



Adaptive and Autonomous Aerospace Systems

School of Industrial and Information Engineering - Aeronautical Engineering

Davide Invernizzi – Department of Aerospace Science and Technology

Part 1: Analysis of nonlinear and time-varying systems

Lecture 1: Introductory examples in Adaptive Control



POLITECNICO
MILANO 1863

ASCL
AEROSPACE SYSTEMS & CONTROL LABORATORY

- Recap on example “Model Reference (Adaptive) Control of aircraft roll rate dynamics”.
- Second example: estimation of an uncertain parameter in a scalar algebraic system.
- Plan for Friday lecture

Recap: MRAC for aircraft roll rate dynamics

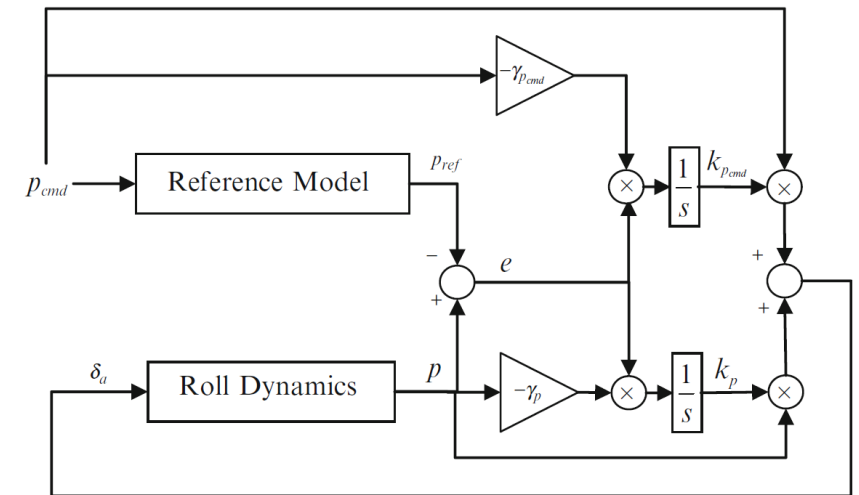
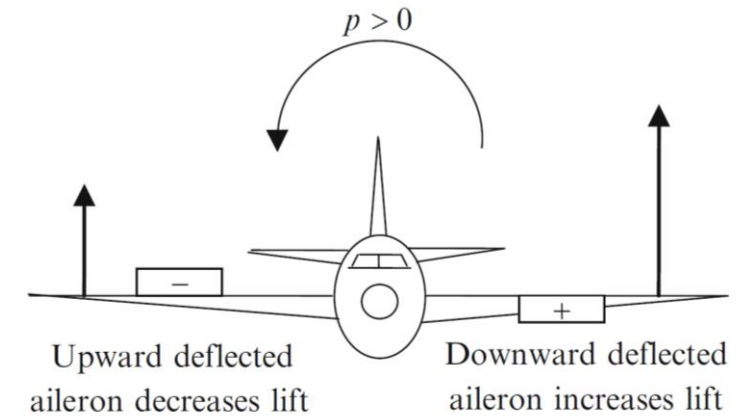
Direct MRAC law

$$\dot{p}_{ref} = a_{ref}p_{ref} + b_{ref}p_{cmd}$$

$$\dot{\hat{k}}_p = -\gamma_p \text{sign}(L_{\delta_a}) p (p - p_{ref})$$

$$\dot{\hat{k}}_{p_{cmd}} = -\gamma_{p_{cmd}} \text{sign}(L_{\delta_a}) p_{cmd} (p - p_{ref})$$

$$\delta_a = \hat{k}_p p + \hat{k}_{p_{cmd}} p_{cmd}$$



Lesson learned

- The *direct* Model Reference Adaptive Controller operates using only available **(online measured)**. signals in the system.
The adaptive control law makes use of:
 - (a) the system state p
 - (b) the state of the reference model p_{ref} ,
 - (c) The commanded signal p_{cmd}
 - (d) the tracking error $e = p - p_{ref}$
 - (e) the sign of the control effectiveness $sign(L_{\delta_a})$.
- All signals in the closed-loop system remain **uniformly bounded** in time.

Introductory examples in Adaptive Control

- The system state p tracks the state of the reference model p_{ref} **globally** and **asymptotically**. However, a characterization of the system transient dynamics in model reference adaptive control remains an open problem.
- The adaptive parameters are not guaranteed to converge to their true (unknown) values nor are they assured to converge to constant values in any way.
 - All that is known is that these parameters remain uniformly bounded in time.

Error variables

$$e = e - p_{ref}$$

Reference model mismatch

$$\Delta k_p = \hat{k}_p - \bar{k}_p$$

Gain estimation errors

$$\Delta k_{p_{cmd}} = \hat{k}_{p_{cmd}} - \bar{k}_{p_{cmd}}$$

Error dynamics for MRAC: nonlinear, time-varying, perturbed system Ordinary Differential Equation (ODE):

$$\dot{e} = (a_{ref} + L_{\delta_a} \Delta k_p) e + L_{\delta_a} (\Delta k_p p_{ref} + \Delta k_{p_{cmd}} p_{cmd})$$

$$\dot{\Delta k_p} = -\gamma_p \text{sign}(L_{\delta_a})(e + p_{ref}) e$$

$$\dot{\Delta k_{p_{cmd}}} = -\gamma_{p_{cmd}} \text{sign}(L_{\delta_a}) p_{cmd} e$$

$$\dot{p}_{ref} = a_{ref} p_{ref} + b_{ref} p_{cmd}$$

Estimation of an uncertain parameter in a scalar algebraic system

$$y(t) = \bar{\theta}u(t)$$

- $y \in R$ (measured)
- $u \in R, u(t) \in L_\infty$ (measured)
- $\bar{\theta} \in R$ unknown constant

Problem: to develop an online estimation algorithm for $\bar{\theta}$ given measurement of u and y at each time instant.

Introductory examples in Adaptive Control

Estimation algorithm

$$\dot{\hat{\theta}}(t) = \gamma u(t)(y(t) - \hat{\theta}(t)u(t))$$

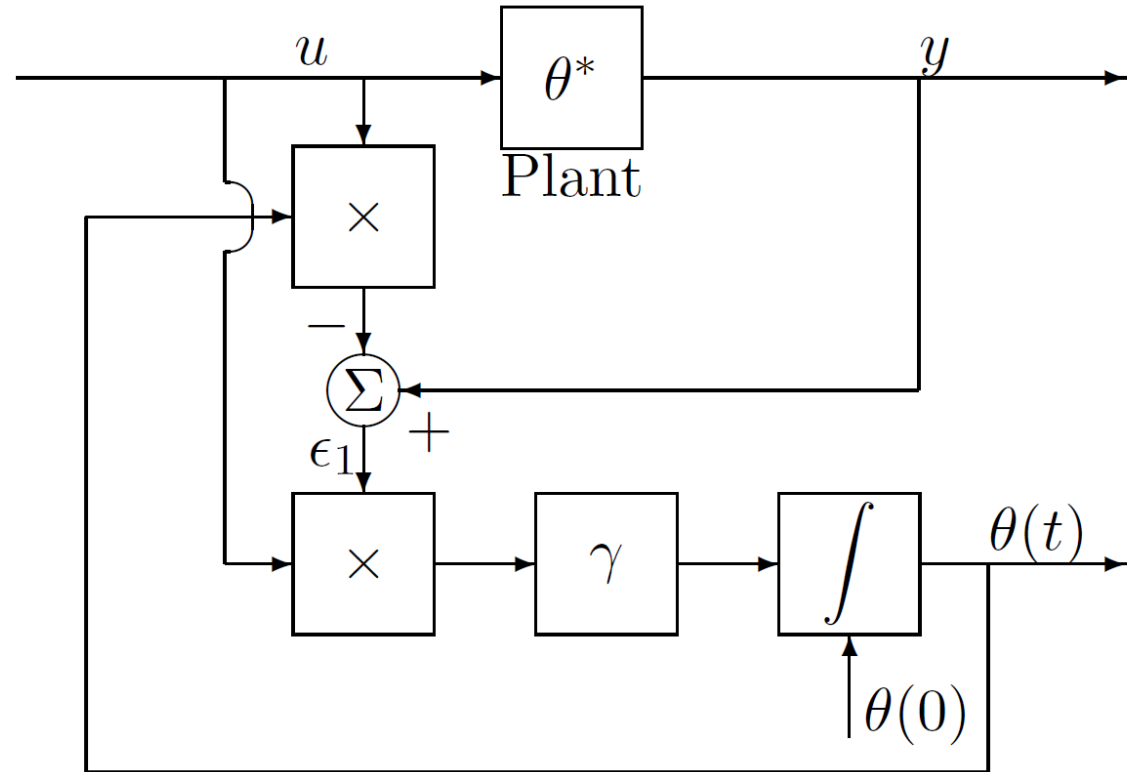
$\gamma \in R_{>0} :=$ adaptation gain

Error equation

$$\dot{e}_{\theta} = -\gamma u(t)^2 e_{\theta}$$

Solution

$$e_{\theta}(t) = e^{-\gamma \int_{t_0}^t u(\tau)^2 d\tau} e_{\theta}(t_0)$$



Lesson learned

- Under some **regularity** assumptions on the input signal, the adaptive law guarantees that the estimation error e_y converges to **zero** (globally).
- The parameter estimation error e_θ converges to a **constant** (that might be different from zero).
- When the input $u(t)$ is **PE**, the parameter estimation error e_θ converges to **zero**.
- Under **PE** conditions, the convergence to zero of e_θ is not necessarily **exponential**.

What happens with disturbances? $y(t) = \bar{\theta}u(t) + d(t)$

Plan for Friday lecture

- Familiarization with Simulink (bring your own laptop)
- Coding session
 - Implementation of the adaptive estimator for the algebraic system example.
 - Implementation of MRAC laws for the aircraft roll rate example.