



university of
 groningen

faculty of science
 and engineering

johann bernoulli institute
 for mathematics and computer science

Switch-observer for switched linear systems

Stephan Trenn

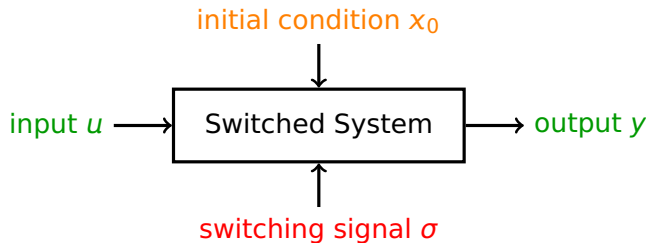
Jan C. Willems Center for Systems and Control
University of Groningen, Netherlands

Joint work with **Ferdinand Küsters** and **Andreas Wirsén**, Fraunhofer ITWM,
Kaiserslautern, Germany

Partially supported by BMWi MathEnergy (project number 0324019A) and by DFG grant TR 1223/2-1

Conference on Decision and Control (CDC 2017), Melbourne, Australia, 2017/12/12

The observability problem



Observability questions

- > Is there a unique x_0 for any given σ, u, y ? \rightarrow observability ✓
- > Is there a unique (x_0, σ) for any given u and y ?
 \rightarrow (x, σ) -observability
- > Is there a unique σ for any given u, y and unknown x_0 ?
 \rightarrow σ -observability \iff (x, σ) -observability

“Trivial” observer design for (x, σ) -obs.

Instantaneous observability

(x, σ) -observability \implies local state and mode observability

Observer design

1. For each mode run a classical state observer
2. Pick the one which converges \rightarrow mode and state estimation
3. Repeat

Nothing switch specific

Information at the switch (e.g. jumps) not utilized.

Weaker observability notion

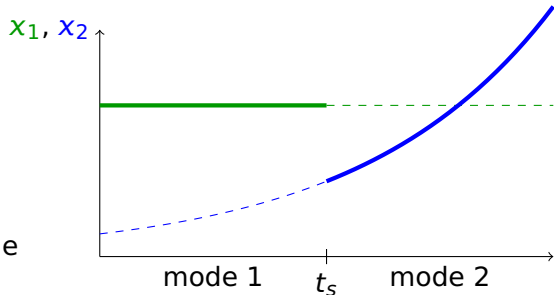
$$\dot{x} = \begin{bmatrix} 0 & 0 \\ 0 & 1 \end{bmatrix} x$$

$$y = C_{\sigma} x$$

with

$$C_1 = [1, 0] \rightarrow \text{not observable}$$

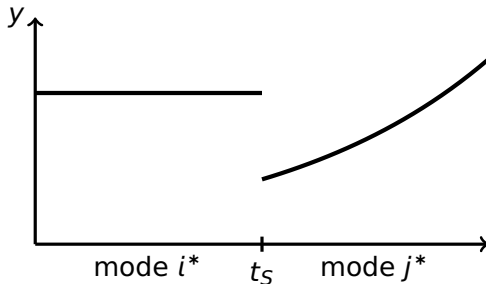
$$C_2 = [0, 1]$$



Switch observability (σ_1 -observability)

Recover x and σ from u and y , if at least one switch occurs

Overall observer design



(0. Detect switching time t_S .)

1a. Run **partial** state observers on $(t_S - \tau, t_S)$ for all modes.

1b. Run **partial** state observers on $(t_S, t_S + \tau)$ for all modes.

2. **Combine** partial information to find (i^*, j^*) and state estimation $\hat{x}(t_S)$

Partial state observer

$$\begin{aligned} \dot{x} &= A_p \dot{x} + B_p u, \\ y &= C_p x + D_p u, \end{aligned} \quad \mathcal{O}_p := \begin{bmatrix} C_p \\ C_p A_p \\ \vdots \\ C_p A_p^{n-1} \end{bmatrix} \quad r_p := \text{rank } \mathcal{O}_p$$

Choose orthogonal $Z_p \in \mathbb{R}^{n \times r_p}$ with $\text{im } Z_p = \text{im } \mathcal{O}_p^T$, then

$$\begin{aligned} \dot{z}_p &= Z_p^T A_p Z_p z_p + Z_p^T B_p u \\ y &= C_p Z_p z_p + D_p u \end{aligned} \quad \text{is observable}$$

Definition (Partial state observer)

Any observer for $z_p = Z_p^T x$ is a **partial state observer**.

Mode dependence

Z_p and size r_p are **mode dependent**.

Reasonable modes

Definition (Reasonable modes)

Mode i is **reasonable** on $(t_S - \tau, t_S)$ \Leftrightarrow

$$\exists x_i^{t_S} : y = C_i x_i + D_i u \quad \text{where } \dot{x}_i = A_i x_i + B_i u, \quad x_i(t_S) = x_i^{t_S}$$

In particular, i^* is reasonable on $(t_S - \tau, t_S)$.

Crucial property of reasonable modes

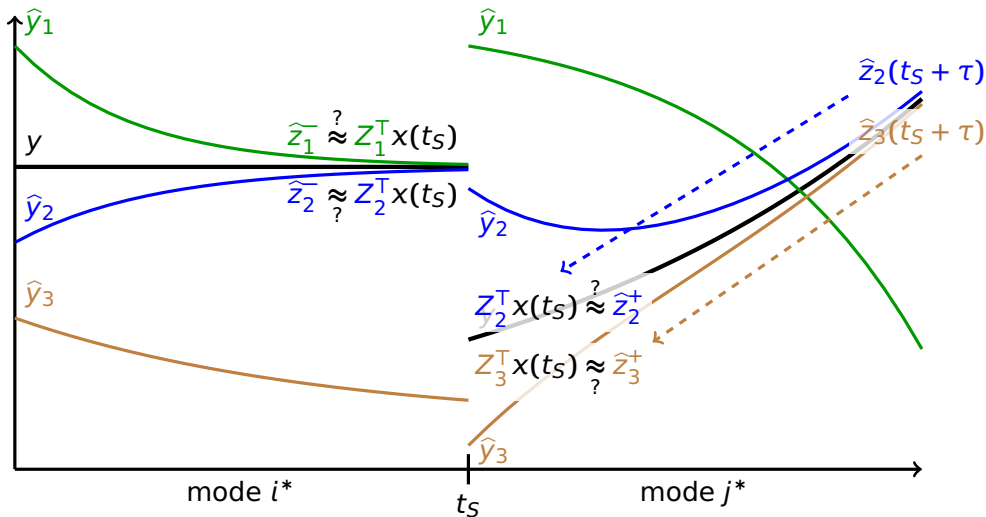
Partial state observers “converge” for **all** reasonable modes, i.e.

$$y \approx C_i Z_i \hat{z}_i + D_i u \quad \text{on } (t_S - \varepsilon, t_S) \quad \forall \text{ reasonable } i$$

Analog definition for reasonable modes j on $(t_S, t_S + \tau)$, with

$$y \approx C_j Z_j \hat{z}_j + D_j u \quad \text{on } (t_S + \tau - \varepsilon, t_S + \tau) \quad \forall \text{ reasonable } j$$

Illustration of Steps 1 and 2



Combining partial state estimations

Question

How to combine the obtained information before and after the switch?

Obvious fact

(x, σ_1) -observability \implies observability for known σ with one switch
 $\implies \ker \mathcal{O}_i \cap \ker \mathcal{O}_j = \{0\} \quad \forall i \neq j$
 $\implies \text{rank}[Z_i, Z_j] = n \quad \forall i \neq j$

State estimation candidates

For $(i, j) = (i^*, j^*)$ we have

$$\begin{pmatrix} \widehat{z}_i^- \\ \widehat{z}_j^+ \end{pmatrix} \approx \begin{bmatrix} Z_i^T \\ Z_j^T \end{bmatrix} x(t_s) \implies x(t_s) \approx \begin{bmatrix} Z_i^T \\ Z_j^T \end{bmatrix}^\dagger \begin{pmatrix} \widehat{z}_i^- \\ \widehat{z}_j^+ \end{pmatrix} =: \widehat{x}_{ij}$$

Final step

Theorem

For sufficiently accurate partial observers and for all reasonable (i, j)

$$\begin{aligned}
 (i, j) = (i^*, j^*) &\quad \Rightarrow \quad \begin{bmatrix} Z_i^T \\ Z_j^T \end{bmatrix} \hat{x}_{ij} \approx \begin{bmatrix} \hat{z}_i^- \\ \hat{z}_j^+ \end{bmatrix} \\
 (i, j) \neq (i^*, j^*) &\quad \Rightarrow \quad \begin{bmatrix} Z_i^T \\ Z_j^T \end{bmatrix} \hat{x}_{ij} \not\approx \begin{bmatrix} \hat{z}_i^- \\ \hat{z}_j^+ \end{bmatrix}
 \end{aligned}$$

Summary: Observer design

1. Run partial state observers for

$$\dot{z}_p = Z_p^T A_p Z_p z_p + Z_p^T B_p u$$

$$y = C_p Z_p z_p + D_p u$$

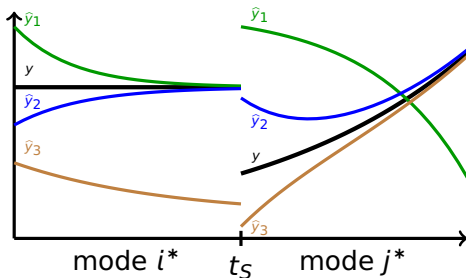
$$\text{im } Z_p := \text{im } O_p^T$$

on $(t_s - \tau, t_s)$ and $(t_s, t_s + \tau)$

↪ reasonable mode pairs (i, j) and partial state estimates \hat{z}_i^-, \hat{z}_j^+

2. Calculate candidate full state estimations $\hat{x}_{ij} = \begin{bmatrix} Z_i^T \\ Z_j^T \end{bmatrix}^\dagger \begin{pmatrix} \hat{z}_i^- \\ \hat{z}_j^+ \end{pmatrix}$

↪ choose unique $(i, j) = (i^*, j^*)$ for which $\begin{bmatrix} Z_i^T \\ Z_j^T \end{bmatrix} \hat{x}_{ij} \approx \begin{bmatrix} \hat{z}_i^- \\ \hat{z}_j^+ \end{bmatrix}$



Discussion and Extensions

- › Novel observability notion: *Switch observability*
 - Assumes that **at least one switch** occurs
 - Individual modes can have **unobservable states**
 - Better suited for **fault-induced switches**

- › Novel observer-design suited to switch-observable systems
 - Based on **partial state observers**
 - **Linear costs** in number of possible faults
 - Extension to **switched DAEs** possible

 - Knowledge of **switching time** assumed
 - Unavoidable **time delay** until result is available
 - Choice of specific left-inverse of $[Z_i, Z_j]^T$ **crucial for performance**