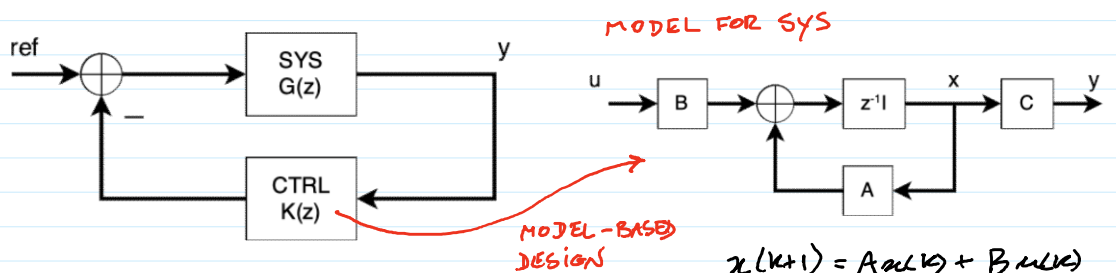


Part 2: Designing the feedback control system

Overview



Design methodologies for the controller

- Heuristic (PID...)
- Optimization-based (LQR, LQE, LQG...)

$$x(k+1) = Ax(k) + Bu(k)$$

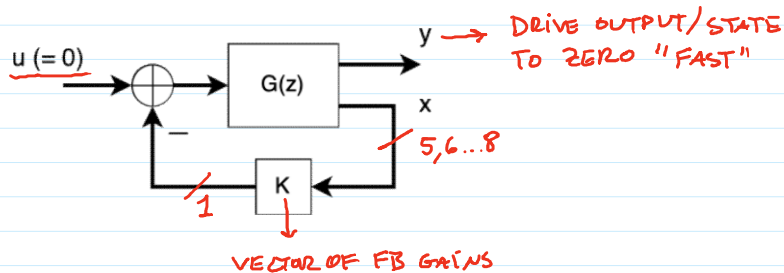
$$y(k) = Cx(k) + Du(k)$$

$= 0$

Designing the controller in 3 steps:

1. Design the regulator (LQR)
2. Design the observer (LQE)
3. Merge regulator and observer (LQG)

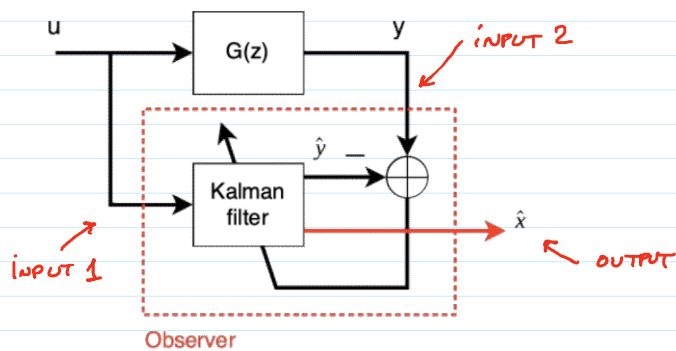
1. Design the regulator (Linear Quadratic Regulator)



$$[K, \dots, p] = \text{dlqr}(A, B, Q, R)$$

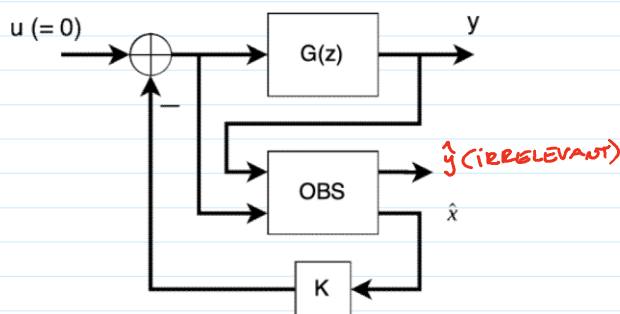
VECTOR OF FB GAINS \downarrow SS MODEL "TUNING KNOBS"
 CLOSED-LOOP POLES $\rightarrow \text{eig}(A - BK)$

2. Design the observer (Linear Quadratic Estimator)



$[M, \dots, q] = \text{dlqe}(A, B1, C, QE, RE)$
 VECTOR OF (INTERNAL) FEEDBACK GAINS
 RELEVANT PART OF SS MODEL
 "TUNING KNOBS"
 CLOSED-LOOP POLES $\rightarrow \text{EIG}(A - MCA)$

3. Merge regulator and observer (LQG)



CLOSED-LOOP DYNAMICS: $\text{EIG}(A - BK) \cup \text{EIG}(A - MCA)$
 REGULATOR POLES OBSERVER POLES

Bottom line: If regulator and estimator are good, merged system should be good as well

Setting the tuning knobs for steps 1 and 2

1. Controller/regulator (dlqr(A, B, Q, R))

$$\begin{aligned}
 x(k+1) &= Ax(k) + Bu(k) \\
 y(k) &= Cx(k) + Du(k)
 \end{aligned}$$

LQR COST FUNCTION

$$J(K) = \sum_{k=0}^{\infty} (x^T(k) Q x(k) + R u^2(k)) = \sum_{k=0}^{\infty} (y^2(k) + \frac{1}{\rho} u^2(k))$$

FB GAINS
 TIME
 "NORM" OF $x(k)$
 $Q = C^T C$
 $x^T(k) C^T C x(k) = y^2(k)$

Two limit cases for the tuning parameter R (or rho):

① $R \approx 0, P \rightarrow \infty$

Inexpensive control
"Nervous" controller
Closed-loop poles near asymptotic positions

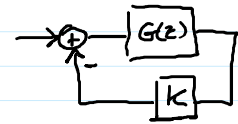
② $R \rightarrow \infty, P \rightarrow 0$

Expensive control
"Slow" controller
(Stable) poles near initial positions

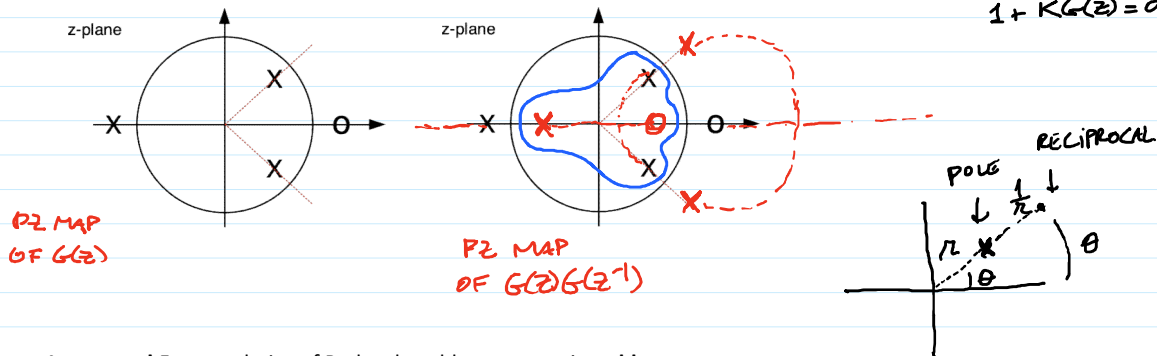
Symmetric Root Locus: A tool for analyzing closed-loop pole positions

- Closed-loop poles of the regulator are the **stable roots** of

$$1 + P G(z) G(z^{-1}) = 0$$



CL POLES: ROOTS OF
 $1 + K G(z) = 0$



Important! For any choice of R, the closed-loop system is **stable**

2. Observer ($dlqe(A, B1, C, QE, RE)$)

$$\begin{aligned} x(k+1) &= Ax(k) + Bu(k) + B_1 w(k) \rightarrow w(k) \text{ PROCESS NOISE } \text{COV}(w(k)) = Q_E \\ y(k) &= Cx(k) + n(k) \rightarrow n(k) \text{ MEASUREMENT NOISE } \text{COV}(n(k)) = R_E \end{aligned}$$

COST FUNCTION $H(M) = E \{ \|x(k) - \hat{x}(k)\|^2 \}$
 \downarrow
 FB GAINS OF OBSERVER

Choosing Q_E and R_E

① $Q_E = q_E I, B_1 = I, R_E = 1$ (DEMO CODE)

\rightarrow ② $B_1 = B \left(x(k+1) = Ax(k) + B \left(\underbrace{u(k) + w(k)}_{w(k) \text{ is "input noise"}} \right) \right), Q_E = 1, R_E = \frac{1}{P_E}$

With this choice of tuning knobs the closed-loop poles of the observer are given by the **same** Symmetric Root Locus of LQR

$$1 + P_E G(z) G(z^{-1}) = 0$$

Limiting behavior:

$P_E \rightarrow \infty$

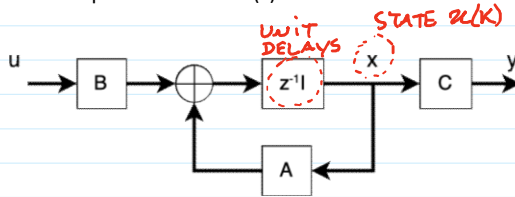
Reliable output y (v is small)
"Nervous" observer

$P_E \approx 0$

Noisy output
"Slow" observer

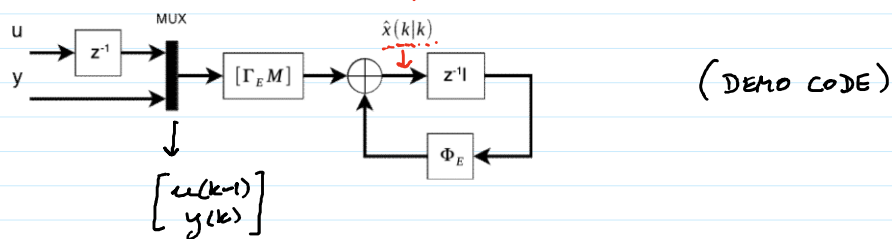
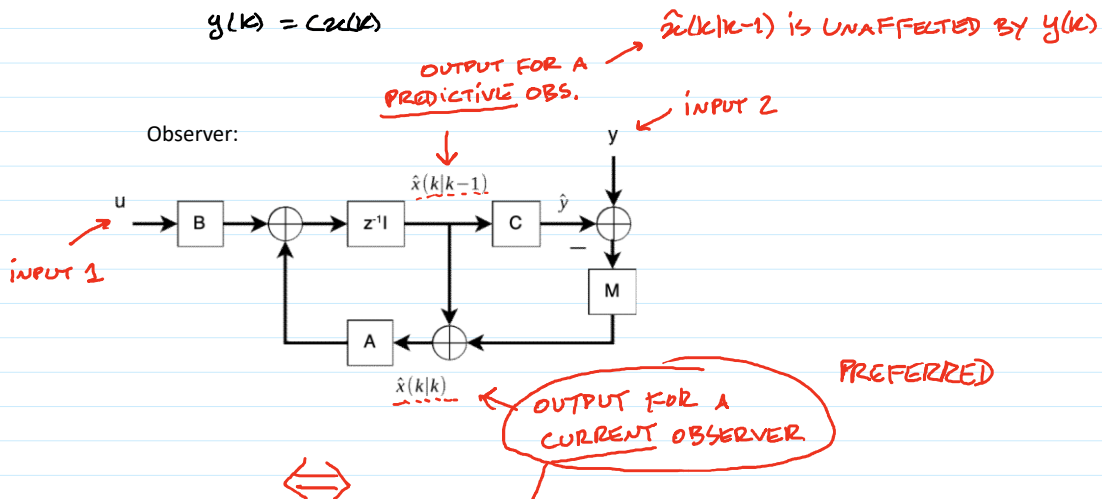
Observer architecture(s)

State-space model for $G(z)$:

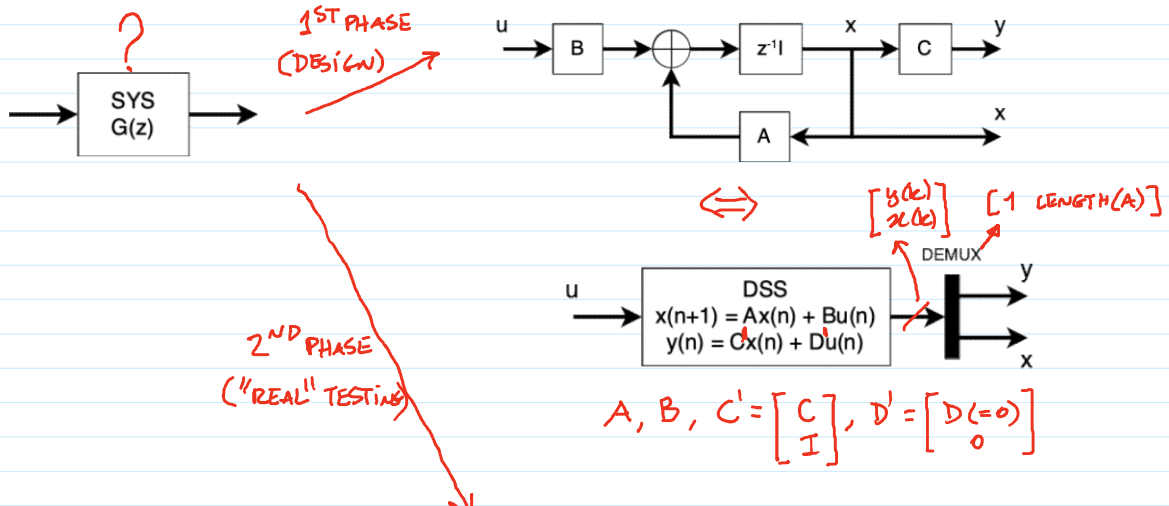


$$x(k+1) = Ax(k) + Bu(k)$$

$$y(k) = Cx(k)$$

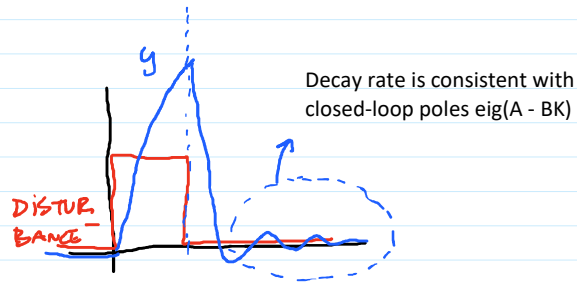
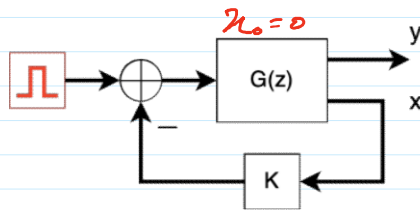


Designing and testing the control system in incremental steps:

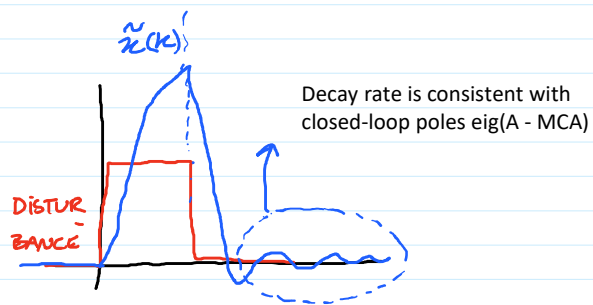
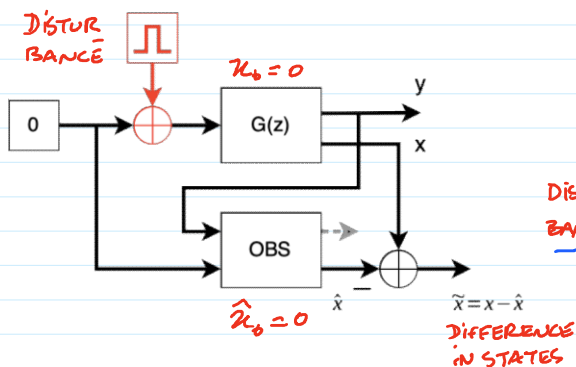




a. Design and validate the regulator



b. Design and validate the observer



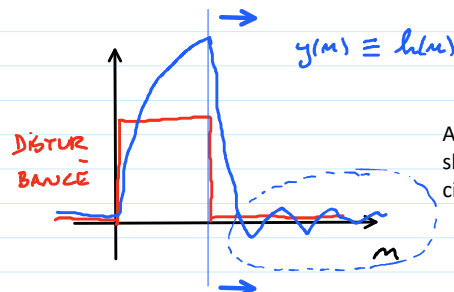
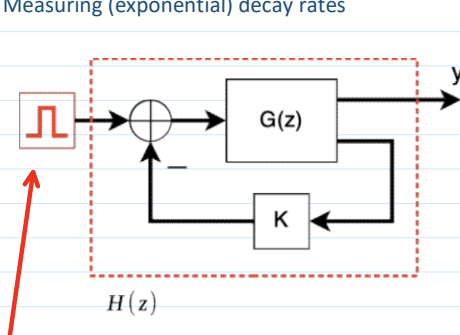
c. Merge and validate the full control system

- Check loop gain (ganho de malha), compare with the ideal one for LQR
- Check stability margins
- Check transient response

LQE is 2...10 x FASTER THAN LQR

- Add external input
- Test on "real" system
- Iterate

Measuring (exponential) decay rates

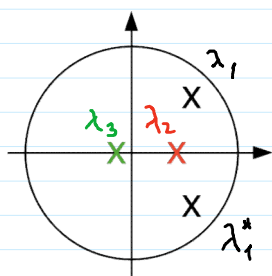


When the disturbance ends, we observe in y the impulse response h of the system

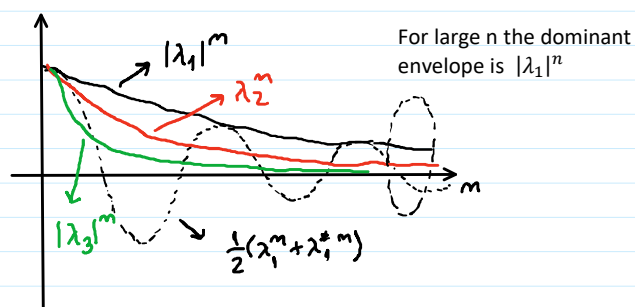
$$H(z), \text{ POLES } \{\lambda_i\} \leftrightarrow h(m) = \sum_i h_i \lambda_i^m$$

1. Let $h(n)$ be a real-valued sequence

pzmap of H



Contributions to $h(n)$



Use log scale

