Smooths values over time.

c – Weight past history (make it smoother)

$$t(k+1) = ct(k) + y(k+1)$$

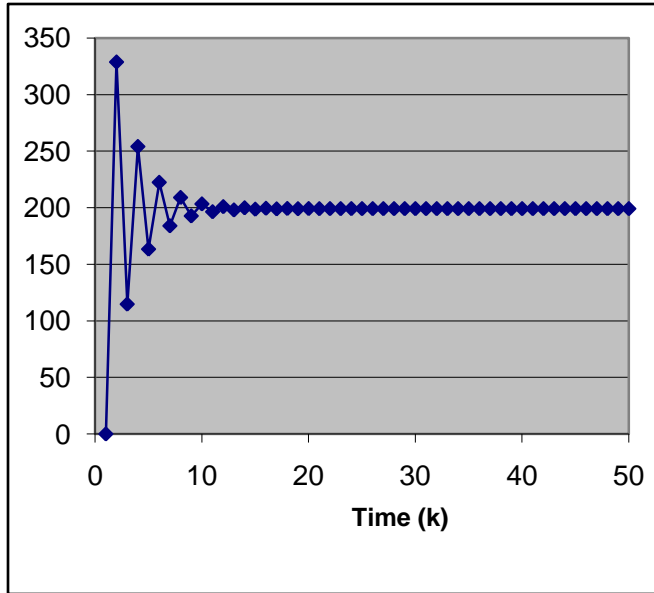


Lab 5: Precompensation + Filter

- Add a filter to precompensated P control
- What values of c produce smooth $t(k)$?
- What are the other effects of the filter?

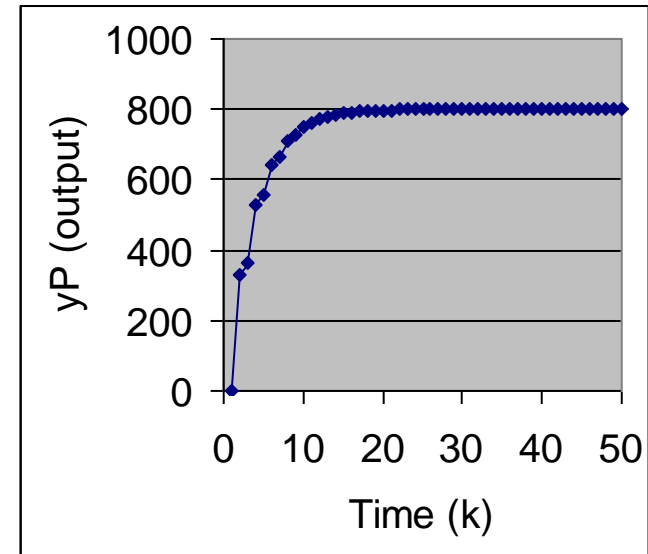
Results of Filter Design

w/o filter



$$r(k)=200$$

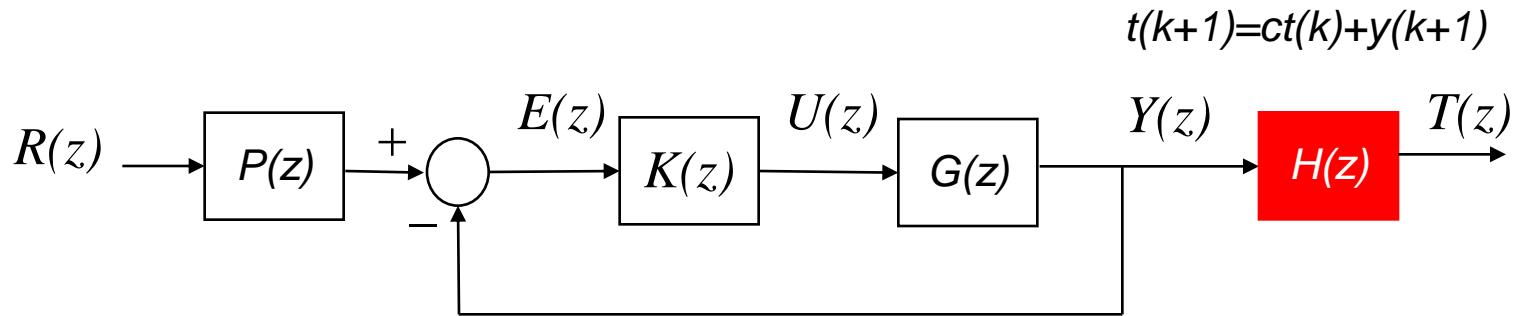
with filter: $c = 0.75$



The good news about the filter: Can eliminate overshoot
The bad news: Inaccurate and slower.

Why inaccurate?

Analysis of the Filter



Analysis 1: Why does $H(z)$ cause the system to be inaccurate?

Want $P(1)F_R(1)H(1) = 1$

We have designed $P(z)$ so that $P(1)F_R(1) = 1$. So, it must be that $H(1) \neq 1$.

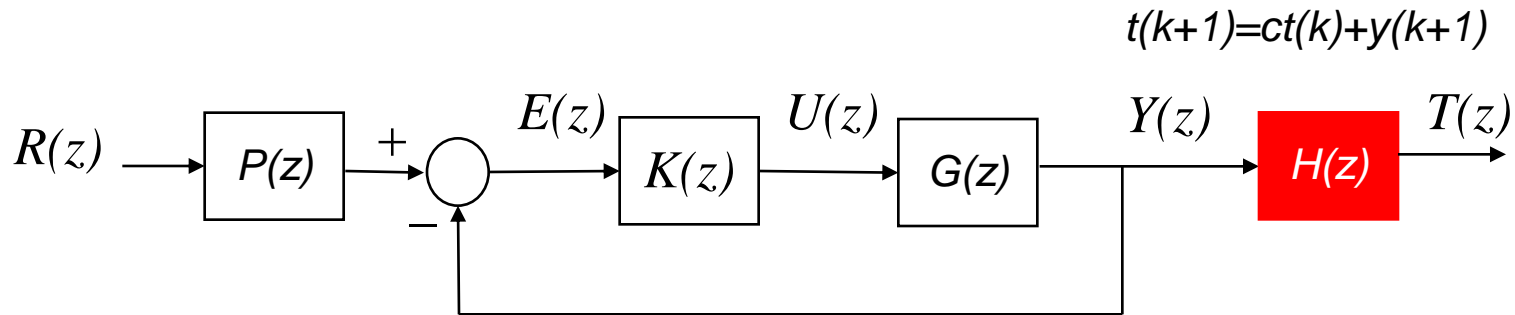
$$t(k+1) = ct(k) + y(k+1)$$

$$zT(z) = cT(z) + zY(z)$$

$$H(z) = \frac{T(z)}{Y(z)} = \frac{z}{z-c}$$

$$H(1) = \frac{1}{1-c}$$

Designing a Normalized Filter



Want $H(1) = 1$

Can do this by dividing by multiplying by $1 - c$.

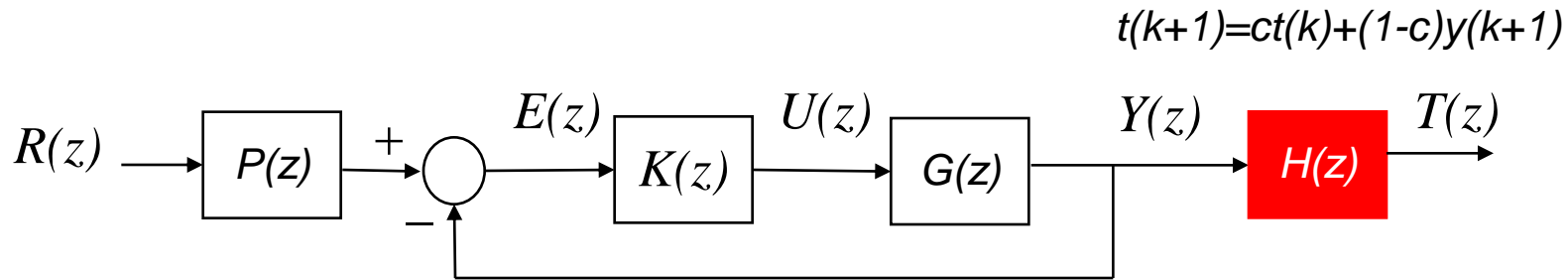
That is, use $H(z) = \frac{z(1-c)}{z-c}$

Check the spreadsheet: Lab 6.

Converting this into a time series model, we have

$t(k+1) = ct(k) + (1-c)y(k+1)$

Analysis of the Filter



Analysis 2: Why does $H(z)$ cause the system to be slower?

What are the poles of $P(z)F_R(z)H(z)$?

Let $p = \max_{poles} \{P(z), F_R(z), H(z)\}$

$P(z)$ has no poles

So, the filter adds a closed loop pole at c .

$$F_R(z) = \frac{0.47K_P}{z - 0.43 + 0.47K_P}$$

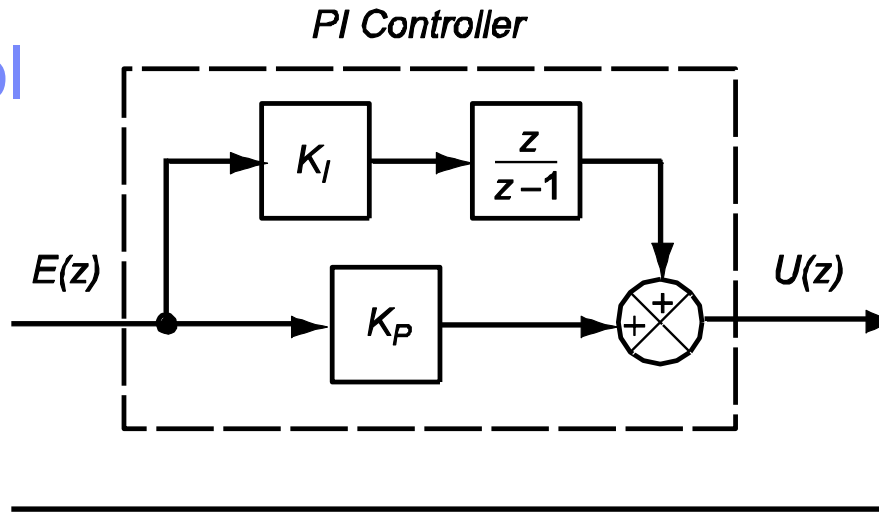
$$\text{If } K_P = 2.3, F_R(z) = \frac{1.1}{z - 0.65}$$

$$H(z) = \frac{T(z)}{Y(z)} = \frac{1-c}{z-c}$$

Check the spreadsheet.

If $c = 0.75$, then there is a pole at 0.75.

PI Control



$$u(k) = u_p(k) + u_I(k)$$

$$K(z) = \frac{U(z)}{E(z)} = K_P(z) + K_I(z)$$

$$= K_P + \frac{K_I z}{z-1}$$

$$= \frac{(K_P + K_I)z - K_P}{z-1}$$

$$u(k) = u(k-1) + (K_P + K_I)e(k) - K_P e(k-1)$$

Lab 7: PI Control