

# Control of uncertain $(\max, +)$ -linear systems in order to decrease uncertainty.

WODES'10

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# Motivations

## Uncertain (max,+)-linear systems

- Input/output behavior  $h$  unknown
- Framed by an interval  
[ fastest behavior , slowest behavior ]  $\rightarrow [ \underline{h} , \overline{h} ]$
- Uncertainty (time and event) over the output  $y \in [ \underline{h}u , \overline{h}u ]$

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## Control synthesis problem

Decrease the uncertainty at the output of the system

- Upstream controller  $p$
- Fixed point of isotone mapping

# Outlines

## 1 Uncertain $(\max,+)$ -linear systems

- Introduction
- Linear modelling

## 2 Control synthesis problem

- Uncertain controlled system
- Reduction of the uncertainty
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## Theory of $(\max,+)$ -linear systems <sup>1</sup>

- Discrete Event Dynamic Systems (DEDS) characterized by delay and synchronization phenomena

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- Application areas: manufacturing systems, computing networks <sup>2</sup>, transportation systems <sup>3</sup>

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## Idempotent semiring

Set  $\mathcal{D}$  endowed with two inner operations

- $\oplus \rightarrow$  associative, commutative, idempotent ( $a \oplus a = a$ )  
neutral element  $\varepsilon$
- $\otimes \rightarrow$  associative, distributes over the sum  
neutral element  $e$

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## Second example: $\mathcal{M}_{in}^{ax}[[\gamma, \delta]]$

- Quotient of  $\mathbb{B}[[\gamma, \delta]]$  by  $(\gamma \oplus \delta^{-1})^*$

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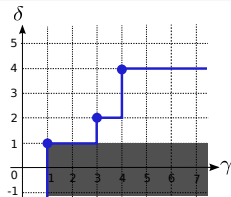
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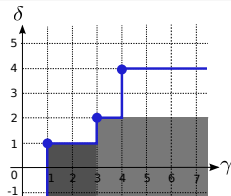
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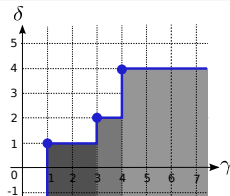
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## DEDS linear modelling on $\mathcal{M}_{in}^{ax}[\gamma, \delta]$

- $\gamma^n \delta^t \rightarrow$  *the  $n^{\text{th}}$  event occurs at earliest at time  $t$*

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Input/output relation

$$y = hu = CA^*Bu$$

where  $h$  is the transfer function of the system

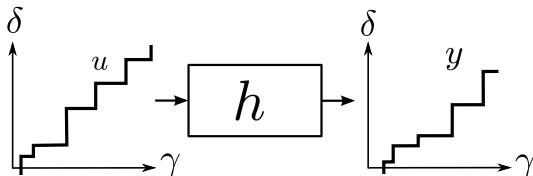
$h$  is periodic and causal



## Exact system

$u$ ,  $y$  and  $h$  are known

$u$  and  $y \rightarrow$  trajectories event / time



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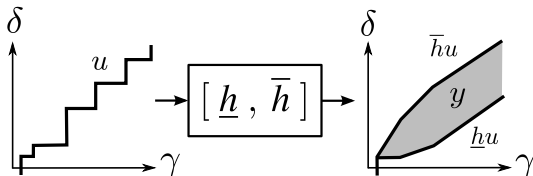
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- $u$  exact
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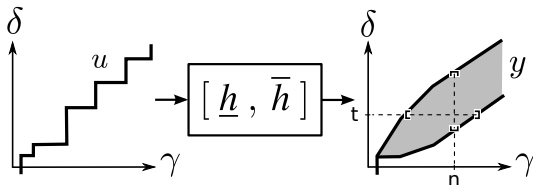
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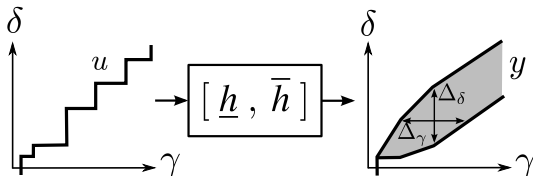
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## Maximal uncertainty

- event domain:  $\Delta_\gamma$
- time domain:  $\Delta_\delta$

## Computation of this uncertainty <sup>4</sup>

Maximal uncertainty over  $y$  for all  $u$ :  $\bar{h} \oslash \underline{h}$

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Residuation theory:  $a \oslash b$  is the optimal solution to inequality  $a \otimes x \preceq b$   
 $\oslash \rightarrow$  left quotient

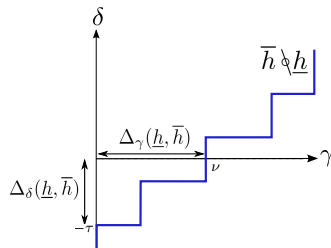
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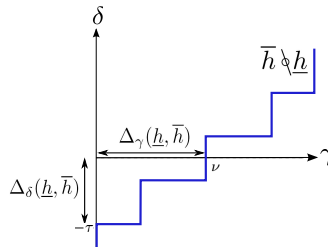
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$$\bullet \gamma^\nu \delta^0 \in \bar{h} \oslash \underline{h} \rightarrow \nu = \Delta_\gamma(\underline{h}, \bar{h})$$

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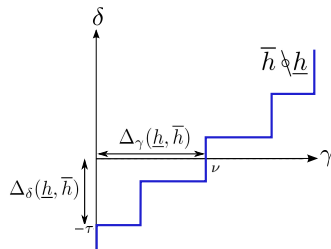
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- $\gamma^0 \delta^{-\tau} \in \bar{h} \oslash \underline{h} \rightarrow \tau = \Delta_\delta(\underline{h}, \bar{h})$

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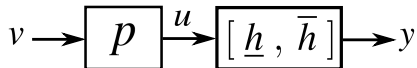
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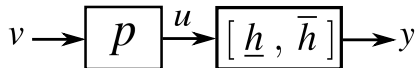
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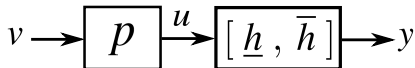
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## Influence of a controller over an uncertain system

- Upstream controller  $p$  ( $u = pv$ )
- Exact (max,+)-linear system (filter)
- Possible decreasing of the uncertainty

$$\begin{aligned}\Delta_\gamma(\underline{h}, \bar{h}) &\geq \Delta_\gamma(\underline{hp}, \bar{hp}) \\ \Delta_\delta(\underline{h}, \bar{h}) &\geq \Delta_\delta(\underline{hp}, \bar{hp})\end{aligned}$$



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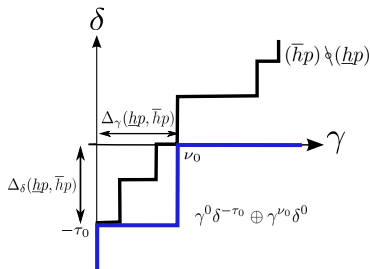
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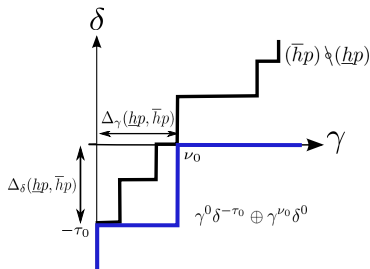
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$$\Leftrightarrow (\bar{hp}) \oslash (\underline{hp}) \succeq \gamma^0 \delta^{-\tau_0} \oplus \gamma^{\nu_0} \delta^0$$

- Greatest controller  $\hat{p}$  (just in time criterion)



## Knaster-Tarski theorem

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If  $f$  admits a fixed point  $x \in \mathcal{F}_f$

→ convergence toward the greatest fixed point  $\hat{y} = x_m \preceq val$

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Optimal controller  $\hat{p}$

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## Proposition 2. Removal of the uncertainty ( $\nu_0 = \tau_0 = 0$ )

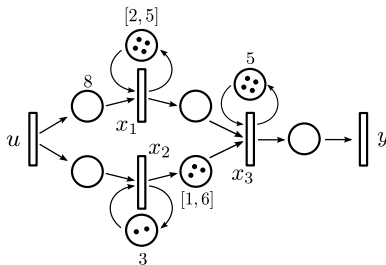
Optimal controller  $\hat{p} \preceq val$

$$\hat{p} = \bigoplus \{p \mid (\bar{h}p) \setminus (\underline{h}p) \succeq \gamma^0 \delta^0, p \text{ causal}, p \preceq val\}$$

is the greatest fixed point of

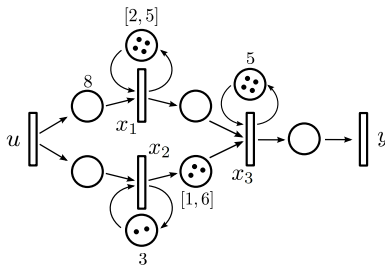
$$p = p \wedge \bar{h} \setminus (\underline{h}p) \wedge \text{Pr}_{\text{caus}}(p) \wedge val$$

## Uncertain Single Input Single Output system



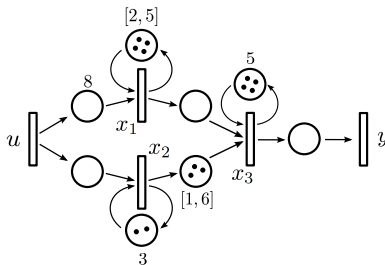
## Uncertain Single Input Single Output system

- Time variations



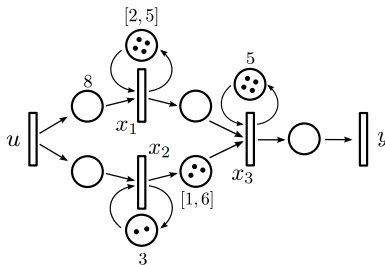
## Uncertain Single Input Single Output system

- Time variations
- Fastest behavior: minimum delays



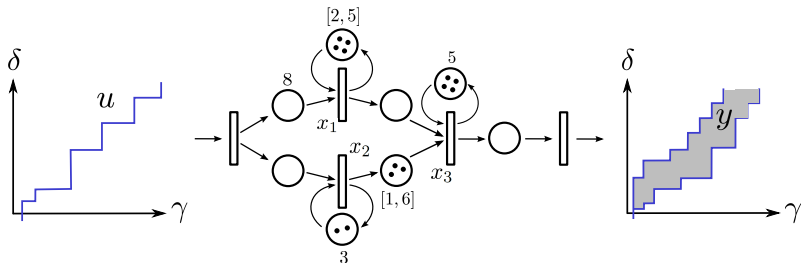
## Uncertain Single Input Single Output system

- Time variations
- Fastest behavior: minimum delays
- Slowest behavior: maximum delays



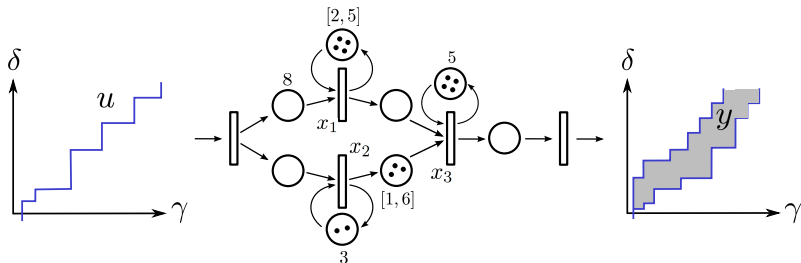
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## Maximal uncertainty

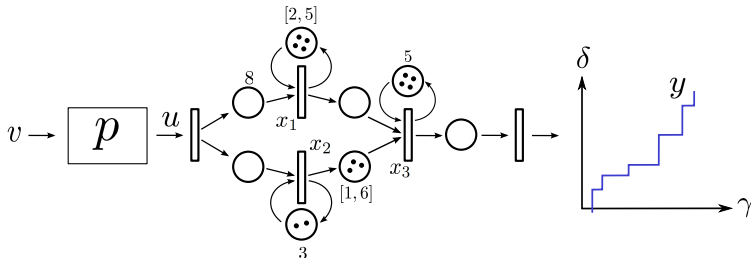
System alone

$$\Delta_{\gamma}(\underline{h}, \bar{h}) = 4 \quad \text{and} \quad \Delta_{\delta}(\underline{h}, \bar{h}) = 5$$



## Uncertain Single Input Single Output system

- Time variations
- Fastest behavior: minimum delays
- Slowest behavior: maximum delays



## Maximal uncertainty

### Controlled system

$$\Delta_{\gamma}(\underline{h}p, \bar{h}p) = 0 \quad \text{and} \quad \Delta_{\delta}(\underline{h}p, \bar{h}p) = 0$$

# Outlines

## 1 Uncertain $(\max,+)$ -linear systems

- Introduction
- Linear modelling

## 2 Control synthesis problem

- Uncertain controlled system
- Reduction of the uncertainty
- Application

## 3 Conclusions

## What have we done?

- Uncertain (max,+)-linear systems  $h \in [\underline{h}, \bar{h}]$

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- Uncertain (max,+)-linear systems  $h \in [\underline{h}, \bar{h}]$
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- Decreasing of the uncertainty at the output of the controlled system

Thank you for your attention ...

Questions ?

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