

# 6.3100: Dynamic System Modeling and Control Design

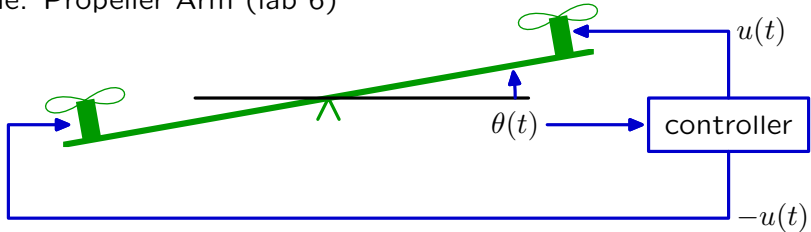
## Noise Performance

*December 02, 2024*

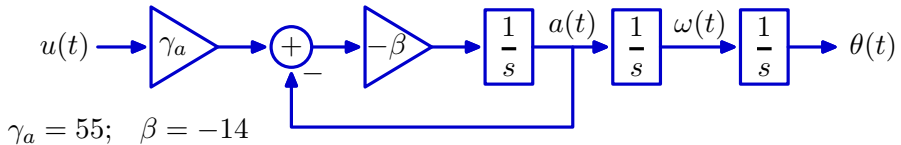
# Noise Performance of Feedback Controllers

Today's goal: Analyze effects of **noise** on feedback controllers.

Example: Propeller Arm (lab 6)



Model of Plant (transfer function):



State-Space Model:

$$\frac{d}{dt} \begin{bmatrix} \theta \\ \omega \\ a \end{bmatrix} = \underbrace{\begin{bmatrix} 0 & 1 & 0 \\ 0 & 0 & 1 \\ 0 & 0 & \beta \end{bmatrix}}_{\mathbf{A}} \begin{bmatrix} \theta \\ \omega \\ a \end{bmatrix} + \underbrace{\begin{bmatrix} 0 \\ 0 \\ -\beta\gamma_a \end{bmatrix}}_{\mathbf{B}} u(t); \quad y(t) = \underbrace{[1 \quad 0 \quad 0]}_{\mathbf{C}} \begin{bmatrix} \theta \\ \omega \\ a \end{bmatrix}$$

## Performance of Feedback Controllers

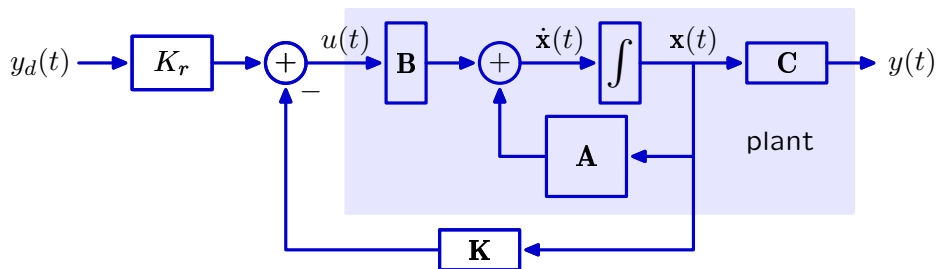
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Example: Propeller Arm (lab 6)

State-Space Model:

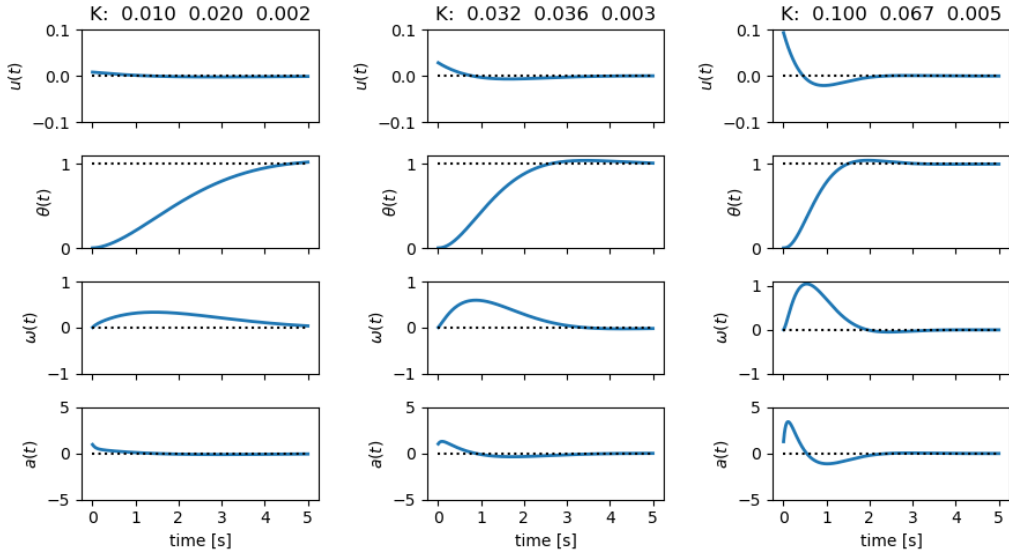
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State-Space model with Full-State Feedback Controller



# Performance of Feedback Controllers

Increasing gains  $\mathbf{K}$  can speed convergence. ✓



Unfortunately, high gains can also have detrimental effects. High gains can decrease stability (as we saw with root locus and gain/phase margins). ✗

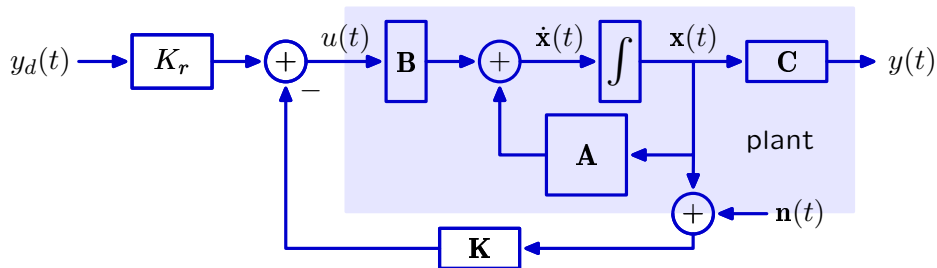
## Noise Performance

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High gains can also increase sensitivity to noise.

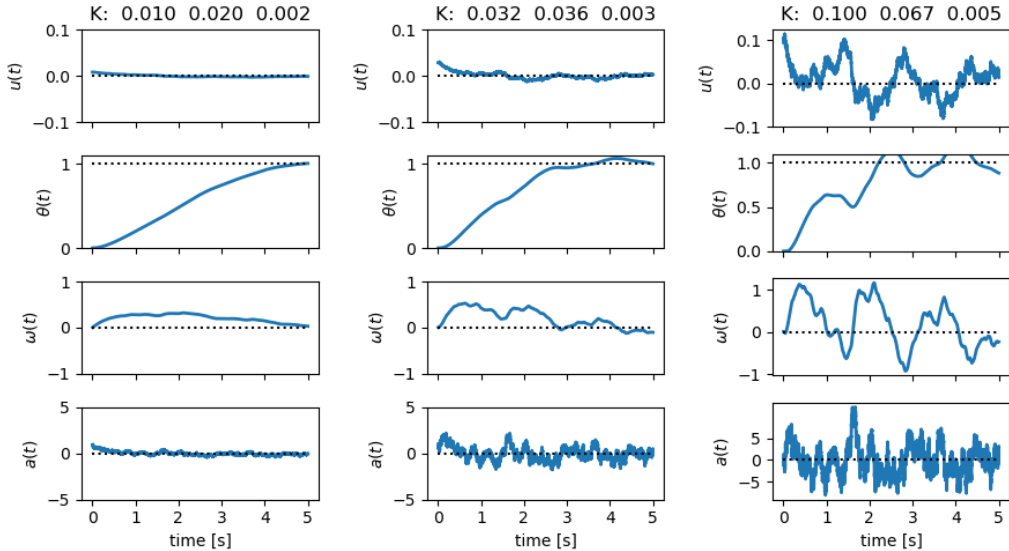
Today we will analyze effects of **noise** on feedback systems.

There are many possible sources of noise. Start with **sensor noise**, where the state  $\mathbf{x}(t)$  reported to the controller differs from that seen in the plant.



## Noise Performance

Increasing gains  $\mathbf{K}$  speeds convergence but also increases noise sensitivity. Columns show results for same sensor noise but increasing values of  $\mathbf{K}$ .



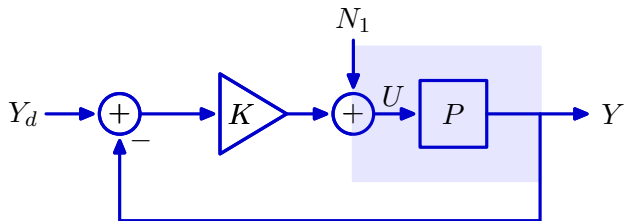
Same sensor noise generates more output noise at high gains than at low.

## Noise Analysis

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Consider a simpler example to understand effects of noise.

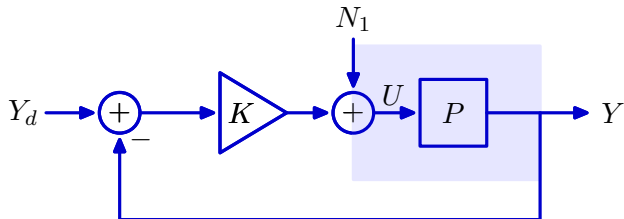
constant system ( $P$ ) + proportional control  $K$  + noise  $N_1$  at input to plant.



## Check Yourself

For the feedback system shown below, let

$$H_Y = \frac{Y}{Y_d} \text{ when } N_1 = 0 \text{ and } H_N = \frac{Y}{N_1} \text{ when } Y_d = 0$$



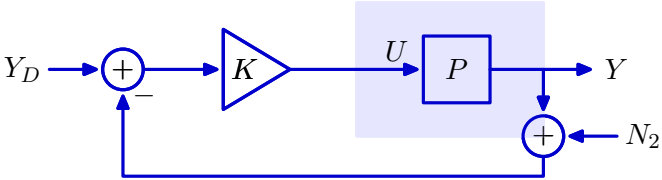
Which (if any) of the following are true?

- $\lim_{K \rightarrow \infty} H_Y = 1$
- $\lim_{K \rightarrow \infty} H_N = 0$
- $\lim_{K \rightarrow \infty} \frac{H_N}{H_Y} = 0$
- $\frac{H_N}{H_Y} = \frac{1}{K}$
- none of the above



# Noise Analysis

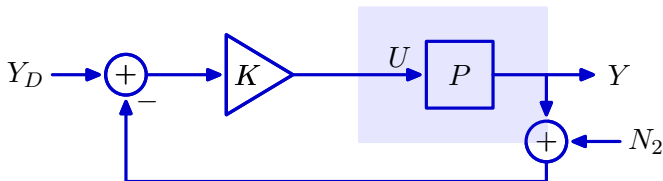
Consider a similar system with noise  $N_2$  at its output.



## Check Yourself

For the feedback system shown below, let

$$H_Y = \frac{Y}{Y_d} \text{ when } N_2 = 0 \text{ and } H_N = \frac{Y}{N_2} \text{ when } Y_d = 0$$

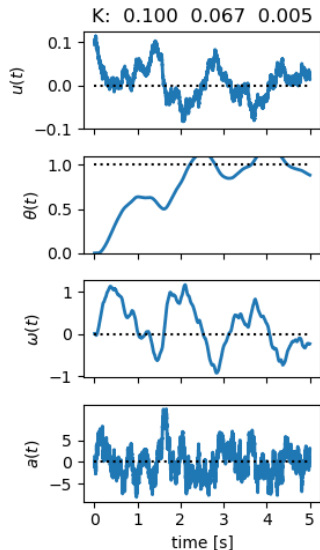
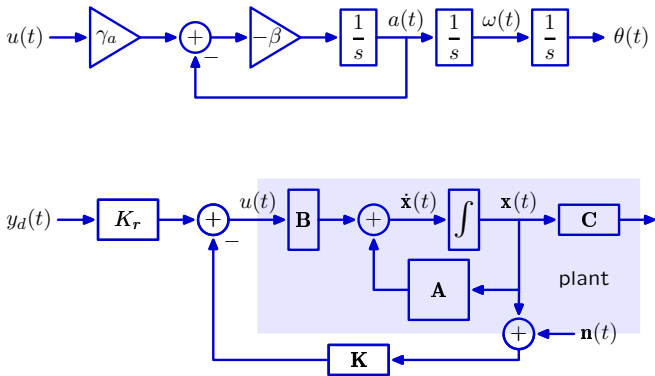


Which (if any) of the following are true?

- $\lim_{K \rightarrow \infty} H_Y = 1$
- $\lim_{K \rightarrow \infty} H_N = 0$
- $\lim_{K \rightarrow \infty} \frac{H_N}{H_Y} = 0$
- $\frac{H_N}{H_Y} = \frac{1}{K}$
- none of the above

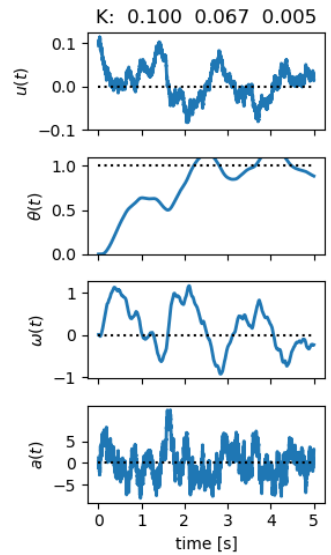
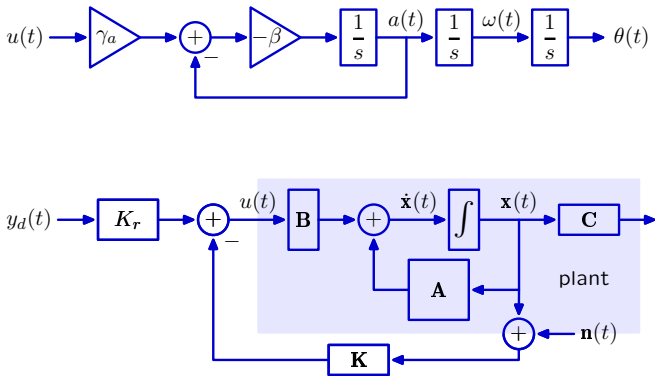
# Sensor Noise in Propeller Arm System

Why do the noises in  $u(t)$ ,  $\theta(t)$ ,  $\omega(t)$ , and  $a(t)$  look different?



# Sensor Noise in Propeller Arm System

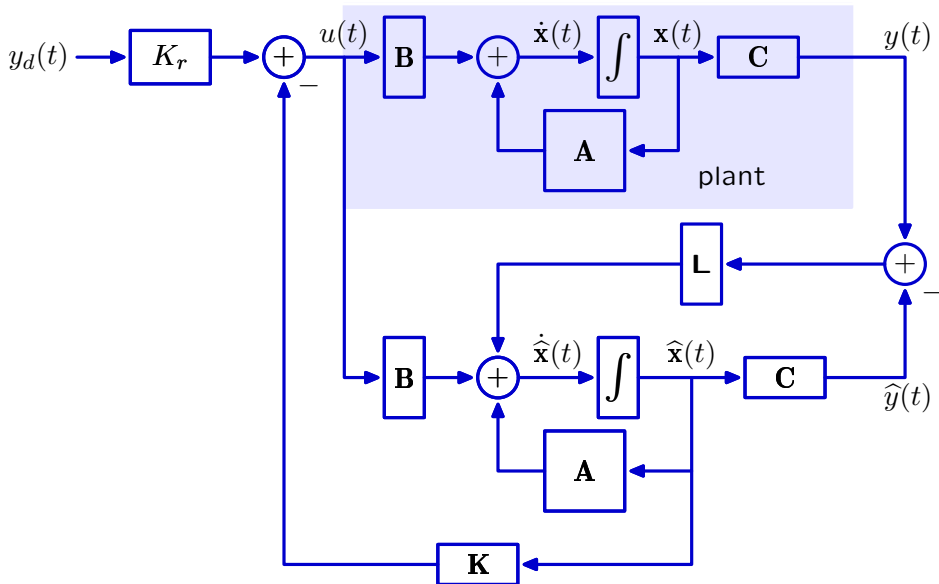
Why does the noise in  $u(t)$ ,  $\theta(t)$ ,  $\omega(t)$ , and  $a(t)$  look different?



Sensor noise flows through feedback pathways to degrade the state of the plant in ways that can be understood in terms of the structure of the plant.

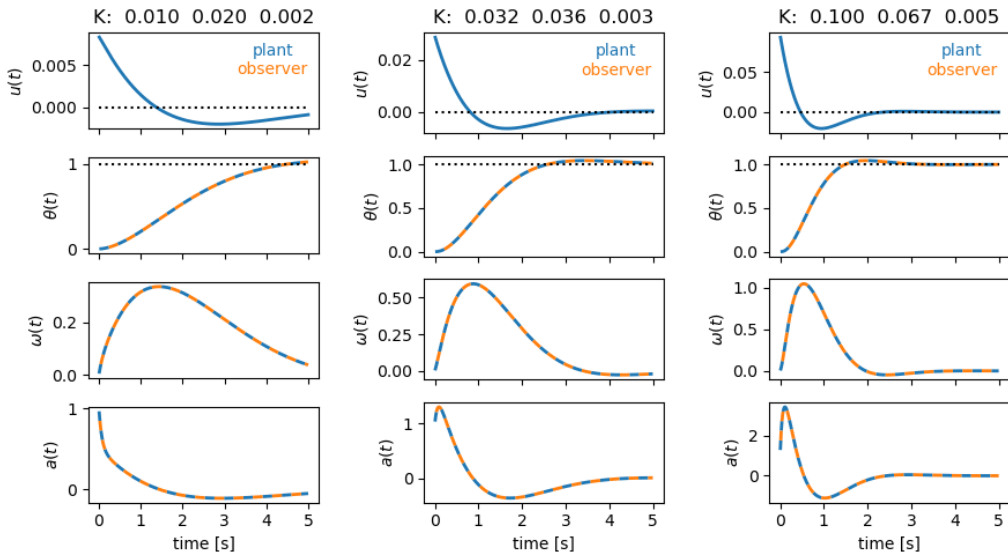
## Analysis of Noise in an Observer

How should we model noise in controllers with an observer?



## Results Without Noise

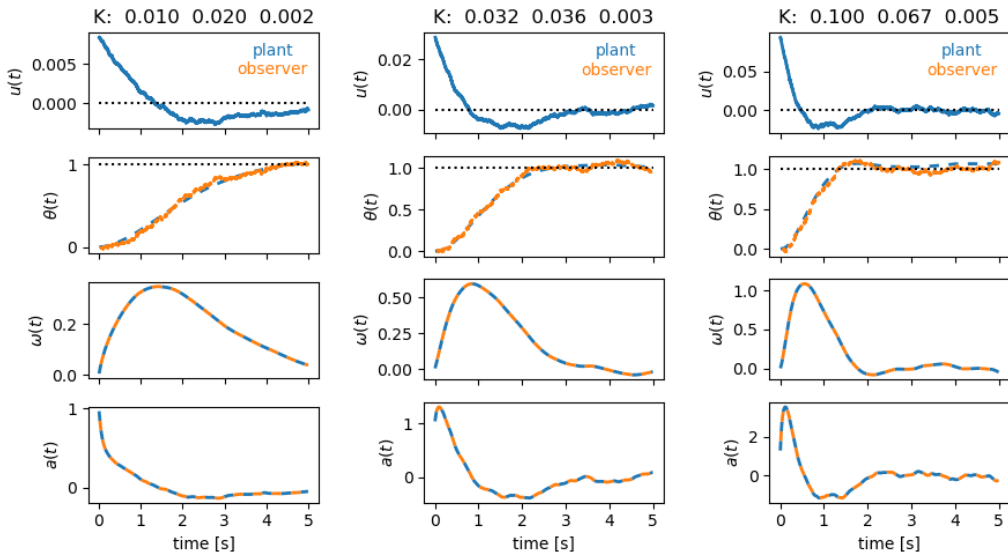
No noise: low gain (left), higher gain (center), and highest gain (right).



When there is no noise, responses of the plant and observer match and higher gains  $\mathbf{K}$  speed convergence.

## Results With Noise: Observer/Plant Responses Overlaid

With noise: low gain (left), higher gain (center), and highest gain (right).

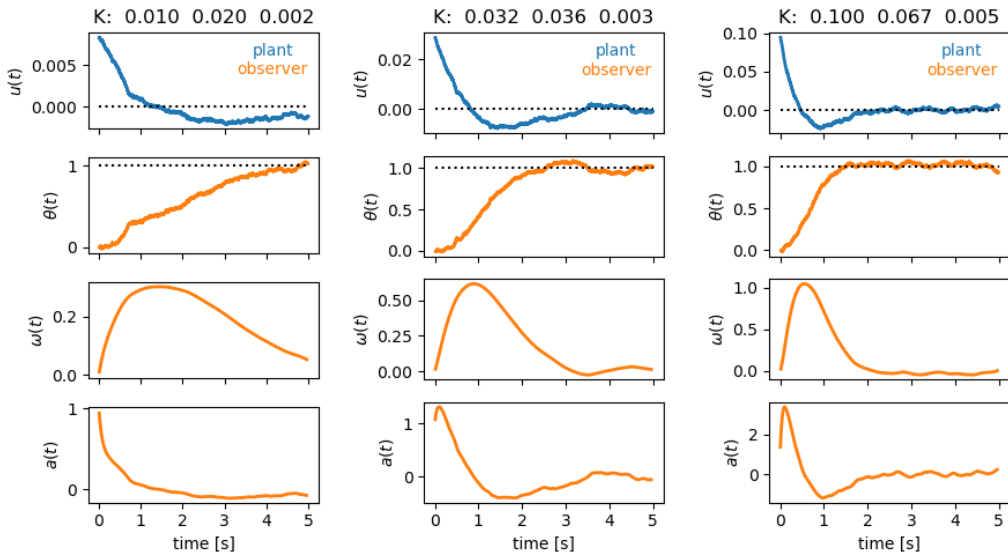


Noise affects the plant and observer differently.

But the curves are difficult to separate. Look at them one-at-a-time.

## Results With Noise: Observer Responses

With noise: low gain (left), higher gain (center), and highest gain (right).



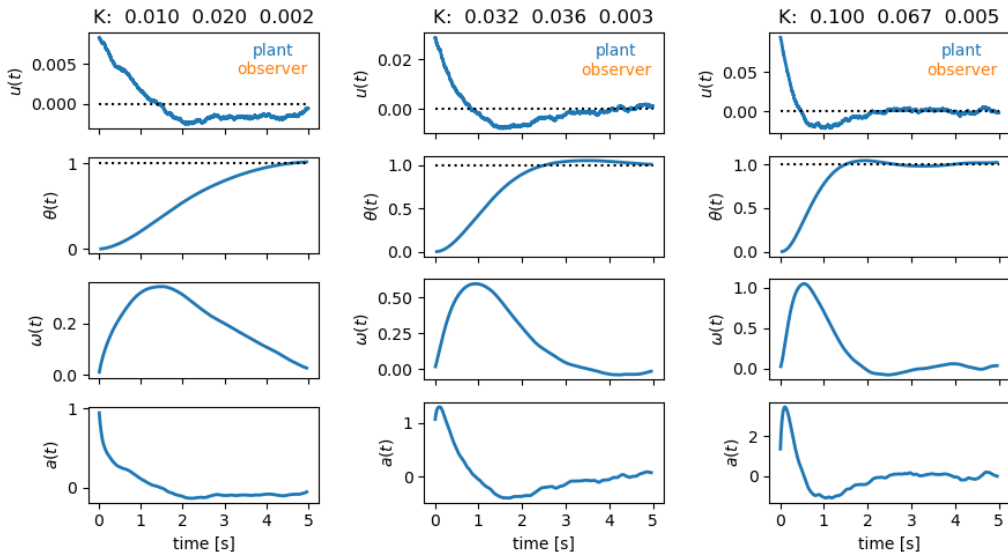
Results for the observer.

Significant noise in control signal  $u(t)$  and states  $x(t)$ .



## Results With Noise: Plant Responses

With noise: low gain (left), higher gain (center), and highest gain (right).

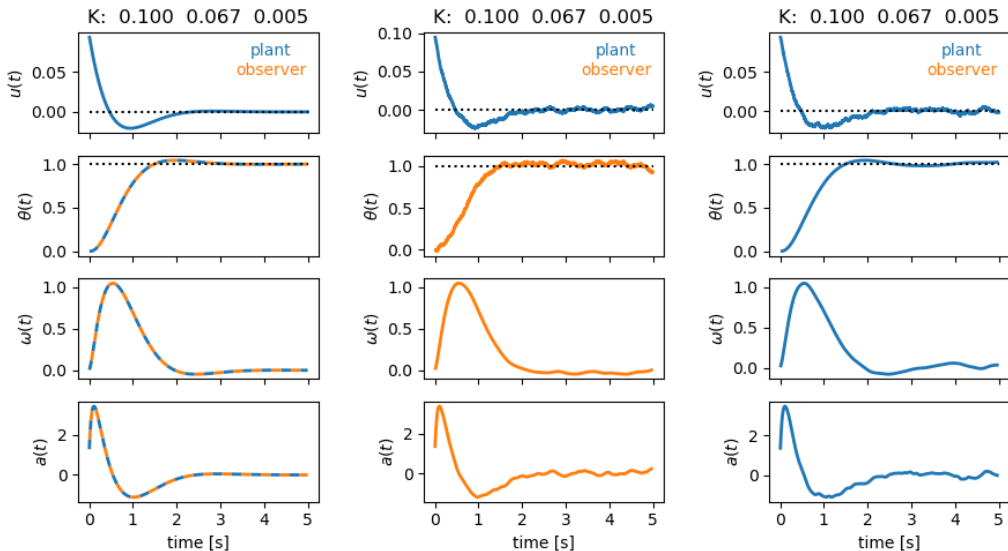


Results for the plant.

Significantly less noise in plant than in observer.

# High Gain: No Noise, Observer w/ Noise, and Plant w/ Noise

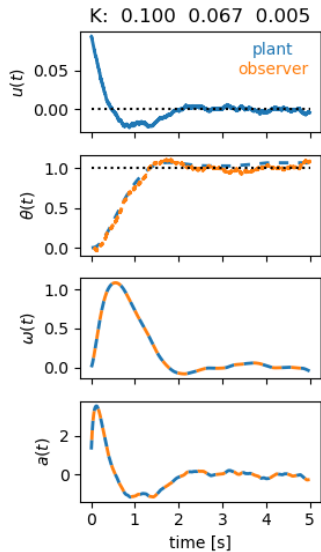
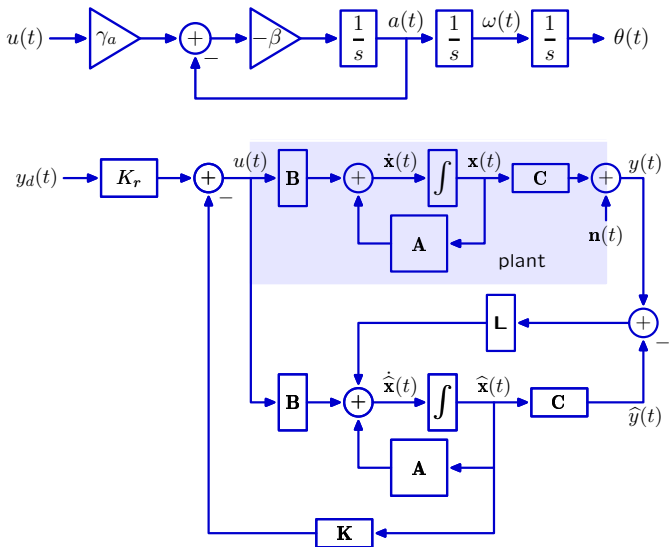
Noise affects plant and observer differently. Why?



Differences seem greater for  $\theta(t)$  than for  $\omega(t)$  or  $a(t)$ . Why?

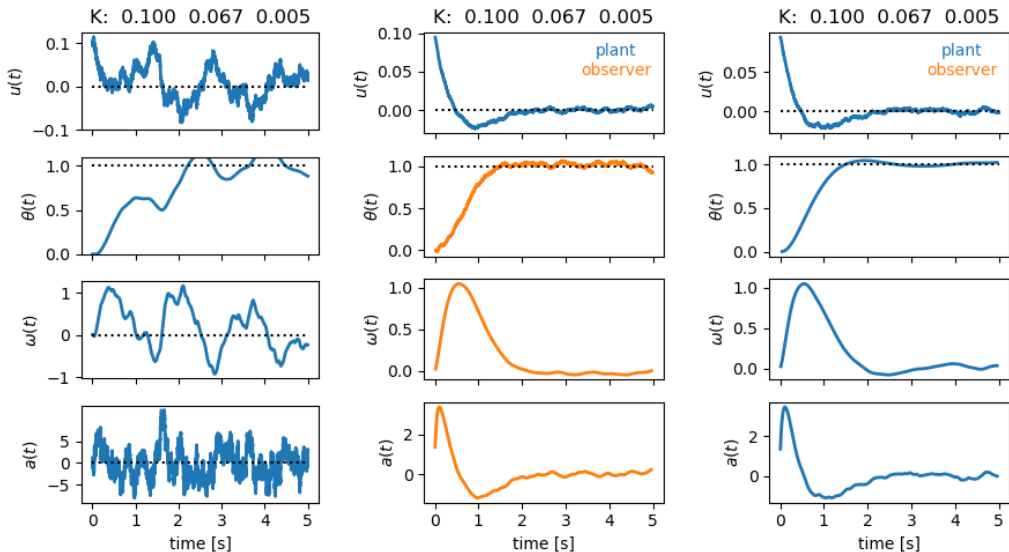
# Analysis of Noise in an Observer

Assess effects of noise by tracing signal flow through the block diagram.



# Compare

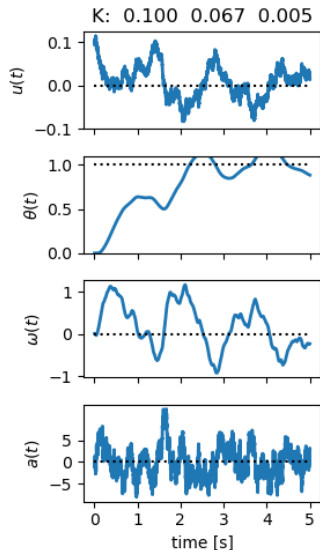
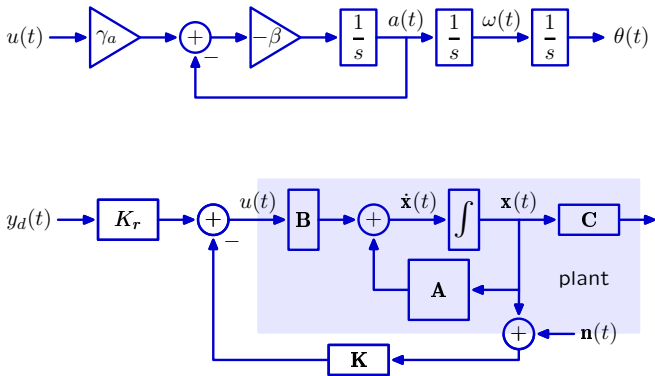
Effect of noise without observer (left) and with observer (middle and right).



Why is there so much less noise with the observer?

# Sensor Noise in Propeller Arm System

Why do the noises in  $u(t)$ ,  $\theta(t)$ ,  $\omega(t)$ , and  $a(t)$  look different?



## Summary

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Noise can be an important consideration in design of feedback controllers.

There are many sources of noise: e.g., noise at the plant's input and output.

Increasing gains can speed convergence but can increase noise sensitivity.

Using an observer can dramatically improve noise performance.