

# Control of Cyber-Physical Systems with Logic Specifications



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# Cyber-Physical Systems

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Cyber-Physical Systems (CPS) are physical, biological and engineered systems whose operations are monitored, coordinated, controlled and integrated by a computing and communication core

London CPS Workshop, 21<sup>st</sup> October 2012



# Critical aspects of CPS

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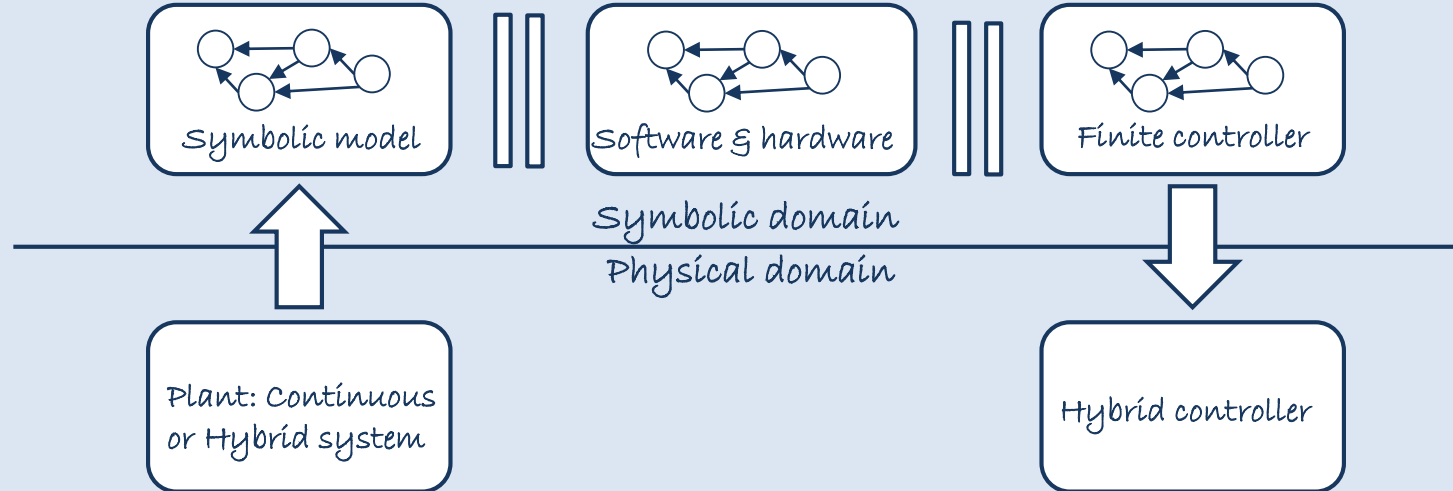
- Heterogeneity: plants, controllers and specifications described in different mathematical frameworks
- Non-ideal communication infrastructure: control action delivered with delay on the basis of delayed and corrupted measure of the states of the plants, lack of information (packet drops), etc.
- Complexity: large number of possibly distributed sub-systems
- Logic specifications
- ...



# Formal methods: a tool to homogenize heterogeneity ...

A three phases process :

- #1. Construct the finite/symbolic model  $T$  approximating the plant system  $P$
- #2. Design a finite/symbolic controller  $C$  that solves the specification  $S$  for  $T$
- #3. Refine the controller  $C$  to the controller  $C'$  to be applied to  $P$



## Advantages :

- Integration of software and hardware constraints in the control design of purely continuous or hybrid processes
- Relevant logic specifications can be addressed

# Plant and controller

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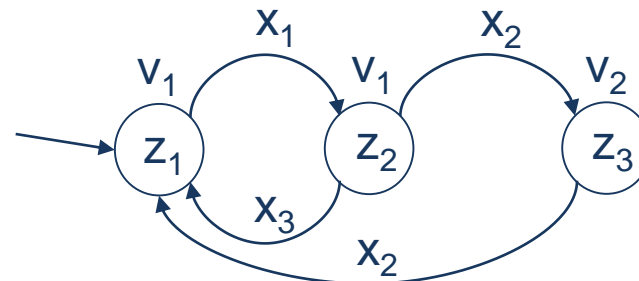
- Plant:

$$P: \begin{cases} \dot{x}(t) = f(x(t), u(t)) \\ x(t) \in \mathbb{R}^n, u(t) \in U \subset \mathbb{R}^m \end{cases}$$

$U$  finite set

$x(t, x_0, u)$  state reached at time  $t$  with initial state  $x_0$  and control input  $u$

- Controller C: Finite State Machine



inputs of C: quantized measurements of the state of P

outputs of C: control signal  $v(k)$  to be inferred to the plant P

- Controlled plant  $P^C$  obtained by coupling dynamics of P and C with

ZoH:  $\{u(t) = v(k), \forall t \in [k\tau, (k+1)\tau[, k \in \mathbb{N}$

$\tau > 0$  sampling time

# Logic specifications: Regular languages

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## Recall

- Let  $Y$  be a finite set representing an alphabet
- A word over  $Y$  is a finite sequence with symbols in  $Y$
- A language  $L$  over  $Y$  is a collection of words in  $Y$

## Definition

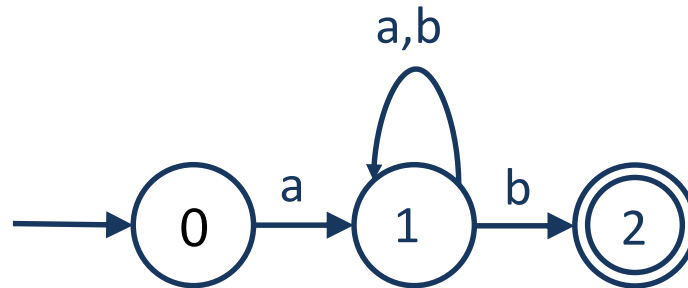
A language is regular if it can be represented by a Finite State Automaton (FSA)

## Example

$Y = \{ a, b \}$

$L =$  all words over  $Y$  starting with symbol  $a$  and ending with symbol  $b$

$L$  is regular because of existence of FSA:



# Logic specifications: Regular languages

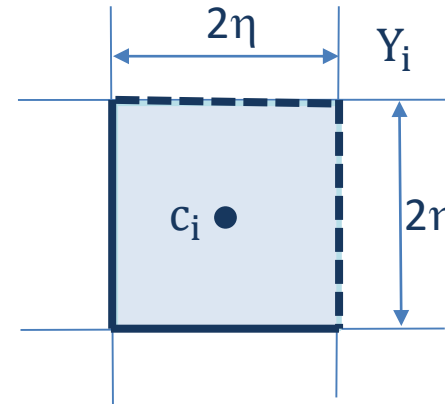
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Alphabet: collection  $Y$  of left-closed right-open hyper-cubes  $Y_i$  of  $\mathbb{R}^n$

$$Y_i = c_i + \prod_{i=1}^n [-\eta, \eta[$$

$$c_i \in 2\eta \mathbb{Z}^n$$

$Y$  is a partition of  $\mathbb{R}^n$



We consider a specification expressed as a regular language  $L_Q$  over  $Y$

## Specifications for CPS handled via regular language formalism :

- Reachability
- Controlled invariance in finite time horizon
- Obstacle avoidance in finite time horizon
- Motion planning
- Enforcing periodic orbits
- State-based switching specifications
- ...

# Control Problem Formulation

Given

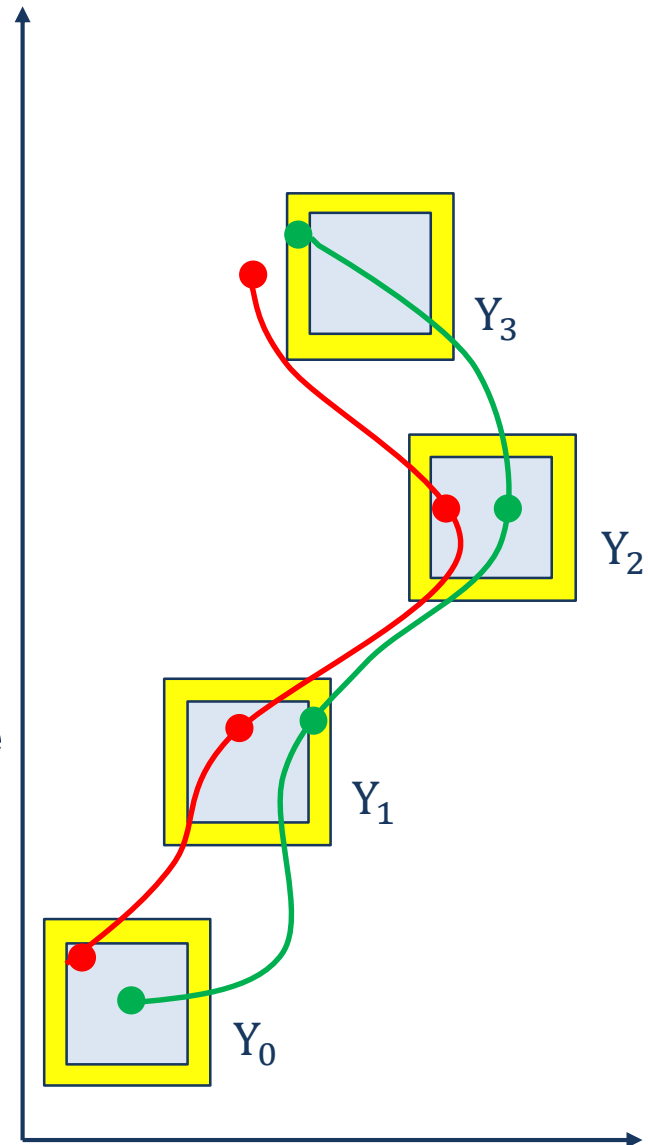
- the plant  $P$
- a sampling time  $\tau > 0$
- a regular language specification  $L_Q$
- a desired accuracy  $\theta > 0$

Find

- a controller  $C$  with set of initial states  $X_{c,0}$
- a relation of initial states  $R_0 \subseteq \mathbb{R}^n \times X_{c,0}$  of  $P^C$  such that the controlled plant  $P^C$  satisfies the specification  $L_Q$  up to the accuracy  $\theta$ , i.e.

for any trajectory  $x(\cdot)$  of  $P^C$  with  $(x(0), x_c(0)) \in R_0$ , there exists a word  $q_0 q_1 \dots q_{k_f}$  of  $L_Q$  such that

$$\|x(k\tau) - q_k\| \leq \theta, \forall k \in [0; k_f]$$





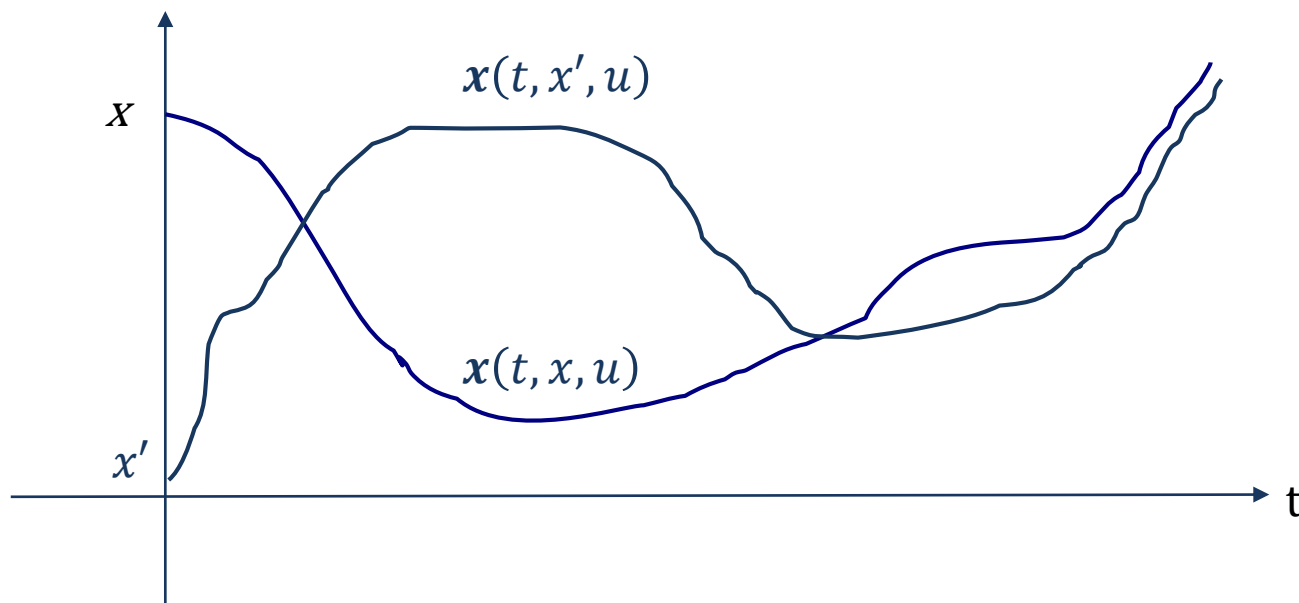
# Key assumptions on the plant P

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## Definition [Angeli, TAC-2002]

Plant  $P$  is incrementally globally asymptotically stable ( $\delta$ -GAS) if there exists a  $\mathcal{KL}$  function  $\beta: \mathbb{R}_0^+ \times \mathbb{R}_0^+ \rightarrow \mathbb{R}^+$  such that for any  $t \geq 0$ , any initial conditions  $x, x'$  and any input  $u$

$$\|x(t, x, u) - x(t, x', u)\| \leq \beta(\|x - x'\|, t)$$



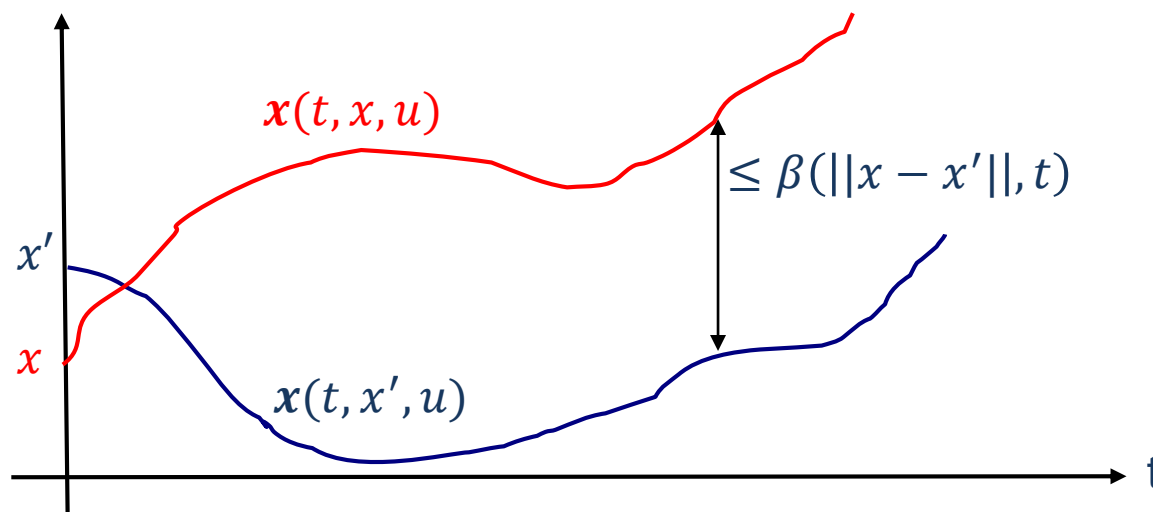
**Remark**  $\delta$ -GAS can be checked by using Lyapunov-like inequalities

# Key assumptions on the plant P

**Definition** [Zamani et al., TAC-2012]

Plant  $P$  is incrementally forward complete ( $\delta$ -FC) if there exists a continuous function  $\beta: \mathbb{R}_0^+ \times \mathbb{R}_0^+ \rightarrow \mathbb{R}^+$  such that for every  $s \in \mathbb{R}^+$ , function  $\beta(\cdot, s)$  belongs to class  $\mathcal{K}_\infty$  and for any  $x, x' \in \mathbb{R}^n$  and any  $u$

$$\|x(t, x, u) - x(t, x', u)\| \leq \beta(\|x - x'\|, t)$$



## Remarks

- Any (possibly unstable) linear system is  $\delta$ -FC
- $\delta$ -FC can be checked by using Lyapunov-like inequalities
- $\delta$ -GAS implies  $\delta$ -FC while the converse is not true

# Solution

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## Contribution

For  $\delta$ -FC (and hence  $\delta$ -GAS) plants, we designed algorithms solving the control problem for any desired sampling time  $\tau > 0$  and accuracy  $\theta > 0$

## Remarks

- Symbolic model  $T$  of  $P$  obtained by time and state space discretization of  $P$
- If  $P$  is  $\delta$ -GAS then  $T$  is an approximate bisimulation [5] of time discretization of  $P$
- If  $P$  is  $\delta$ -FC then  $T$  is an alternating approximate simulation [4] by time discretization of  $P$
- Design of controllers inspired by supervisory control algorithms
- *The «completeness property»:* If  $P$  is  $\delta$ -GAS then a control strategy enforces a given specification on  $P$  if and only if it can be found on  $T$  (guaranteed by approximate bisimulation)

Based on:

[1] Pola, G., Girard A., Tabuada, P., Approximately bisimilar symbolic models for nonlinear control systems, *Automatica*, 44(10):2508-2516, 2008

[2] Zamani, M., Pola, G., Mazo, M., Tabuada, P., Symbolic models for nonlinear control systems without stability assumptions, *IEEE Transactions on Automatic Control*, 57(7):1804-1809, July 2012

[3] Pola, G., Di Benedetto, M.D., Control of Cyber–Physical–Systems with Logic Specifications: A Formal Methods Approach, *Annual Reviews in Control*, 47(2019):178-192

[4] Pola, G., Tabuada, P., Symbolic models for nonlinear control systems: Alternating approximate bisimulations, *SIAM Journal on Control and Optimization*, 48(2):719-733, 2009

[5] Girard, A., Pappas, G.J., Approximation metrics for discrete and continuous systems. *IEEE Transactions on Automatic Control*, 52(5), 782–798, 2007

# Including more features of CPS

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- Stable nonlinear switched systems

TOOLS:  $\delta$ -UGAS and its check through common and multiple Lyapunov functions  
with Antoine Girard and Paulo Tabuada

- Stable nonlinear control systems with disturbance inputs

TOOLS:  $\delta$ -ISS, alternating approximate bisimulation and spline analysis  
with Paulo Tabuada, Alessandro Borri and Maria Domenica Di Benedetto

- Stable nonlinear time-delay systems

TOOLS:  $\delta$ -ISS,  $\delta$ -IDSS, alternating approximate bisimulation and spline analysis  
with Pierdomenico Pepe and Maria Domenica Di Benedetto

- Networked control systems

TOOLS: strong alternating approximate simulation and bisimulation  
with Alessandro Borri and Maria Domenica Di Benedetto

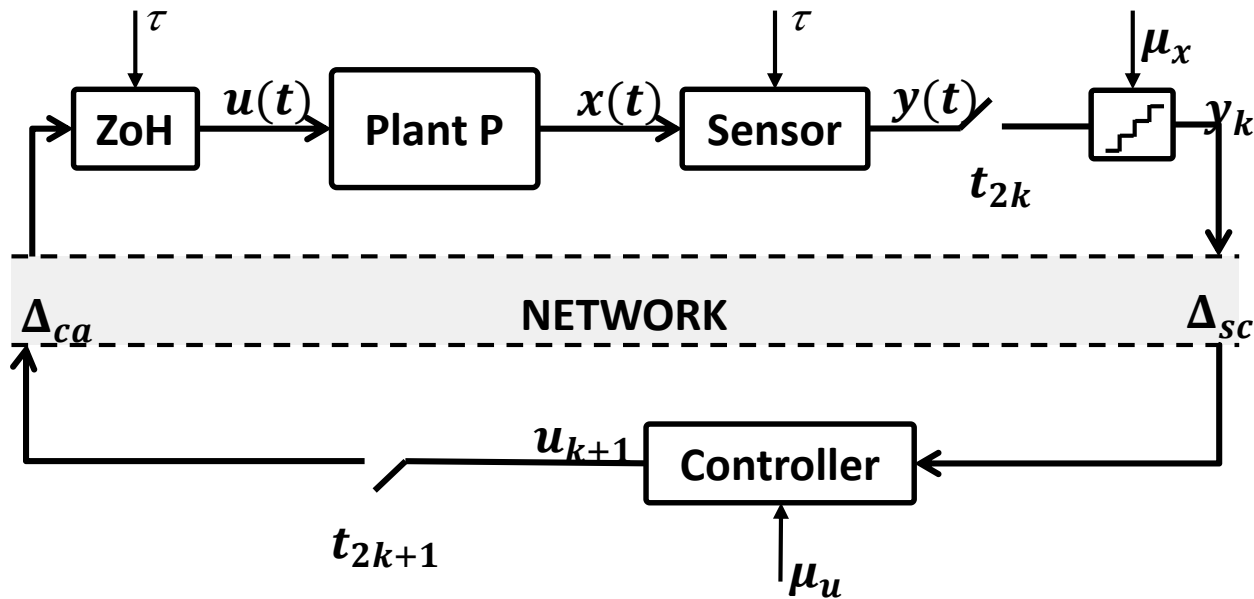
- Decentralized supervisory control

TOOLS: extensions of supervisory control to concurrent settings  
with Pierdomenico Pepe and Maria Domenica Di Benedetto

- Control design of stable nonlinear systems with outputs

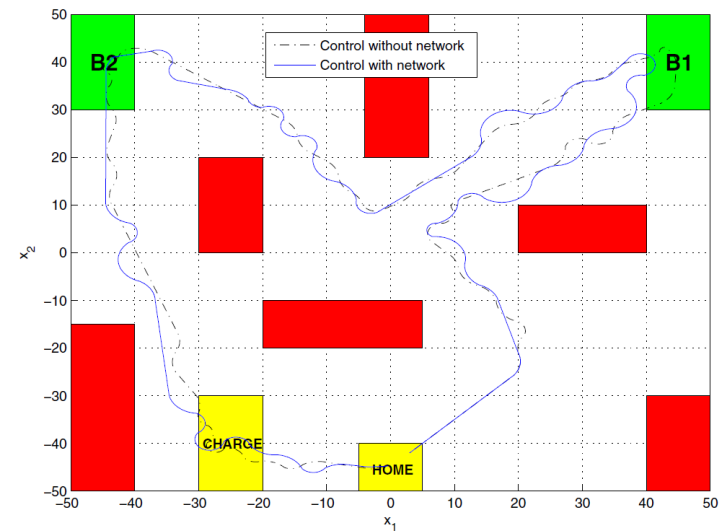
TOOLS:  $\delta$ -GAS, approximate bisimulation  
with Maria Domenica Di Benedetto and Alessandro Borri

# Networked control systems



Nonidealities considered:

- Quantization errors
- Bounded time-varying network access times
- Bounded time-varying communication delays induced by the network
- Limited bandwidth
- Bounded packet losses
- Bounded time-varying computation time of computing units



# Conclusions

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We proposed an approach based on formal methods for the control of CPS with logic specifications

Future work: Design of efficient control algorithms and their software implementation

Thanks!

# References on formal methods for the control of CPS

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