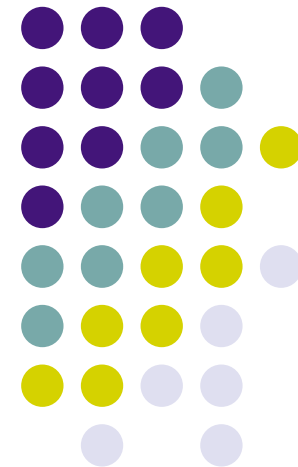


# Networked Control Systems:

an emulation approach to controller design

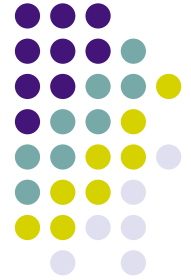


Dragan Netic  
The University of Melbourne  
Electrical and Electronic  
Engineering



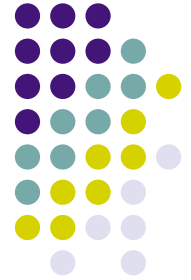
Acknowledgements:

My collaborators: A.R. Teel, M. Tabbara, D. Dacic, D. Liberzon, M. Heemels, N. van de Wouw, D. Carnevale, R. Postoyan, T. Kameneva, P. Tabuada, A. Anta



# Outline:

- Motivation & background
- Emulation for NCS (NCS model)
- NCS protocols
- Main result with remarks
- An example
- Extensions
- Summary



# Background

- Control loop closed via LAN - increasingly used
- Packet based communication (no quantization)
- Fly-by-wire aircraft; drive-by-wire cars; and so on

## Pros:

- Easier maintenance & installation
- Lower cost, weight and volume

## Cons:

- Design harder: hybrid, delays, dropouts
- Performance may deteriorate



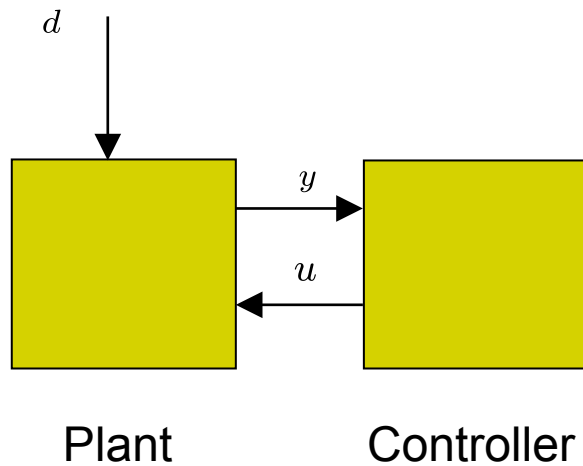
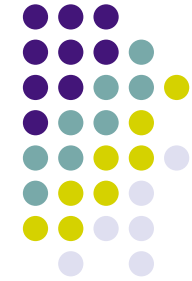
# Motivation

## CDS Panel Report, 2002:

*“Control distributed across multiple computational units, interconnected through packet based communications, will require new formalisms for ensuring stability, performance and robustness.”*

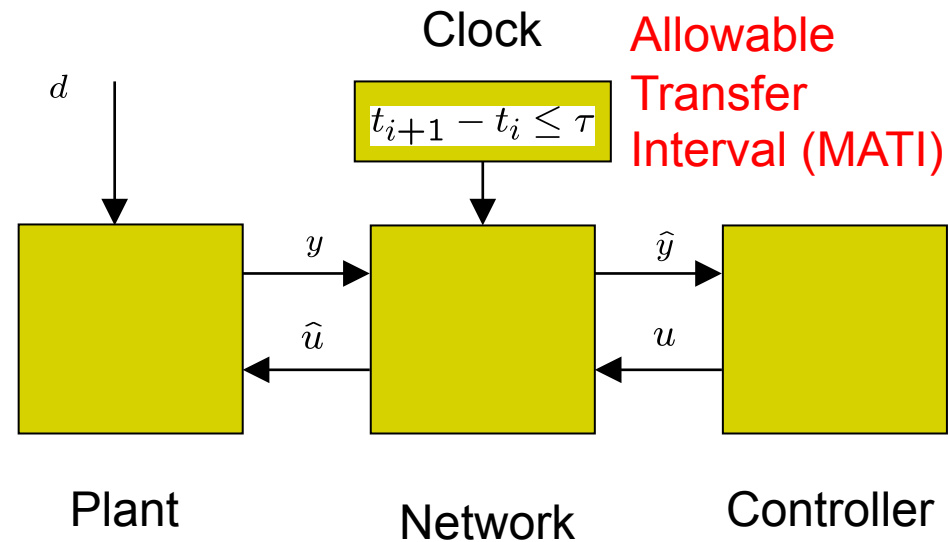
Our goal: present an approach for achieving stability, performance & robustness ( $L_p$  stability or ISS).

# Classical vs Networked



Classical Control System

*Point-to-point dedicated connections*



Networked Control System

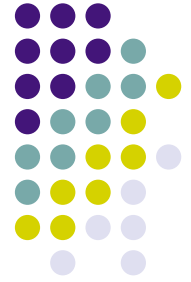
*Serial bus/channel connection*

$\tau$ - Maximum Allowable Transfer Interval (MATI)



## We concentrate on:

- Varying sampling periods - item (i)
- Network effects (scheduling) – item (iv)
- Delays, dropouts, quantization ignored but can be dealt with within the same framework.



# An emulation approach

# Background

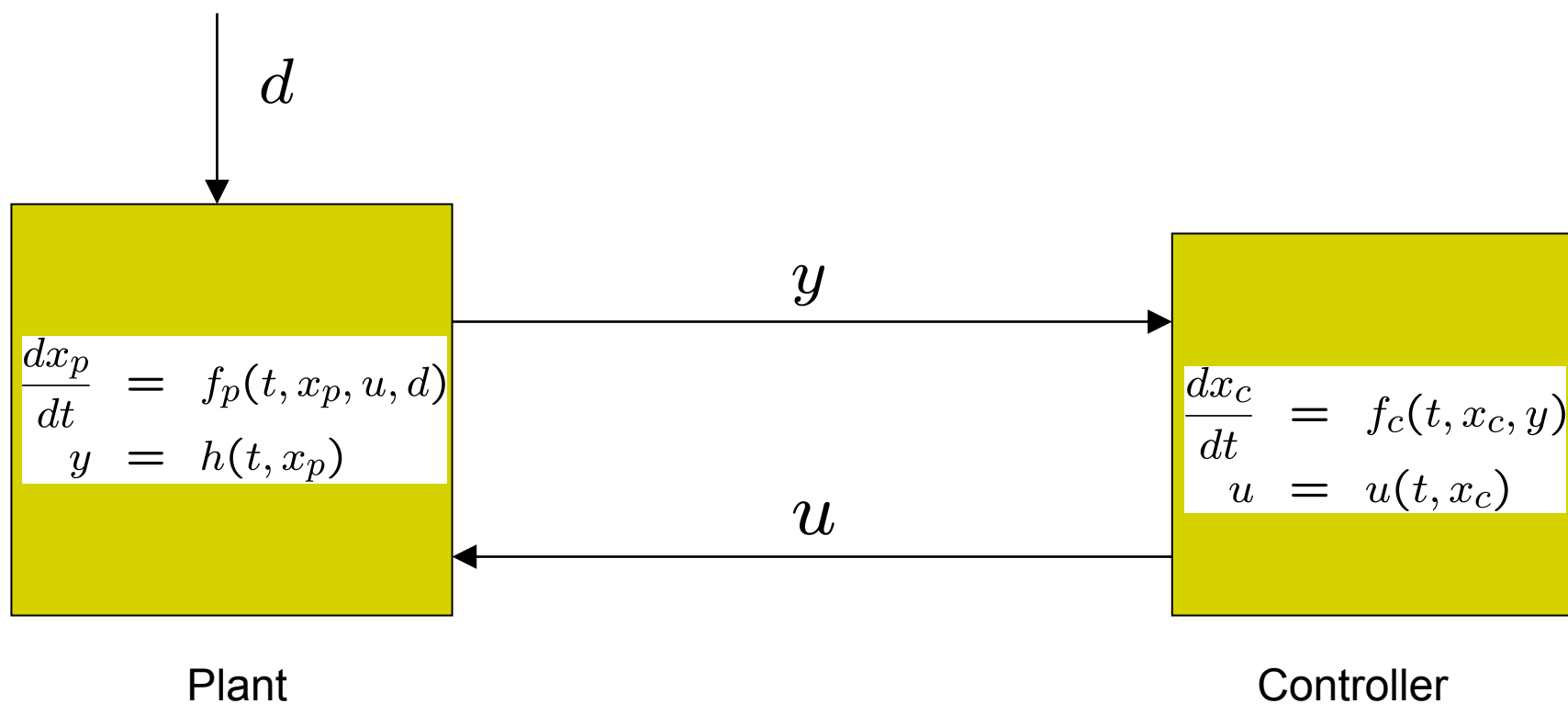


- Proposed by Walsh et al.,  
(IEEE TAC 2001 & IEEE TCST 2002).
- Further developed by Netic & Teel,  
(IEEE TAC 2004 & Automatica 2004).
- A generalization of sampled-data systems
- Numerous extensions summarized later.





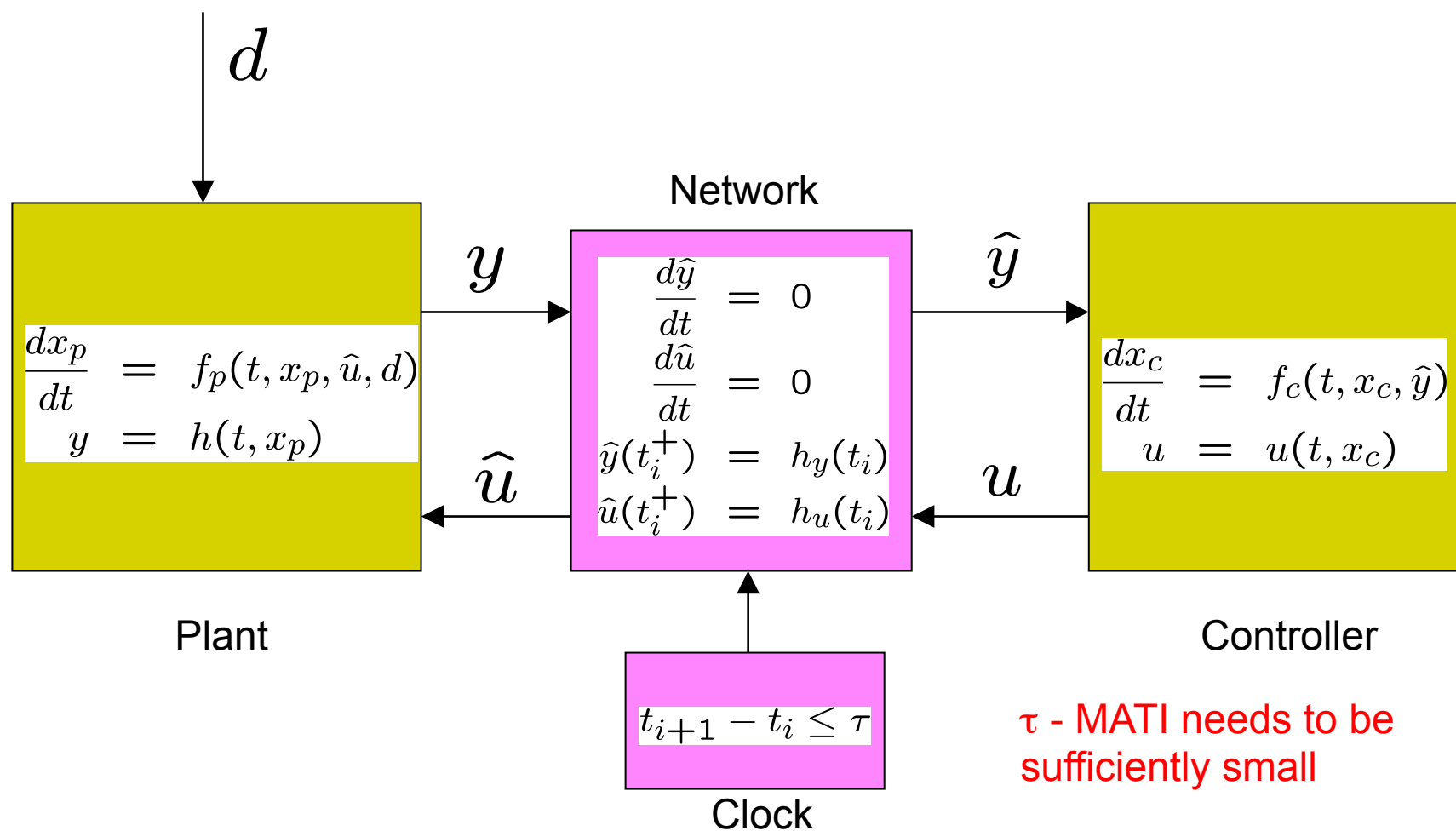
**Step 1:** Design the controller ignoring the network.





**Step 2a:** Implement the same controller over network

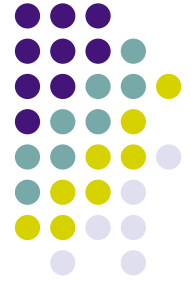
**Step 2b:** Find sufficiently small MATI so that the closed loop system is stable in an appropriate sense.



$\tau$  - MATI needs to be sufficiently small

# Impulsive model of NCS

(Nesic & Teel, IEEE TAC 2004)



$$\Sigma_x : \quad \frac{dx}{dt} = f(t, x, e, d) \quad t \in [t_i, t_{i+1}]$$

$$\Sigma_e : \quad \frac{de}{dt} = g(t, x, e, d) \quad t \in [t_i, t_{i+1}]$$

$$\Sigma_p : \quad e(t_i^+) = h(i, e(t_i))$$

$$\Sigma_c : \quad 0 < \epsilon \leq t_{i+1} - t_i \leq \tau$$

$$x := \begin{pmatrix} x_p \\ x_c \end{pmatrix} \quad e := \begin{pmatrix} \hat{y} - y \\ \hat{u} - u \end{pmatrix}$$

The jump equation  $\Sigma_p$  describes a “protocol”



## Goal:

- Provide checkable conditions on  $\Sigma_x$ ,  $\Sigma_e$ ,  $\Sigma_p$  and  $\Sigma_c$  that guarantee stability.
- The conditions on  $\Sigma_p$  should cover a range of protocols.
- Small MATI is essential in implementing the emulated controller – we provide estimates that guarantee stability.



# NCS Protocols



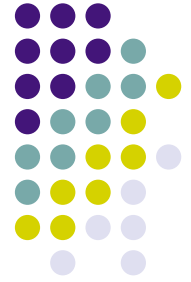
# Main assumption

- Network protocol arbitrates access to the network.
- “Node” is a group of inputs/outputs that are always transmitted together

$$e = \begin{pmatrix} e_1 \\ \vdots \\ e_\ell \end{pmatrix} \quad \ell - \text{the number of “nodes”}$$

**ASSUMPTION:** When a node  $k$  gets access to the network at time  $t_j$ , then we have

$$e_k(t_j^+) = 0$$



# Protocol models

- A large class of protocols has the form:

$$h(i, e) = (I - \Psi(s))e; \quad s = s(i, e)$$

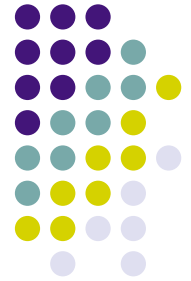
$$\Psi(s) := \text{diag}\{\delta_{1s}I_{n_1}, \dots, \delta_{\ell s}I_{n_\ell}\}$$

$I_{n_j}$  are the identity matrices

$\delta_{is}$  are Kronecker symbols

$s : N \times R^{n_e} \rightarrow \{1, \dots, \ell\}$  is the scheduling function

# Example 1: Round robin (RR)



- Suppose we have 2 nodes.

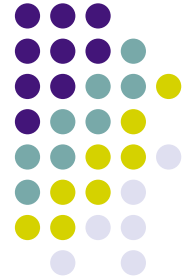
$$h(i, e) = \begin{cases} \begin{pmatrix} 0 \\ e_2 \end{pmatrix}; & i = 0, 2, 4, \dots \\ \begin{pmatrix} e_1 \\ 0 \end{pmatrix}; & i = 1, 3, 5, \dots \end{cases}$$

- In this case  $s = s(i) = \begin{cases} 1 & \text{if } i \text{ is even} \\ 2 & \text{if } i \text{ is odd} \end{cases}$



# Example 2: Try-Once-Discard

(TOD) Walsh et al 2001



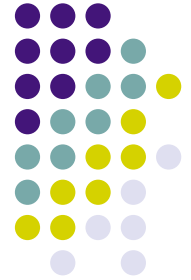
- Suppose we have 2 nodes.

$$h(i, e) = \begin{cases} \begin{pmatrix} 0 \\ e_2 \end{pmatrix}; & |e_1| \geq |e_2| \\ \begin{pmatrix} e_1 \\ 0 \end{pmatrix}; & |e_1| < |e_2| \end{cases}$$

- In this case  $s = s(e) = \min[\arg_i \max |e_i|]$

# UGES Protocols

(Nesic & Teel 2004)



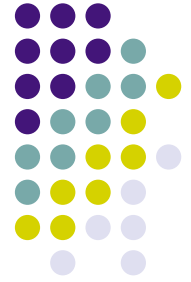
- We introduce an auxiliary system:

$$e^+ = h(i, e)$$

**Protocol is W-UGES** if there exist  $W(i, e)$  and positive numbers  $a_1$ ,  $a_2$  and  $\rho \in [0, 1)$  such that for all  $(i, e)$  we have:

$$a_1|e| \leq W(i, e) \leq a_2|e|$$

$$W(i + 1, h(i, e)) \leq \rho \cdot W(i, e)$$



# Examples of UGES protocols

- RR protocol is UGES.
  - TOD protocol is UGES.
  - Many other protocols are UGES.
- 
- We construct Lyapunov functions for the above protocols, e. g. for TOD we have:

$$W(i, e) = |e|; \quad a_1 = a_2 = 1; \quad \rho = \sqrt{\frac{\ell - 1}{\ell}}$$



# Main result



## $\Sigma_x$ assumption

$\Sigma_x$  is  $L_p$  stable  $p \in [1, \infty]$  from  $(d, e)$  to  $x$  with gain  $\gamma$ .

- In other words, there exist  $K, \gamma \geq 0$  such that:

$$\|x[t_0, t]\|_p \leq K|x(t_0)| + \gamma\|e[t_0, t]\|_p + \gamma\|d[t_0, t]\|_p$$

$\forall x(t_0), d(\cdot), t \geq t_0$ .  $\gamma$  is the “gain”.

# $\Sigma_p$ assumption



$\Sigma_p$  is a W-UGES protocol.

- That is, the following holds for  $a_1, a_2 > 0$  and  $\rho \in [0, 1)$

$$a_1|e| \leq W(i, e) \leq a_2|e|$$

$$W(i + 1, h(i, e)) \leq \rho \cdot W(i, e)$$

# $\Sigma_e$ assumption



**W grows exponentially along  $\Sigma_e$  dynamics.**

- That is, there exist  $L, c \geq 0$  such that:

$$\left\langle \frac{\partial W}{\partial e}, g(t, x, e, d) \right\rangle \leq LW(i, e) + c|x| + c|d|$$

# $\Sigma_c$ assumption



**MATI is sufficiently small.**

- In other words, the following holds:

$$\tau < \tau^* := \frac{1}{L} \ln \left( \frac{L + \frac{c\gamma}{a_1}}{L\rho + \frac{c\gamma}{a_1}} \right)$$

- $\gamma$  from  $\Sigma_x$
- $a_1, \rho$  from  $\Sigma_p$
- $L, c$  from  $\Sigma_e$





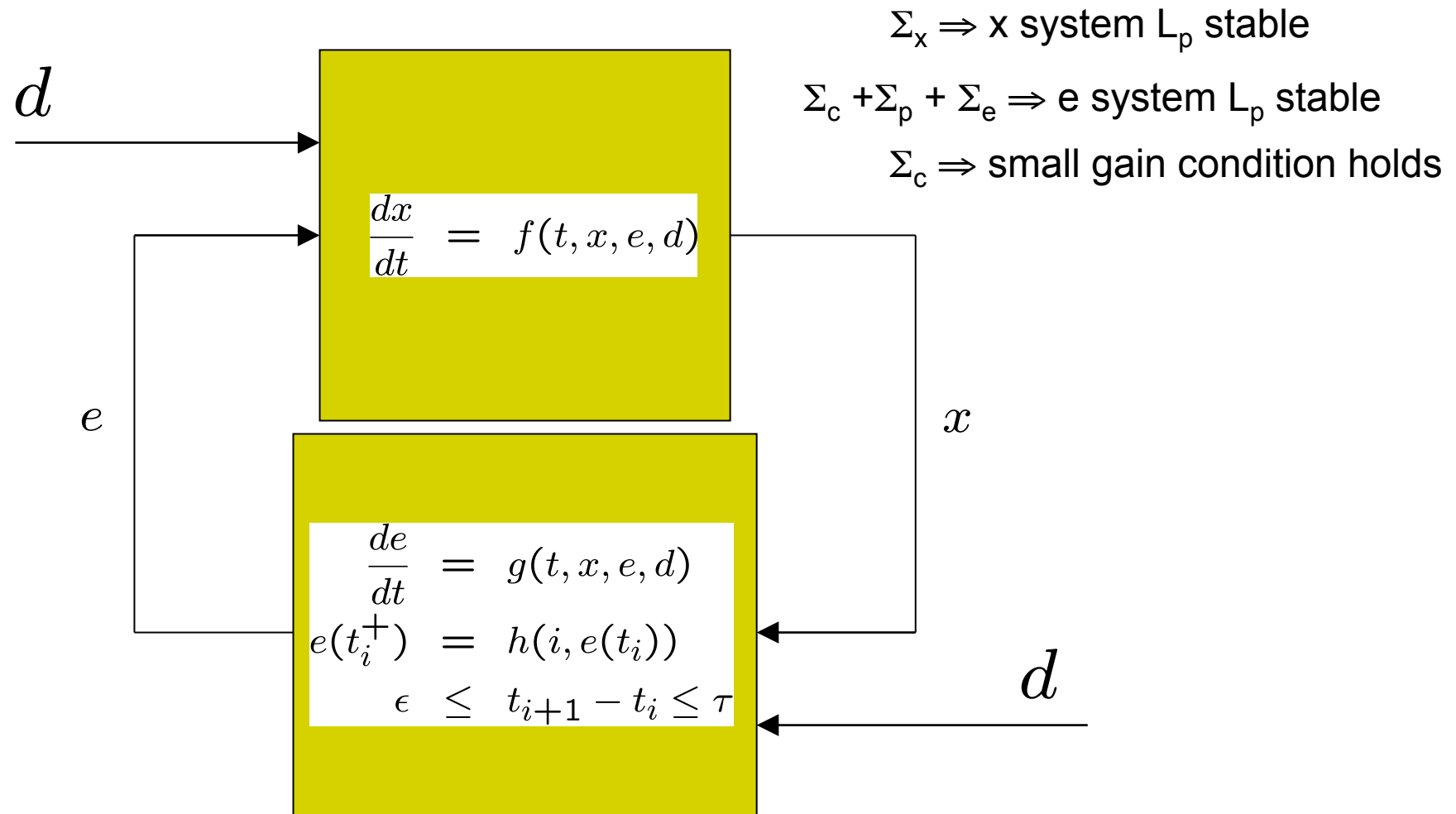
## Main result:

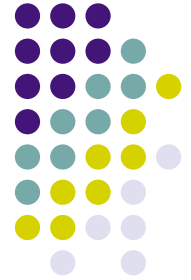
Suppose that:

1.  $\Sigma_x$  assumption holds;
2.  $\Sigma_p$  assumption holds;
3.  $\Sigma_e$  assumption holds;
4.  $\Sigma_c$  assumption holds.

Then, the NCS is  $L_p$  stable from  $d$  to  $(x, e)$ .

# Sketch of proof:





# Remarks

- MATI bound (clock!) depends on:
  - $\gamma$  determines robustness of  $x$  system
  - $L, c$  determine the inter-sample growth of  $W$
  - $\rho, a_1$  determine the properties of protocol
- Can conclude exponential stability when  $d=0$
- Can state ISS based results
- Can treat dropouts and regional results



## Remarks

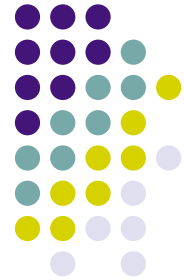
- A controller design framework achieving  $L_p$  stability proved for the first time for NCS
- Similar to emulation in sampled data design
- Attractive for its “modularity” (i.e. simplicity)
- The analysis involves computing MATI
- Our MATI bounds not conservative but can be further improved
- When MATI is reduced, non-networked performance is recovered



# Example

# Unstable batch reactor

(Green & Limebeer 1995)



- 4<sup>th</sup> order linear plant, 2<sup>nd</sup> order controller (MIMO)
- 2 outputs sent via the network

## MATI with TOD protocol:

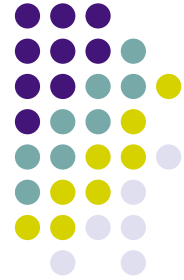
Walsh <i>et al</i>	Nesic & Teel	Simulations
0.00001 sec	0.01 sec	0.06 sec

## MATI with RR Protocol:

Walsh <i>et al</i>	Nesic & Teel	Analytical
0.00001 sec	0.0082 sec	0.0657 sec



# Extensions



# Extensions:

- ISS for NCS [Nesic & Teel, Automatica '04]
- Wireless NCS [Tabbara, Nesic, Teel, TAC '07]
- BMIs for stability [Dacic, Nesic, Automatica '07]
- BMIs for observers [Dacic, Nesic, Automatica '08]
- Lyapunov based proof [Carnevalle, Teel, Nesic TAC '07]
- Stochastic NCS [Hespahna, Teel '06]; [Tabbara, Nesic '08]
- Unified with quantized control [Nesic, Liberzon '07]
- Delays [Heemels, Teel, De Wouw, Nesic '08]; [Chaillet, Bicci '08]
- Observers [Postoyan & Nesic]
- Special cases [Hemels et al]
- Event driven sampling [Postoyan, Tabuada, Anta & Nesic]



# [Nesic & Teel, Automatica '04]



- UGAS protocols: there exist  $W(i,e)$ ,  $\alpha_1, \alpha_2 \in K_\infty$  and  $\rho \in [0, 1)$  such that for all  $(i,e)$

$$\alpha_1(|e|) \leq W(i, e) \leq \alpha_2(|e|)$$

$$W(i + 1, h(i, e)) \leq \rho W(i, e)$$

If  $\Sigma_p$  is UGAS,  $\Sigma_x$  is ISS and condition similar to  $\Sigma_e$  holds, then the networked closed-loop is semi-globally practically ISS in MATI.

# [Tabbara, Netic, Teel, TAC '07]



- Wireless protocols: the switching function can not depend on  $e$ :

$$\begin{aligned} e^+ &= (I - \Psi(s))e & s &= s(i, \hat{e}) \\ \hat{e}^+ &= \Lambda(i, \hat{e}, \Psi(s)e) \end{aligned}$$

If  $\Sigma_p$  is ***persistently exciting*** and conditions similar to  $\Sigma_x$ ,  $\Sigma_e$ ,  $\Sigma_c$  hold, then the NCS is  $L_p$  stable/ISS.

# [Dacic, Nesic, Automatica '07]



- Assume:
  - Plant is linear;
  - Controller is a linear dynamical system (to be designed);
  - Sampling period fixed;

If a certain BMI is feasible, then we design a TOD like protocol and controller so that the closed-loop is quadratically stable.

# [Carnevalle, Teel, Netic TAC'07]



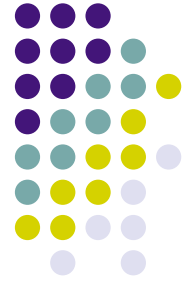
- Suppose:
  - We know  $L_2$  Lyapunov function for  $\Sigma_x$
  - We know Lyapunov function for  $\Sigma_p$
  - Condition similar to  $\Sigma_e$  holds

Then, for sufficiently small (better!) MATI we construct a Lyapunov function for NCS.

# [Hespahna & Teel '07] [Tabbara & Nestic TAC '07]

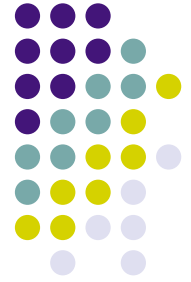


- Various stochastic versions of the presented results (e.g. control over Ethernet):
  - Plant and protocol are stochastic [Hespanha & Teel]
  - Plant is deterministic but protocol is stochastic [Tabarra & Nestic]



## [Nesic & Liberzon '07]

- A unifying framework for systems involving quantization and time scheduling.
- Cross-fertilization:
  - UGES/UGAS quantization protocols.
  - Small gain proof.
  - Combined quantization and time scheduling protocols, e.g. TOD + zooming protocols.
  - MATI bounds explicit.



# Summary

- $L_p$  stability proved (stability, performance & robustness)
- Our results can be used as a framework for controller and/or protocol design in NCS
- Novel proof technique yields much better bounds on MATI
- Goal: develop systematic designs for NCS
- Various extensions & improvements available and being developed



Thank you!