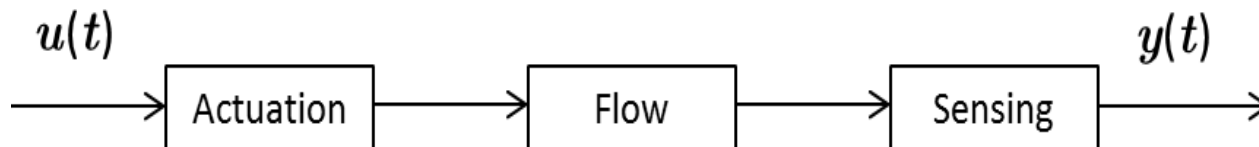
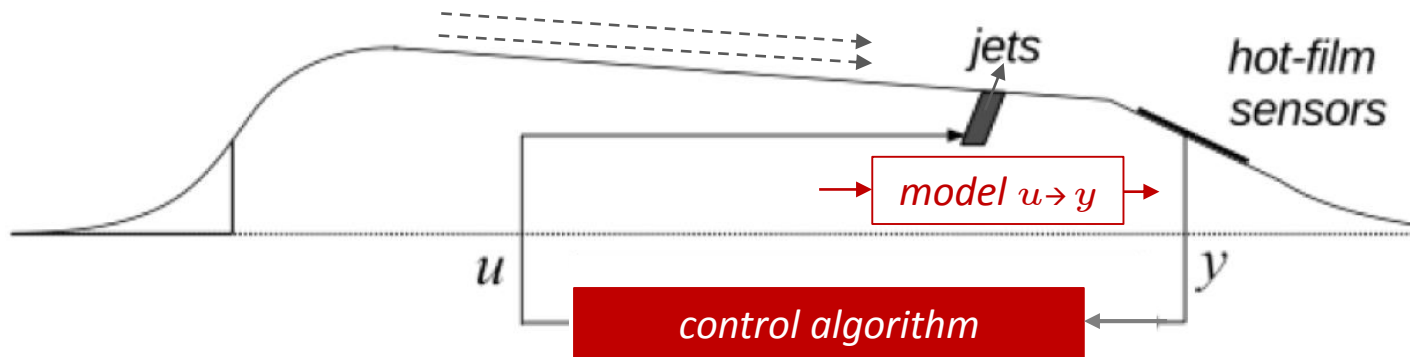


# Flow Control: TD #2

## *Overview*

- General issues, passive vs active...
- Control issues: optimality and learning vs robustness and rough model
- Model-based control: linear model, nonlinear control
  - Linear model, identification
  - Sliding Mode Control
  - Delay effect
  - Time-delay systems
- Introduction to delay systems
  - Examples
  - Much a do about delay? Some special features + a bit of maths
  - Time-varying delay
- Model-based control: nonlinear model, nonlinear control
  - Overview of MF's PhD: Sliding Mode Control
  - Application to the airfoil
  - Application to the Ahmed body (MF and CC'PhDs)
- ...
- Machine Learning and model-free control: + 4h with [Thomas Gomez](#)

# Input – Output flow Control: linear case



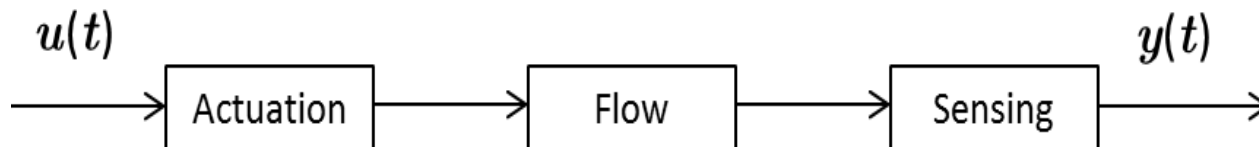
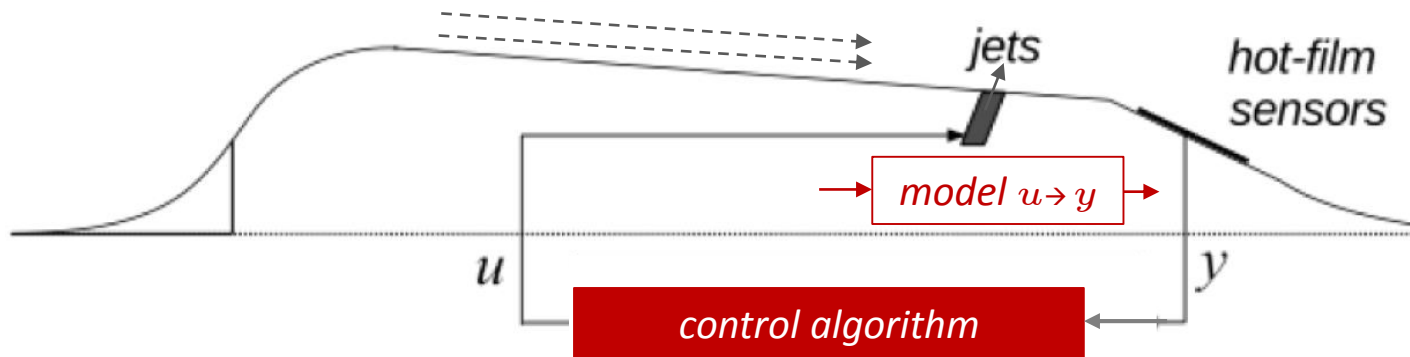
... explain me how you're gonna do?

# Flow Control

## Control specification: a *memorandum*

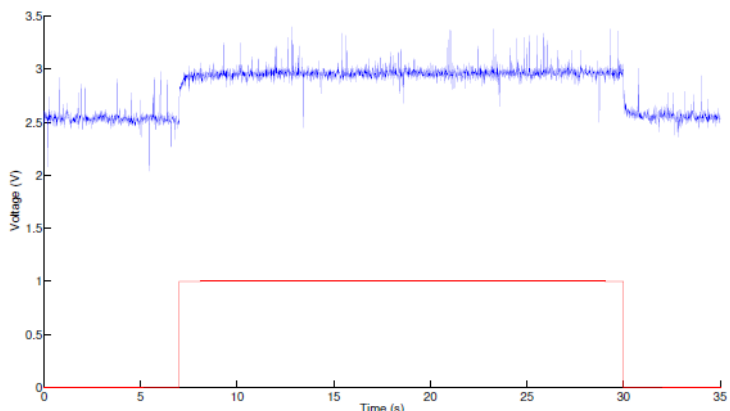
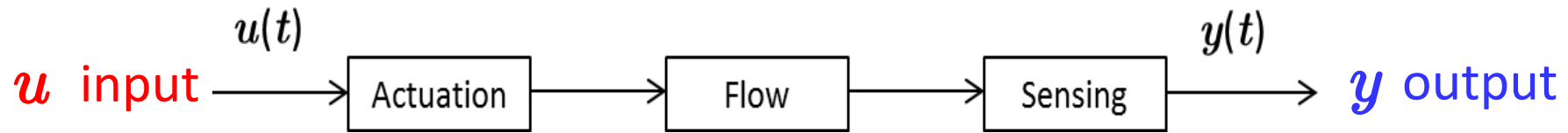
- Tracking
  - structural properties: controllability, observability
  - set point tracking, trajectory tracking
- Stability
  - small initial perturbation => small perturbation for all
- Accuracy
  - small final gap (asymptotic property) .....
  - wrt some class of trajectories ( $t^n, n = 1, 2, 3...$ ) .....
- Speed of convergence
  - asymptotic, exponential decay rate and time constant .....  $\Rightarrow$  open-loop
  - finite-time, fixed-time .....  $\Rightarrow$  closed-loop
- Robustness
  - wrt external disturbances .....  $\Rightarrow$  closed-loop
  - wrt model error .....  $\Rightarrow$  closed-loop
- Low energetic cost
  - LQR optimal: minimize  $\int_0^\infty (gap^2 + energy^2) dt$  .....  $\Rightarrow$  closed-loop
- Low price
  - technology (actuators, sensors, computing...)  $\Rightarrow$  open-loop
  - design time

# Input – Output flow Control: linear case

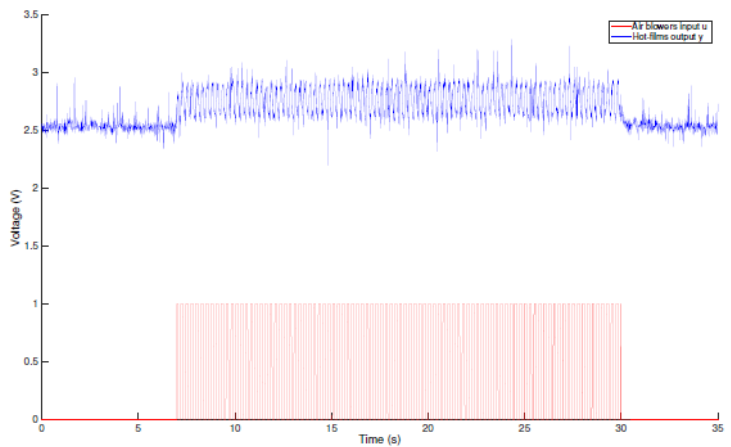


... explain me how you're gonna do?

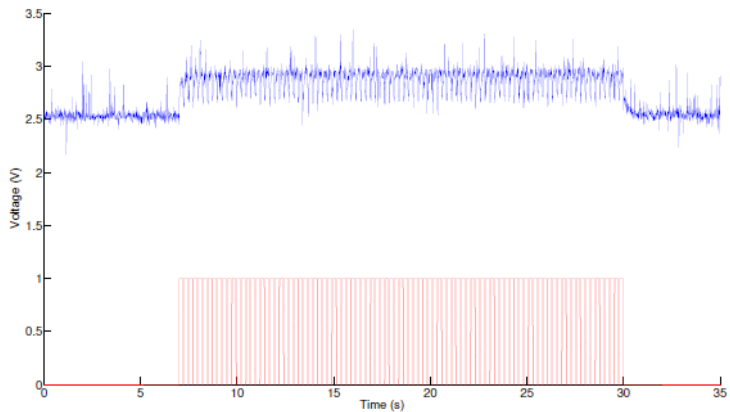
# Input – Output flow Control: linear case



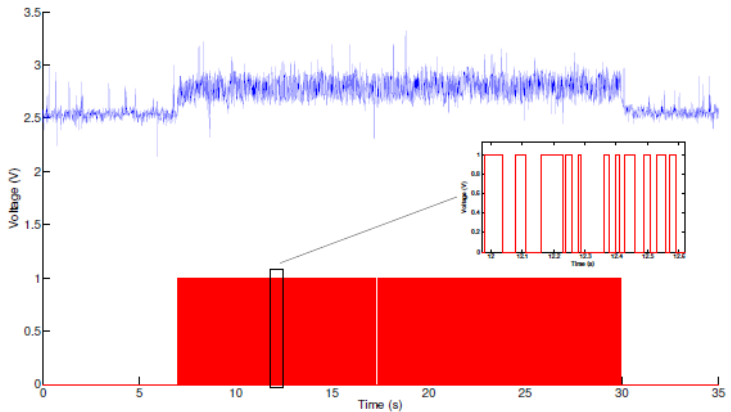
Constant Control



Square Wave,  $f = 4\text{Hz}$  ,  $\text{DC}=50\%$

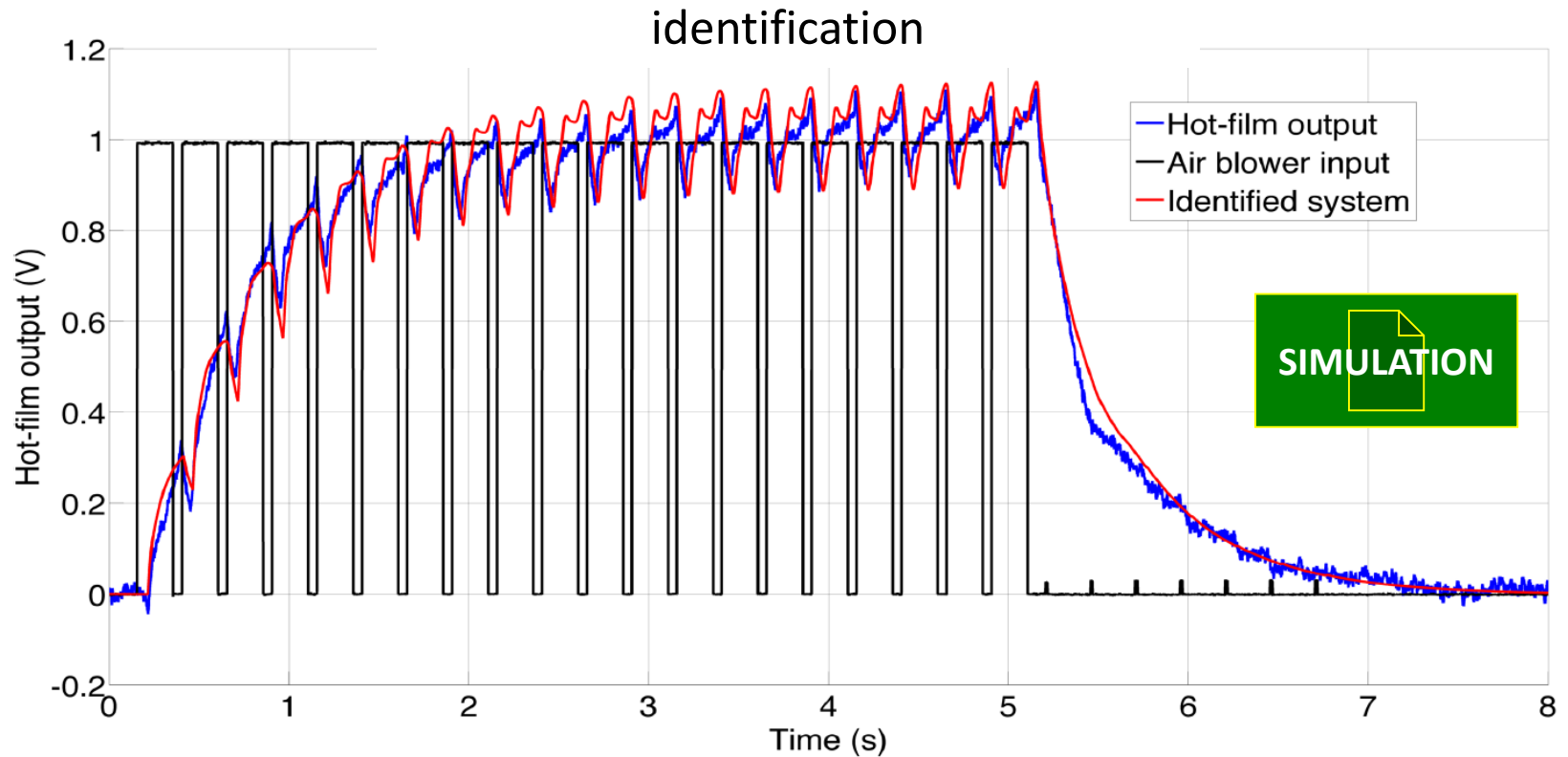
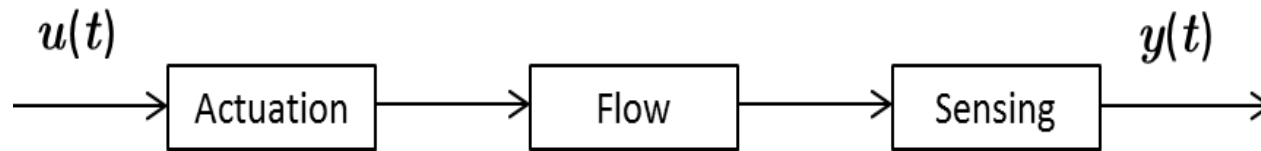


Square Wave,  $f = 4\text{Hz}$  ,  $\text{DC}=80\%$



PRBS

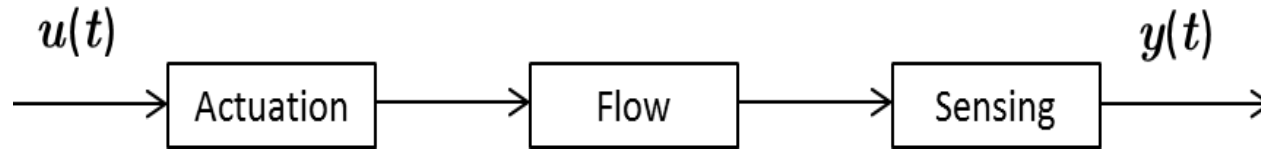
# Input – Output flow Control: linear case



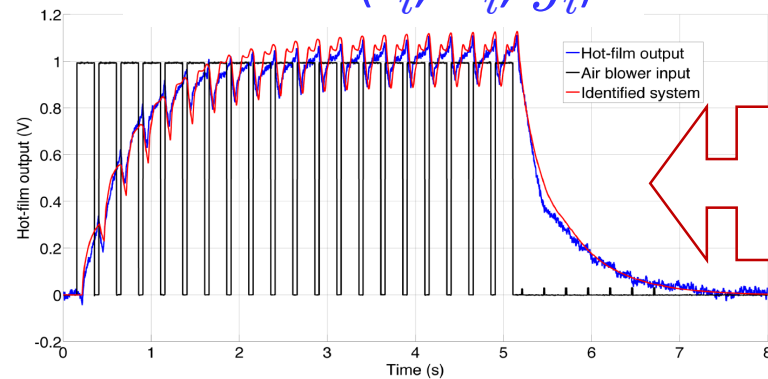
Propose some model.

$$\dot{y}(t) = -ay(t) + bu(t) \quad ?$$

# Input – Output flow Control: linear case



data set  $(t_i, u_i, y_i)$



How do you proceed with the identification ?

$$\dot{y}(t) = -ay(t) + bu(t)$$

Data  $(u_i, y_i) \times$  Parameters  $(a, b) =$  computed  $\dot{y}$

Data  $\times$  Parameters = Data

$$\boxed{Ac = y} \rightarrow \text{find } c \rightarrow \text{pseudoinverse } A^+ \text{ of } A$$

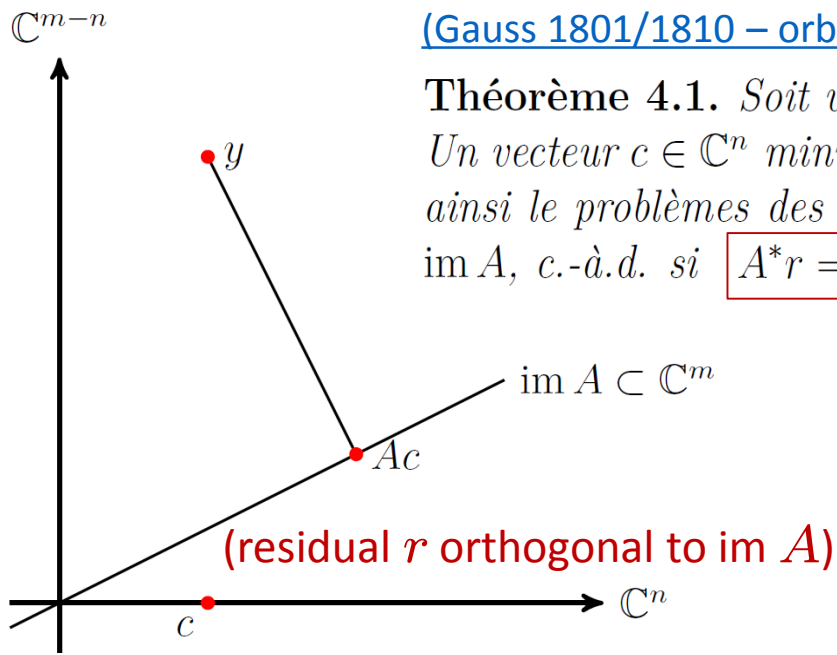
$$A \in \mathbb{R}^{m \times n}$$

$$m > n$$

# Input – Output flow Control: linear case

(Gauss 1801/1810 – orbit of Ceres  $m=11$   $n=6$ , Legendre 1805 – orbit of comets)

**Théorème 4.1.** Soit une matrice  $A \in \mathbb{C}^{m \times n}$ ,  $m > n$ , et une donnée  $y \in \mathbb{C}^m$ . Un vecteur  $c \in \mathbb{C}^n$  minimise la norme des résidus  $\|r\|_2 = \|y - Ac\|_2$ , résolvant ainsi le problème des moindres carrés, si et seulement si  $r$  est orthogonal à  $\text{im } A$ , c.-à-d. si  $A^*r = 0$  ou bien  $A^*(Ac) = A^*y$  (équations normales)



$$A^*(Ac) = A^*y$$

$A^*A \in \mathbb{C}^{n \times n}$  regular iff  $\text{rank } A = n$ .

$$c = (A^*A)^{-1}A^*y$$

$$A^+ \triangleq (A^*A)^{-1}A^* \in \mathbb{C}^{n \times m}$$

*pseudoinverse*

Data x Parameters = Data

$$Ac = y$$

$$r \triangleq y - Ac$$

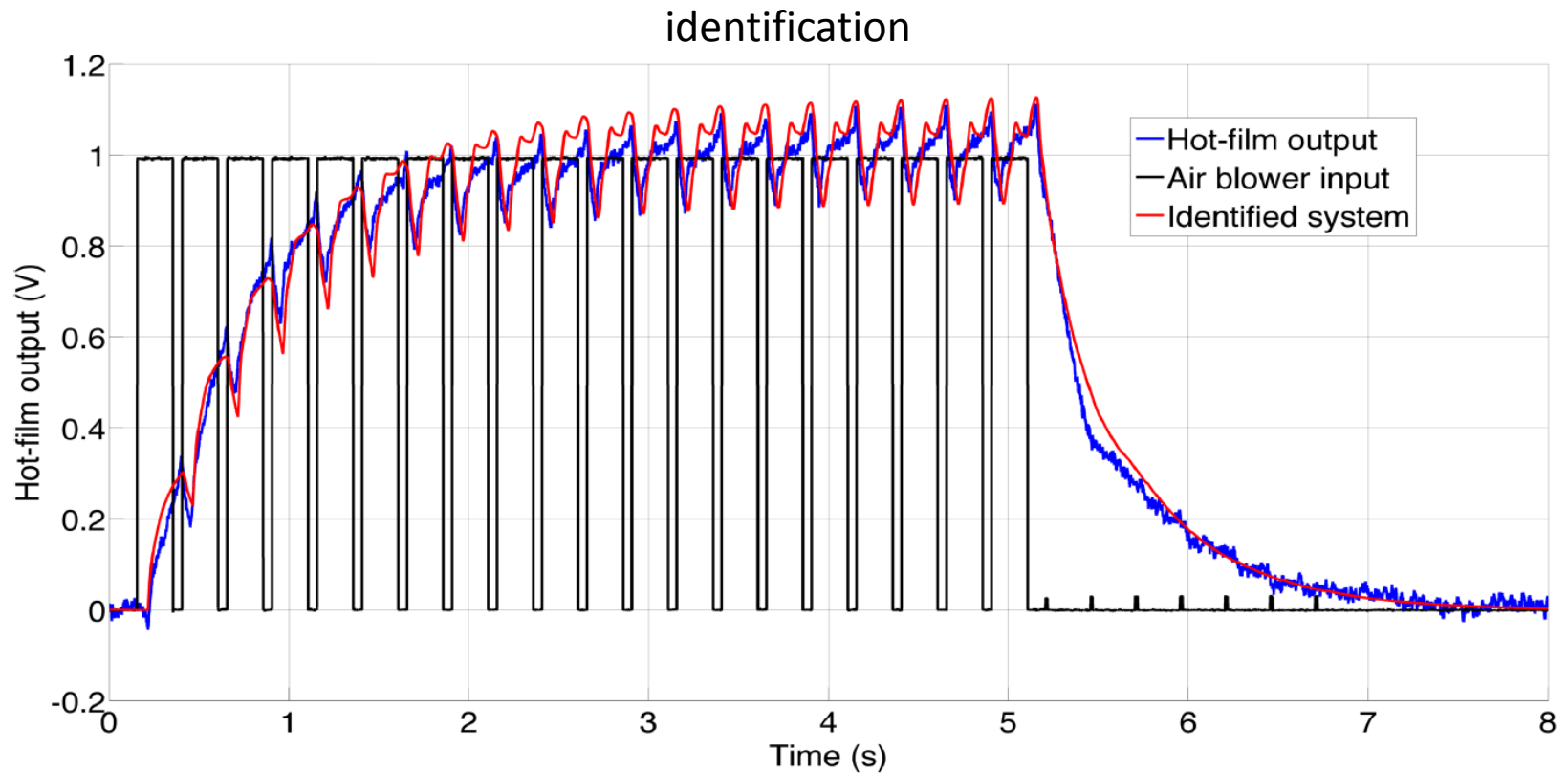
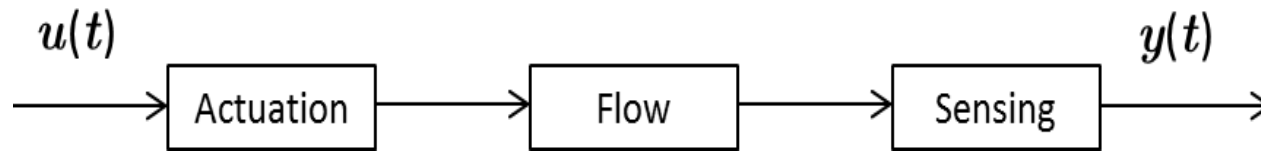
$A \in R^{m \times n}$   
 $m > n$

Residual to be minimized  
w.r.t.  $c$  (least squares)

$$\|y - Ac\|_2$$



# Input – Output flow Control: linear case



$$\dot{y}(t) = -ay(t) + bu(t)$$

... with on/off control (actuation technology)

# Input – Output flow Control: linear case

**on/off control** = *sliding mode control (SMC)*

## Model

Consider the following model:

$$\dot{y}(t) = -ay(t) + bu(t) \quad (8)$$

with  $a > 0$ ,  $b > 0$ ,  $u(t) \in \{0, 1\}$ ,  $y(0) \in [0, y_{max}]$ . The solution  $y$  is bounded for any input signal  $u(t)$ :  $0 \leq y(t) \leq y_{max}$ .

**Control objective: track the setpoint  $y^*$ .**



?

# Input – Output flow Control: linear case

**on/off control** = *sliding mode control* (SMC)

## Model

Consider the following model:

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**Control objective: track the setpoint  $y^*$ .**

## Sliding surface

$$\Sigma = \{y : \sigma(y) = 0\}$$

with  $\sigma$  the sliding variable:

$$\sigma(y) = y - y^*$$

# Input – Output flow Control: linear case

## Control

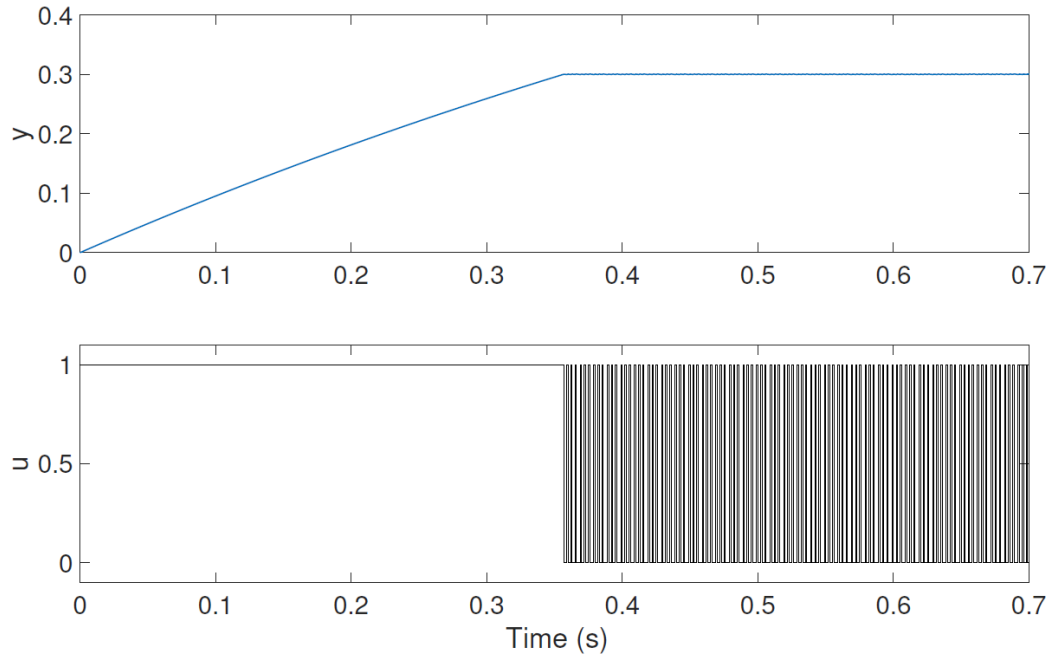
$$u(t) = \begin{cases} 1 & \text{if } \sigma(y) \leq 0 \\ 0 & \text{if } \sigma(y) > 0 \end{cases}$$

If  $\dot{\sigma}(y)\sigma(y) < 0$  then the system reaches  $\Sigma$  in finite time (Utkin 1992) and stays on  $\Sigma$ :  $\exists t^* > 0, \sigma(y) = 0$  for  $t > t^*$

## Reaching condition

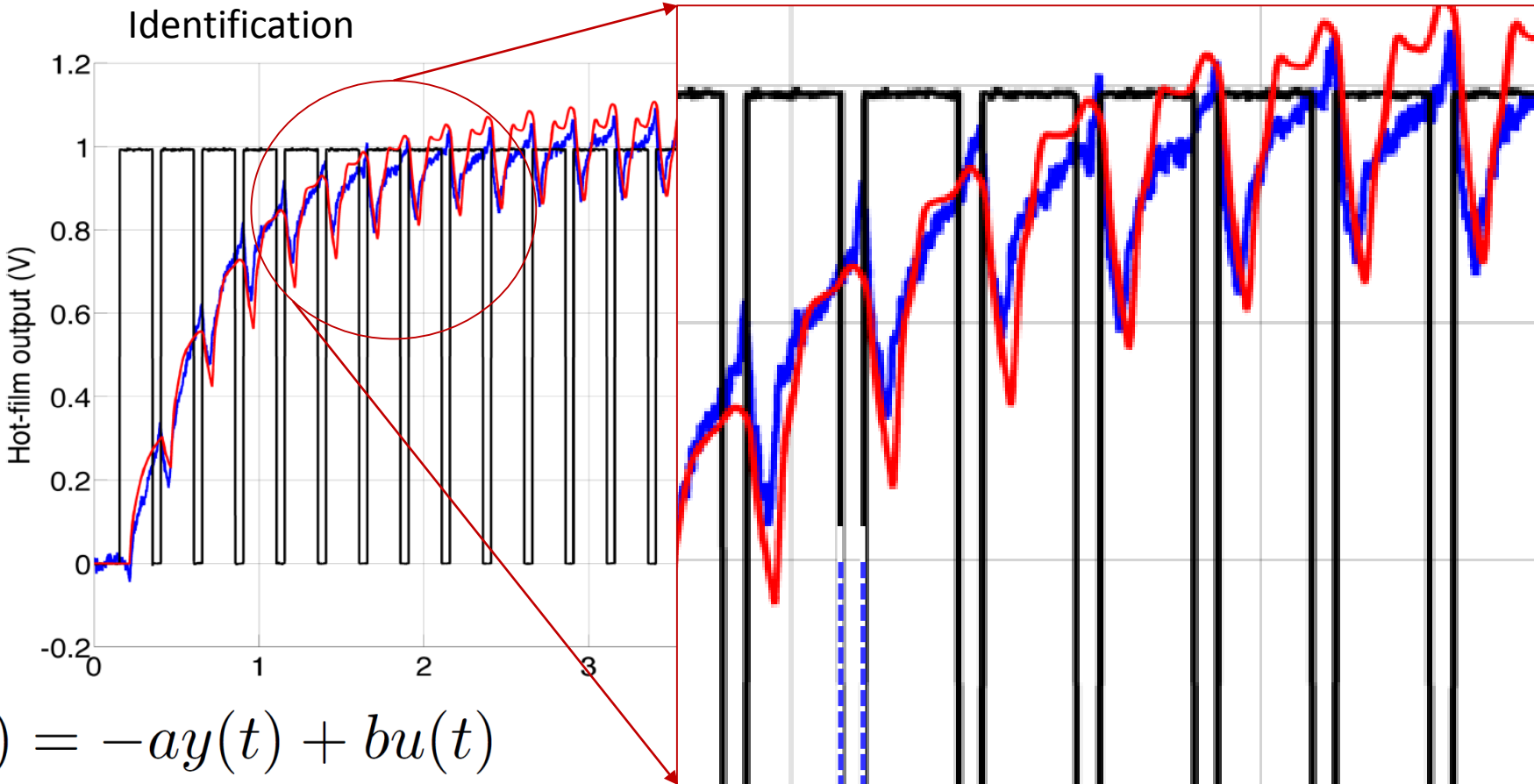
$$\begin{aligned} \dot{\sigma}(y)\sigma(y) &= \dot{y}(t)(y(t) - y^*) \\ &= (-ay(t) + bu(t))(y(t) - y^*) \\ &= \begin{cases} (-ay(t) + b)(y(t) - y^*) & \text{if } y(t) < y^* \\ -ay(t)(y(t) - y^*) & \text{if } y(t) > y^* \end{cases} \\ &< 0 \quad \text{as} \quad 0 \leq y(t) \leq y_{max} \end{aligned}$$

# Input – Output flow Control: linear case



# Input – Output flow Control: linear case

... but we also have delay effects!



$$\dot{y}(t) = -ay(t) + bu(t)$$

$$\dot{y}(t) = -ay(t) + bu(t - h)$$

$$\dot{y}(t) = -a_0y(t) - a_1y(t - \tau) + bu(t - h)$$

Simu  Input Delay

Simu  State Delay

# Input – Output flow Control: linear case

... but we also have delay effects!

→ Translation in terms of Laplace transfers?

$$\frac{Y(s)}{U(s)} = \frac{b}{s+a}$$

$$\frac{Y(s)}{U(s)} = \frac{be^{-hs}}{s+a}$$

$$\frac{Y(s)}{U(s)} = \frac{be^{-hs}}{s+a_0+a_1e^{-\tau s}}$$

$$\dot{y}(t) = -ay(t) + bu(t)$$

$$\dot{y}(t) = -ay(t) + bu(t-h)$$

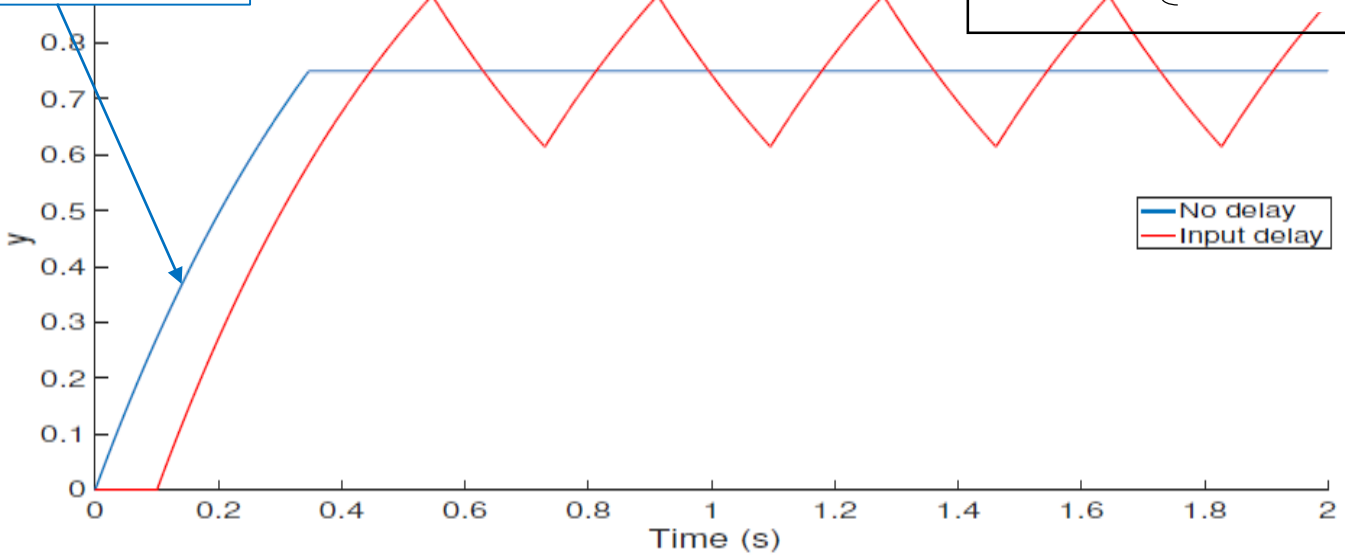
$$\dot{y}(t) = -a_0y(t) - a_1y(t-\tau) + bu(t-h)$$

# Input – Output flow Control: linear case

$$\dot{y}(t) = -ay(t) + bu(t)$$

$$\frac{Y(s)}{U(s)} = \frac{b}{s+a}$$

What is the effect of an input delay  $h$  on the previous sliding mode controller?

$$\begin{cases} u = 1 & \text{if } y(t) < y^* \\ u = 0 & \text{if } y(t) > y^* \end{cases}$$


$$\dot{y}(t) = -ay(t) + bu(t - h)$$

$$\frac{Y(s)}{U(s)} = \frac{be^{-hs}}{s+a}$$

