

Joint lecture MTE 544 – SE 380

# The separation principle

Prof. Yue Hu (MME)  
Prof. Gennaro Notomista (ECE)

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# Logistics

4:30 – 5:15: Lecture

5:15 – 6:00: Live demo in E7 2nd floor event space with TurtleBot & Robomaster

# Overview of MTE544 - Autonomous Mobile Robots



Mobile robot modeling



Sensors



Localization

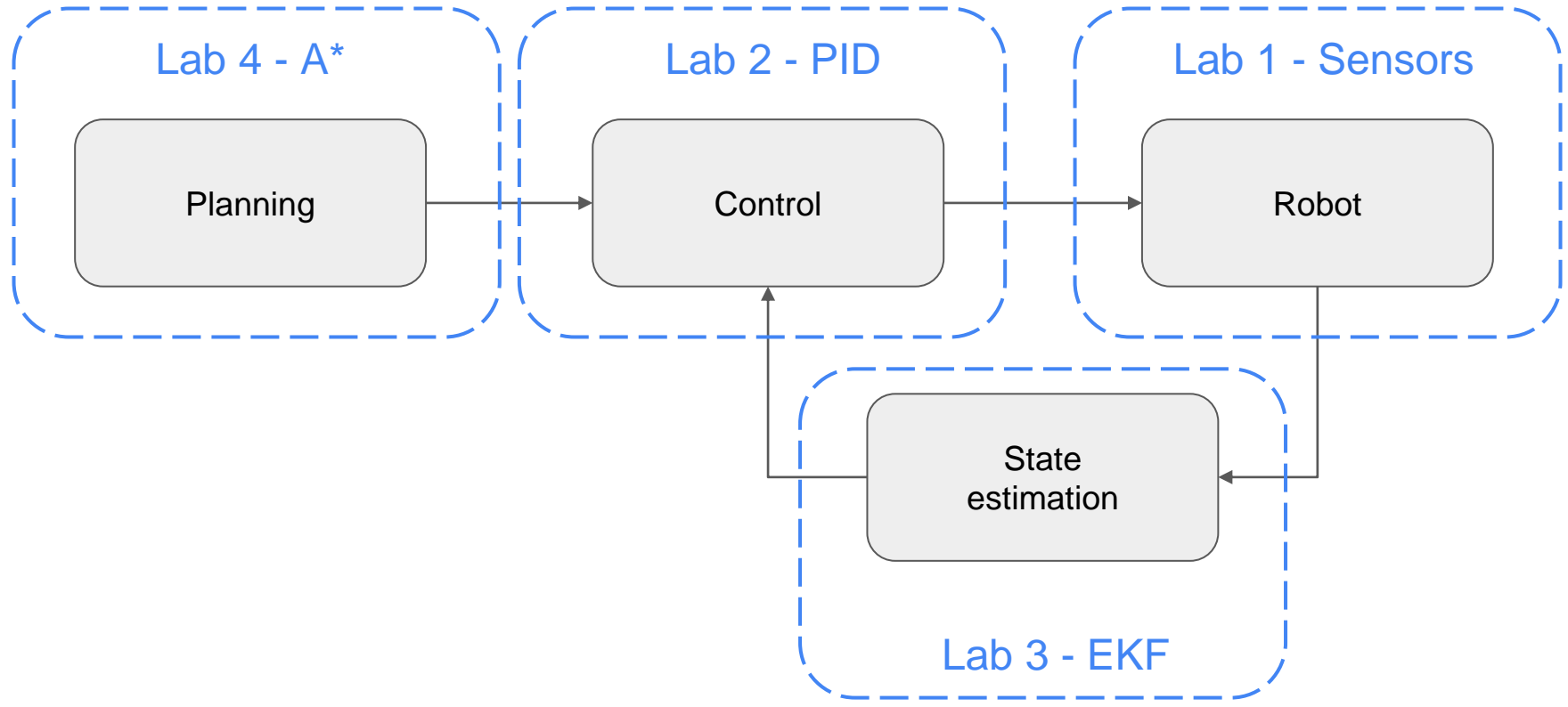


Planning

ROS 2™



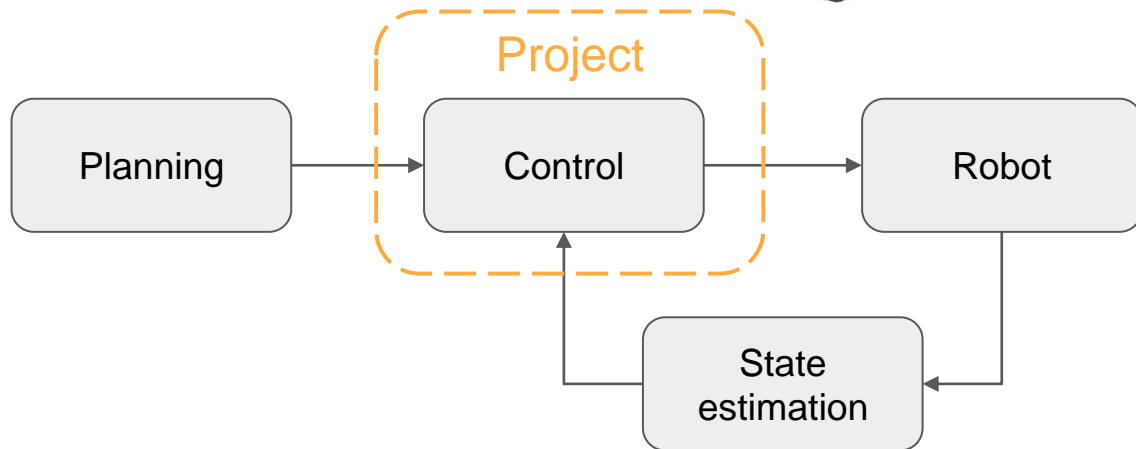
# Overview of MTE544 - Autonomous Mobile Robots



# Overview of SE380 - Introduction to Feedback Control

(Similar to MTE360 - Automatic Control Systems)

- Linear systems modeling and analysis
- Control design
  - Loop shaping
  - Root locus
  - State feedback



## State feedback control design

$$\begin{cases} \dot{x} = \overline{A}x + \overline{B}u \\ y = \overline{C}x + \overline{D}u \end{cases}$$

$$x \in \mathbb{R}^n$$

$$u \in \mathbb{R}^m$$

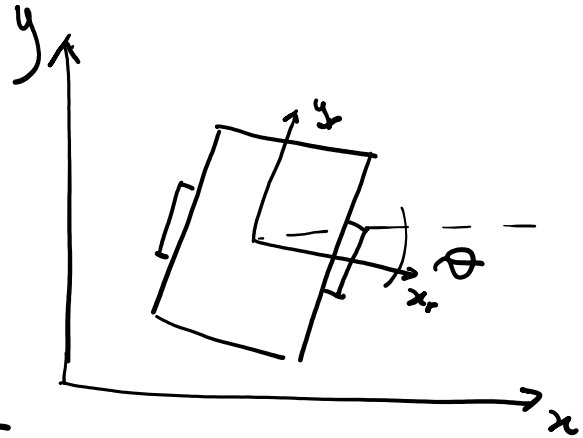
$$y \in \mathbb{R}^p$$

$$x_1 \equiv p$$

$$\begin{cases} \dot{p} = v \\ \dot{\theta} = \omega \\ y = \begin{bmatrix} p \\ u \end{bmatrix} \end{cases}$$

$\theta \rightarrow$  orientation of the robot

$$\begin{bmatrix} \dot{x} \\ \dot{y} \\ \dot{\theta} \end{bmatrix} = \begin{bmatrix} \cos \theta & 0 \\ \sin \theta & 0 \\ 0 & 1 \end{bmatrix} \begin{bmatrix} v \\ \omega \end{bmatrix}$$



# State feedback control design

$$(A, B) \Rightarrow \text{controllable}$$
$$\forall \{ \lambda_1^* \dots \lambda_n^* \} \exists \text{ state feedback controller}$$

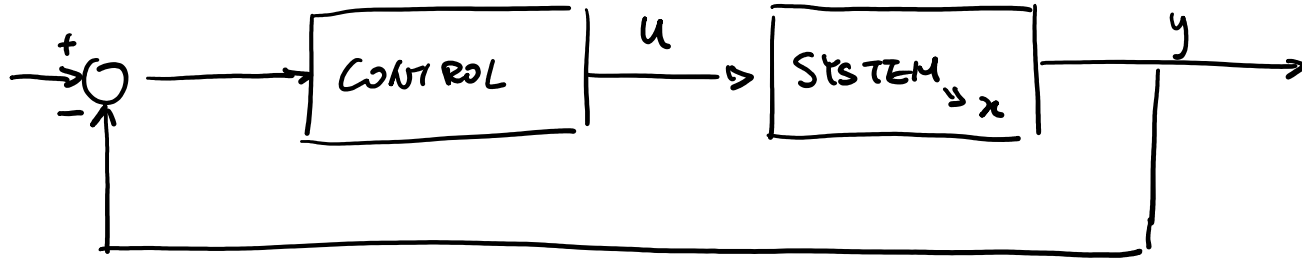
such that  $\dot{x} = Ax + Bu =$

$u = -Kx \quad K \in \mathbb{R}^{m \times n}$   
feedback gain matrix

such that 
$$z = Ax + Bu = (A - BK)u$$

eigenvalues of this matrix are at  $\{\lambda_1^*, \dots, \lambda_n^*\}$

# State feedback control design

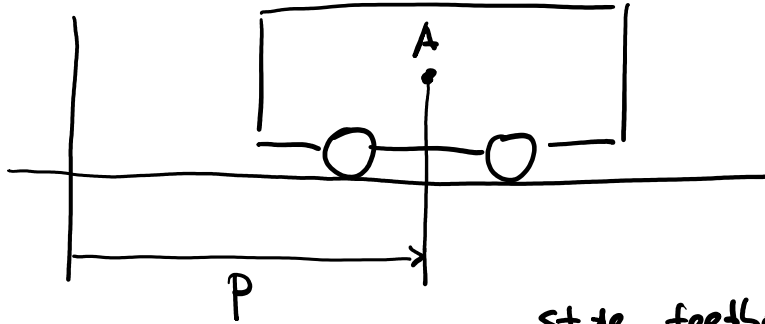


If only  $y$  can be measured  $\Rightarrow$  we cannot implement  
the control  $u = -Kx$



# State feedback control design

## Example



$$x = \begin{bmatrix} p \\ \dot{p} \end{bmatrix} \quad y = p$$

$$u = \underline{\text{acceleration}}$$

state feedback controller

$$a = -k_1 p - k_2 \dot{p}$$

p?

B

## State estimator design

$$u = -kx$$

↑

Estimate of  $x$  :  $\hat{x}$

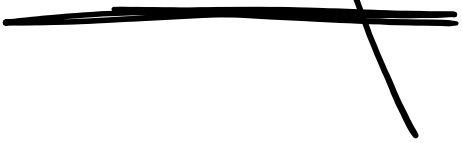
$$\dot{\hat{x}} = A \hat{x} + B u$$

↑

$$e = x - \hat{x}$$

$$\begin{aligned} \dot{e} &= \dot{x} - \dot{\hat{x}} \\ &= Ax + Bu - A\hat{x} - Bu \\ &= Ae \end{aligned}$$

## State estimator design

$$\dot{e} = A e$$


Works if

$$e \rightarrow 0 ?$$

$A$  is Hurwitz  
( $\operatorname{Re}(\lambda(A)) < 0$ )

## State estimator design

$$\dot{\hat{x}} = \underbrace{A \hat{x} + B u}_{\text{REPLICA OF SYS}} - \underbrace{L (\hat{y} - y)}_{\text{CLOSED-LOOP BASED ON MEAS.}}$$

$\hat{y} = C \hat{x} + D u$   $L \in \mathbb{R}^{n \times p}$

## State estimator design

$$\begin{aligned} \dot{e} &= \dot{\hat{x}} - \dot{x} \\ &= A \hat{x} + \cancel{B u} - L(\hat{y} - y) - A x - \cancel{B u} \\ &= A(\hat{x} - x) - L(C \hat{x} + \cancel{D u} - C x - \cancel{D u}) \\ &= A e - L C (\hat{x} - x) \\ &= (A - \underbrace{L C}) e \end{aligned}$$

CONTROLLED  
ERROR  
DYNAMICS

## State estimator design

$(A, C)$  is OBSERVABLE



$$\nexists \{ \lambda_1^* \dots \lambda_n^* \}$$

$\exists L :$

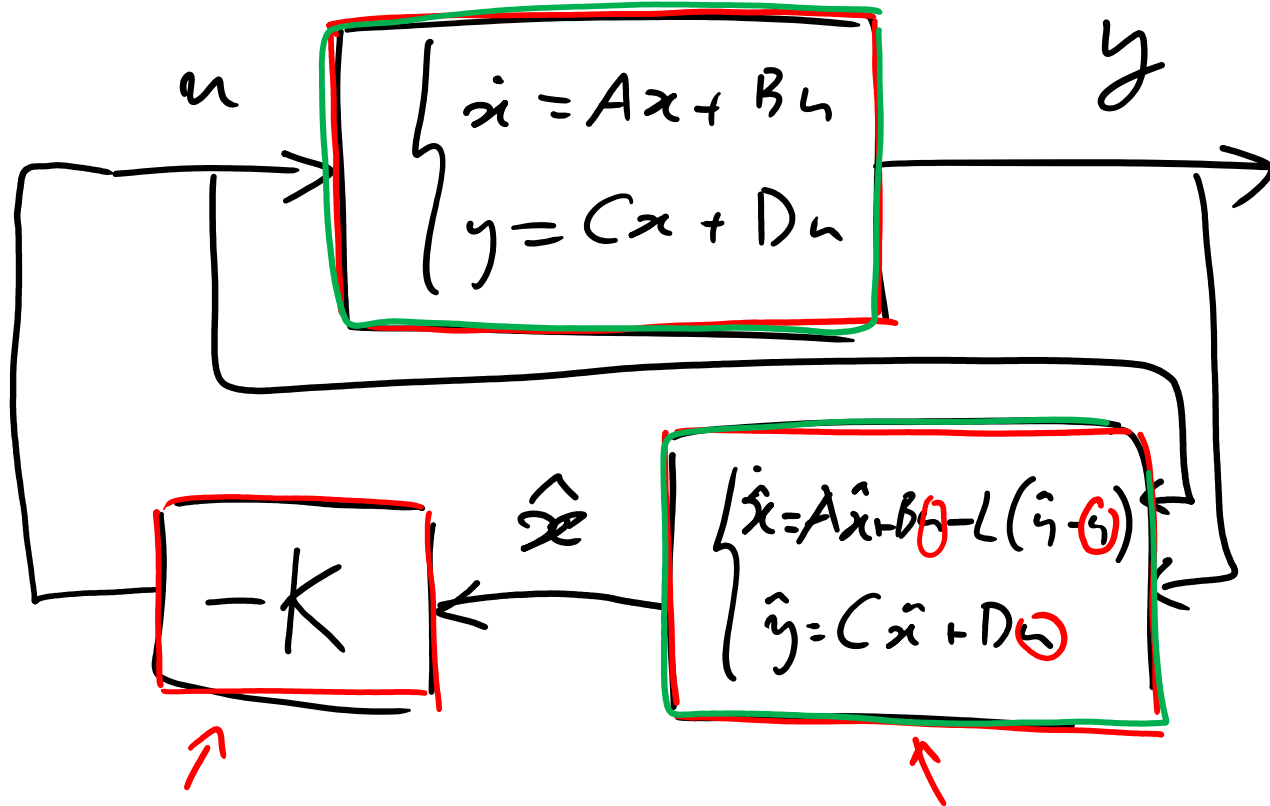
STATE OBS.  $\dot{\hat{x}} = A\hat{x} + Bu - L(\hat{y} - y)$

$$\text{e.i. } \boxed{(A - LC)} = \{ \lambda_1^* \dots \lambda_n^* \}$$

## State estimator design

$$\dot{\ell} = (A - \underset{\uparrow}{L}C) \ell \quad \Rightarrow \quad \begin{aligned} \ell &\rightarrow 0 \\ \hat{x} - x &\rightarrow 0 \\ \hat{x} &\rightarrow x \end{aligned}$$

Putting estimation & control together





Putting **estimation** & **control** together

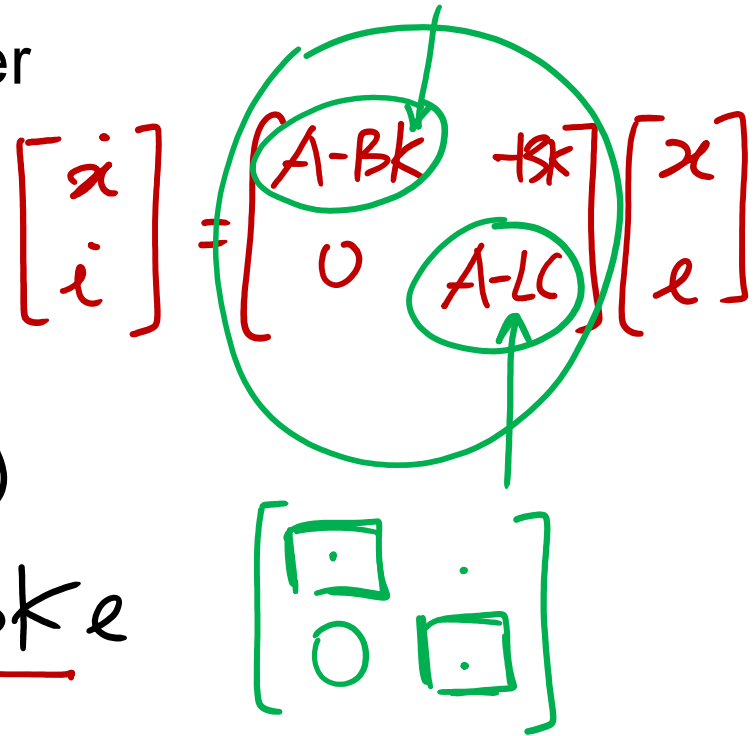
$$\dot{x} = A x + B u$$

$$= A x - B K \hat{x}$$

$$= A x - B K (x + e)$$

$$= (\underline{A - B K}) x - \underline{B K} e$$

$$\dot{e} = (\underline{A - L C}) e$$



# Putting estimation & control together

SYSTEM

$$\begin{cases} \dot{x} = Ax + Bu \\ y = Cx + Du \end{cases}$$

STATE ESTIMATOR

$$\begin{cases} \dot{\hat{x}} = A\hat{x} + Bu - L(\hat{y} - y) \\ \hat{y} = C\hat{x} + Du \end{cases}$$

STATE FEEDBACK CONTROLLER

$$u = -K\hat{x}$$

evolve as union of

$A - BK$

SE380  
design this

and

$A - LC$

H7ES44  
design this

INDEPENDENTLY

# Putting estimation & control together

## MTE 544 students

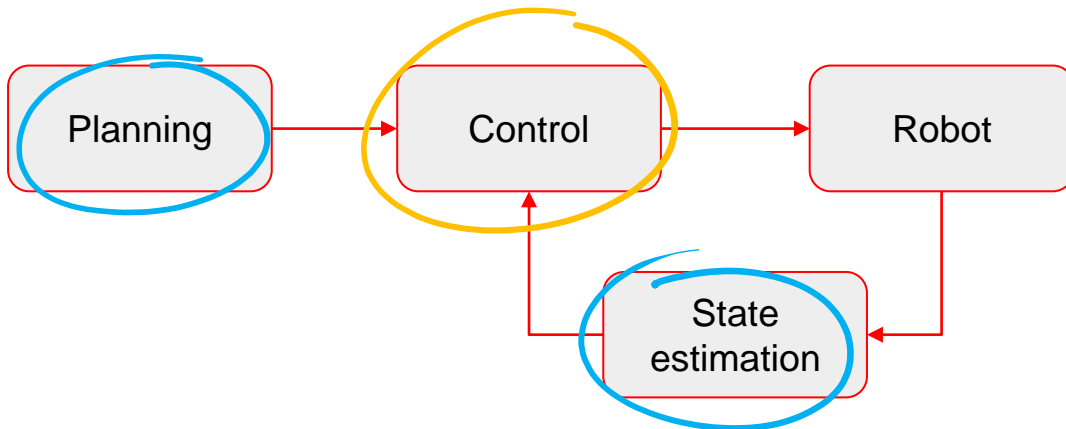
You can choose your favourite planner and your favourite eigenvalues to design a state estimator

## SE 380 students

You can choose your favourite eigenvalues for state feedback control design

The separation principle tells us that:

**You can close the loop and it just works!**



# Summary

The separation principle:

- Allows us to design a state feedback controller and implement it using an estimate of the state, instead of the actual one
- Allows us to design a state estimator, plug it in in feedback with the real system controlled using the state feedback controller
- Allows us **not to be friend** with SE380 students (for MTE544 students) and with MTE544 students (for SE380 students)
- Does **not** allow us to **blame** MTE544 students and SE380 students if our state estimator or state feedback controller, respectively, does not work

## Demo - Event space 2nd floor

