

# Controllo di assetto di un veicolo mediante modelli simbolici

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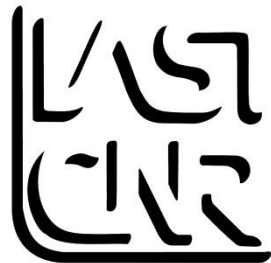
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- Modello del veicolo
- Tecniche di controllo simbolico per sistemi non lineari

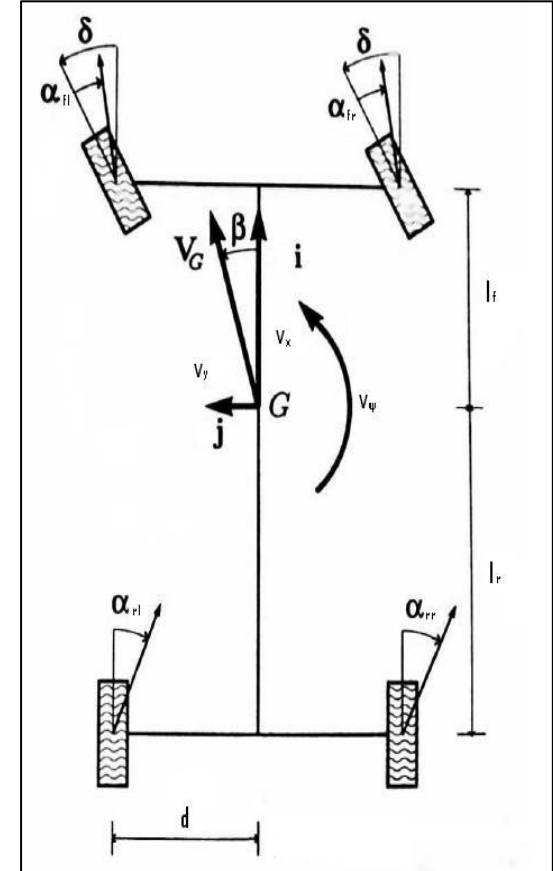


- I veicoli moderni sono **controllati elettronicamente** per assicurare la stabilità del mezzo e per fornire un sempre maggiore comfort al guidatore e ai passeggeri.
- Poiché le centraline (ECU) delle auto elaborano segnali digitali, un approccio diffuso consiste nell'elaborare leggi di controllo di tipo continuo e poi procedere a **campionamento** (nel tempo) e **discretizzazione** (sulle ampiezze) per ottenere segnali digitali.
- Il comportamento dei veicoli è validato in maniera puramente sperimentale su un numero finito di manovre, senza fornire garanzie di tipo più generale.



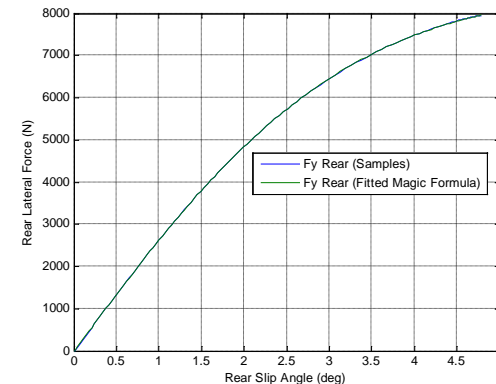
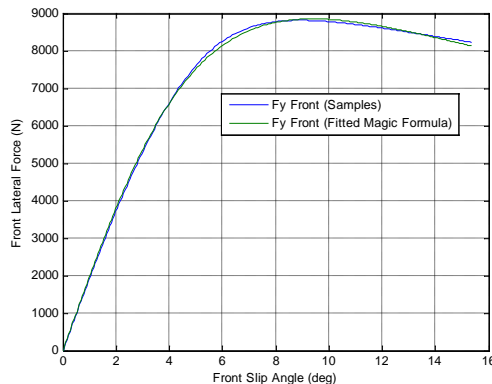


- Un approccio alternativo al controllo veicolo prevede l'utilizzo di metodi formali e **controllori simbolici** (finiti).
- La sintesi del controllore avviene direttamente nel **dominio discreto** (cioè la legge di controllo è digitale già in partenza) e le **prestazioni** sono **garantite in modo formale** con un'accuratezza decidibile a priori.
- Specifiche possibili: stabilità, inseguimento di traiettoria, ecc.
- **Vantaggi:**
  - ✓ Controllo quantizzato "in partenza"
  - ✓ Gestione nativa delle saturazioni
- **Svantaggi:**
  - X Complessità computazionale





- Modello monotraccia («a bicicletta») a 2 gradi di libertà (stati):
  - Velocità di imbardata (yaw rate)  $\omega_Z$
  - Velocità laterale  $v_y$
- Il modello è **non lineare**: le forze degli pneumatici sono funzioni non lineari degli angoli «di deriva» delle ruote





- Controllo tramite **Active Front Steering (AFS)**, che è un attuatore in grado di fornire sulle ruote anteriori un angolo di correzione rispetto a quello imposto dal guidatore.
- L'azione del controllo è limitata per garantire la guidabilità e il comfort del guidatore e dei passeggeri.
- La dinamica dell'attuatore è assunta lineare e si comporta come filtro passa-basso rispetto alla legge di controllo digitale (costante a tratti)



$$\dot{\omega}_z = \frac{F_{y,f}(\alpha_f)l_f - F_{y,r}(\alpha_r)l_r}{J}$$

yaw rate

$$\dot{v}_y = -v_x \omega_z + \frac{F_{y,f}(\alpha_f) + F_{y,r}(\alpha_r)}{m}$$

lateral velocity

$$\dot{\delta}_{AFS} = -\frac{1}{\tau_{AFS}} \delta_{AFS} + \frac{1}{\tau_{AFS}} u_c$$

AFS actuation

$$\alpha_f = \delta_{AFS} + \delta_{DRI} - \frac{v_y + l_f \omega_z}{v_x}$$

$$\alpha_r = -\frac{v_y - l_r \omega_z}{v_x}$$

$\delta_{DRI}$  = angolo driver

$\alpha_f, \alpha_r$  = angoli di deriva

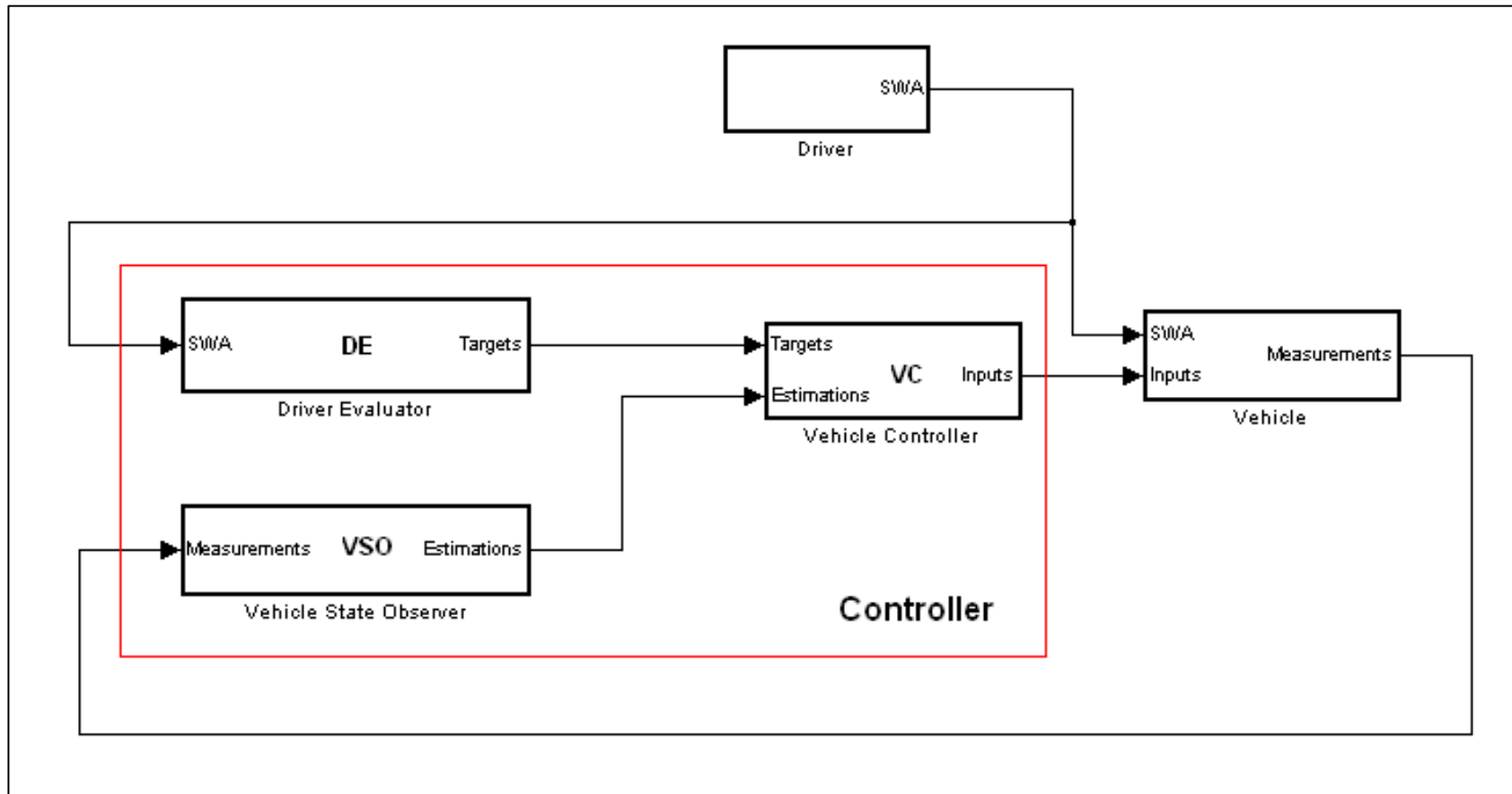
$l_f, l_r$  = semipassi

$v_x$  = velocità di avanzamento

$m$  = massa veicolo

$J$  = momento di inerzia veicolo

$\tau_{AFS}$  = costante di tempo attuatore







## Assunzioni:

- **Stato misurabile** (non consideriamo il design dell'osservatore).
- Il driver evaluator (o **riferimento**) è un sistema (assunto stabile) che modella il comportamento desiderato dal guidatore e prende come input l'ingresso del guidatore (imposto tramite lo sterzo).
- Il controllore simbolico, misurando l'azione del driver e lo stato del riferimento, genera un ingresso di controllo che porta il veicolo **vicino il più possibile al comportamento desiderato**.
- La **stabilità** del veicolo è garantita mantenendo gli angoli di deriva all'interno del tratto crescente delle caratteristiche dei pneumatici.

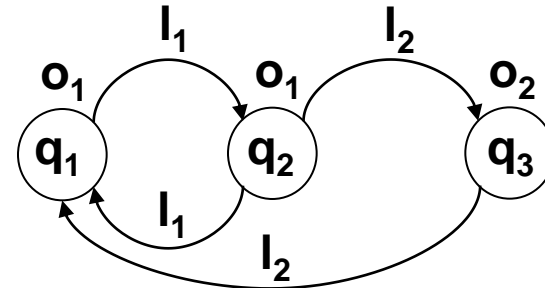


**Definition** A transition system is a tuple:

$$T = (Q, Q_0, L, \longrightarrow, O, H),$$

consisting of:

- a set of states  $Q$
- a set of initial states  $Q_0$
- a set of labels  $L$
- a transition relation  $\longrightarrow \subseteq Q \times L \times Q$
- an output set  $O$
- an output function  $H: Q \rightarrow O$



- $T$  is said countable if  $Q$  and  $L$  are countable sets
- $T$  is said symbolic/finite if  $Q$  and  $L$  are finite sets
- $T$  is non-blocking if for  $q \in Q$  there exists  $l \in L$  and  $q' \in Q$  such that  $(q, l, q') \in \longrightarrow$
- $T$  is deterministic if for any  $q \in Q$  and any  $l \in L$  there exists at most one state  $q' \in Q$  s.t.  $(q, l, q') \in \longrightarrow$

We will follow standard practice and denote  $(q, l, q') \in \longrightarrow$  by  $q \xrightarrow{l} q'$



A nonlinear control system  $\Sigma$

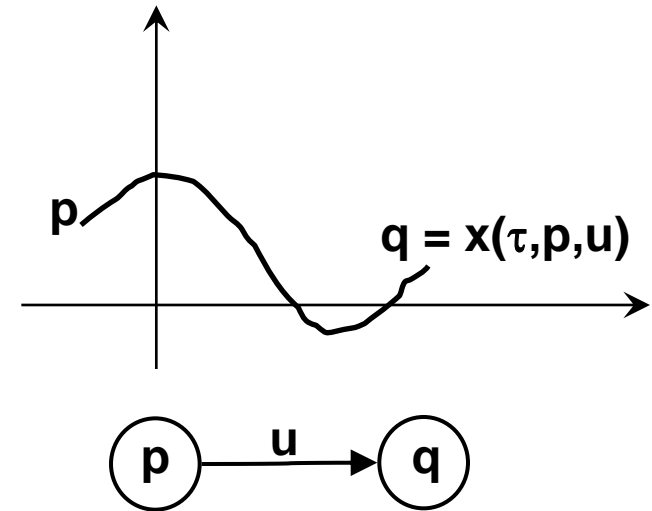
$$\frac{dx}{dt} = f(x, u), \quad x \in X \subseteq \mathbb{R}^n, \quad u \in U \subseteq \mathbb{R}^m$$

can be modeled by the transition system

$$T(\Sigma) = (X, X_0, U, \longrightarrow, Y, H),$$

where:

- $X_0 = X$  is a set of initial states
- $U$  is the collection of control signals  $u: \mathbb{R} \rightarrow U$
- $p \xrightarrow{u} q$ , if  $x(\tau, p, u) = q$  for some  $\tau \geq 0$
- $Y = X$
- $H$  is the identity function



$T(\Sigma)$  captures information contained in  $\Sigma$  but it is not a symbolic model because  $X$  and  $U$  are infinite sets!



A nonlinear control system  $\Sigma$

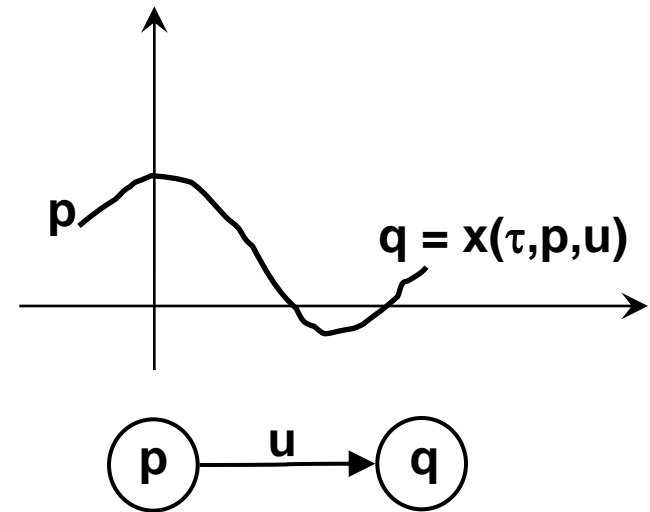
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**Software can be modelled by transition systems**

The states are all possible memory configurations and the transition relation describes how the memory contents are changed by the execution of instructions



We consider digital control systems, i.e. control systems where input signals are piecewise constant.

Consider a nonlinear digital control system

$$T(\Sigma) = (X, X_0, U, \longrightarrow, Y, H),$$

and given some  $\tau > 0$ , define the transition system

$$T_\tau(\Sigma) = (X, X_0, U_\tau, \longrightarrow_\tau, Y, H),$$

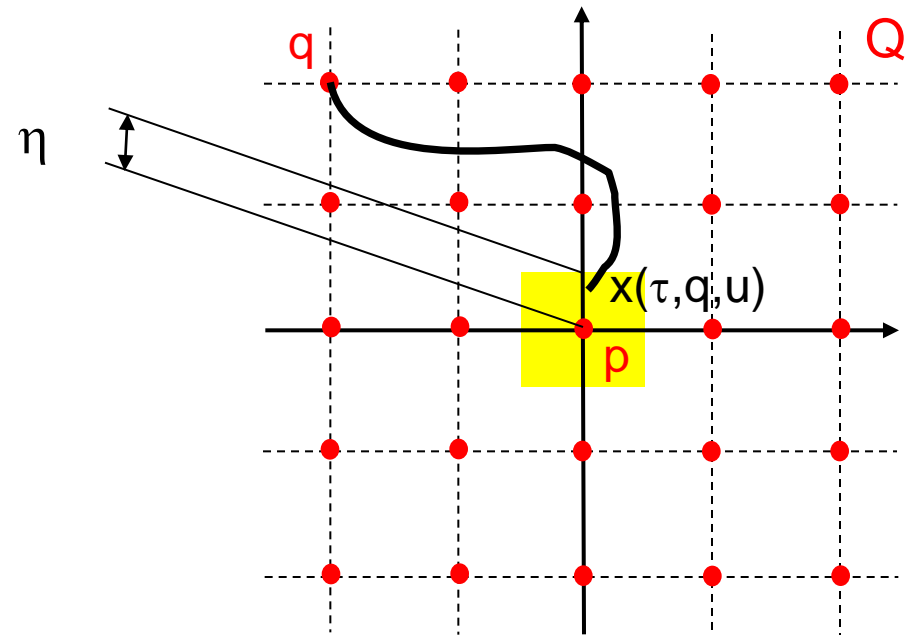
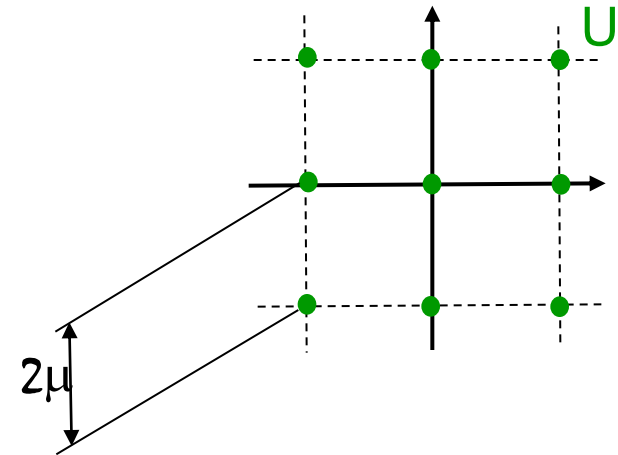
where:

- $U_\tau$  is the collection of constant functions  $u : [0, \tau] \rightarrow \mathbb{R}^m$
- $p \xrightarrow{u}_\tau q$  if  $x(\tau, p, u) = q$



Consider the following parameters:

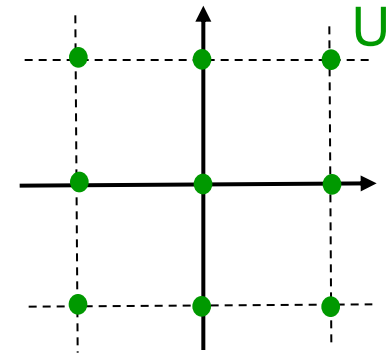
- $\tau > 0$  sampling time
- $\eta > 0$  state space quantization
- $\mu > 0$  input space quantization





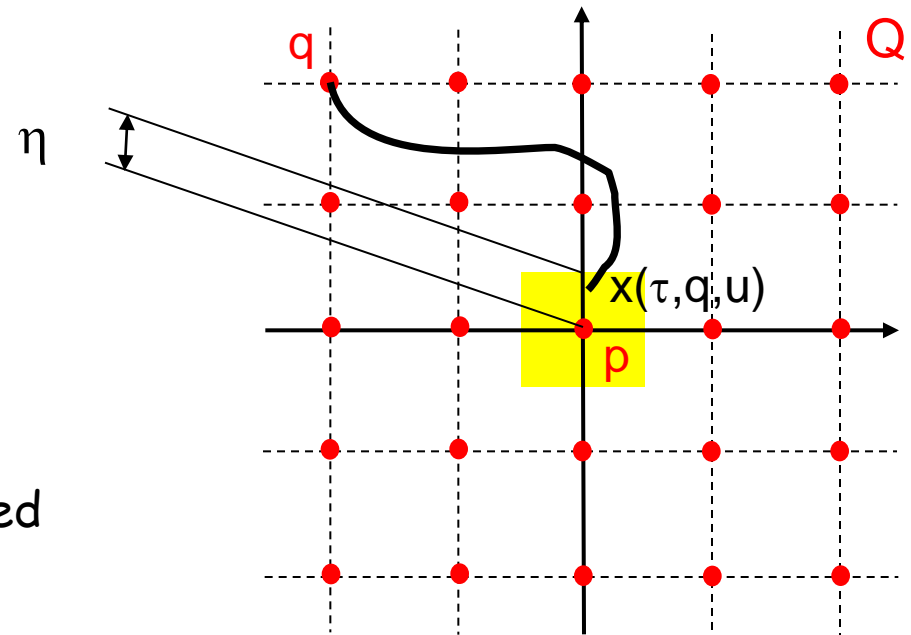
Consider the following parameters:

- $\tau > 0$  sampling time
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- $\mu > 0$  input space quantization



and define  $T_{\tau,\eta,\mu}(\Sigma) = (X_{\tau,\eta,\mu}, X_{0,\tau,\eta,\mu}, U_{\tau,\eta,\mu}, \longrightarrow_{\tau,\eta,\mu}, Y, H)$ , where:

- $X_{\tau,\eta,\mu} = [X]_{2\eta}$
- $X_{0,\tau,\eta,\mu} = X_{\tau,\eta,\mu} \cap X_0$
- $U_{\tau,\eta,\mu} = [U]_{2\mu}$
- $p \xrightarrow{u} \tau,\eta,\mu q$ , if  $\|x(\tau,p,u) - q\| \leq \eta$
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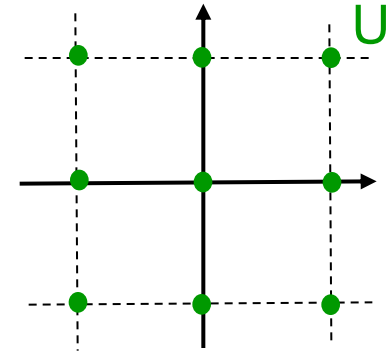
## Remark

Transition system  $T_{\tau,\eta,\mu}(\Sigma)$  is countable.  
 If state and input spaces of  $\Sigma$  are bounded  
 then  $T_{\tau,\eta,\mu}(\Sigma)$  is symbolic!



Consider the following parameters:

- $\tau > 0$  sampling time
- $\eta > 0$  state space quantization
- $\mu > 0$  input space quantization



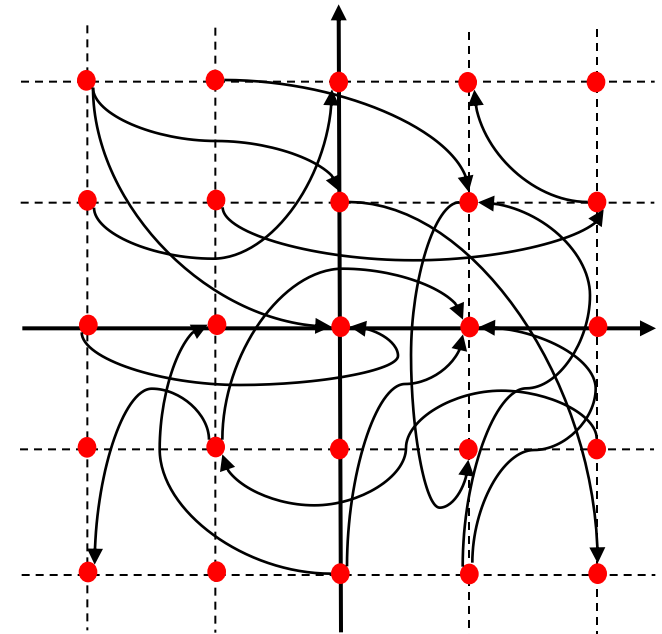
and define  $T_{\tau,\eta,\mu}(\Sigma) = (X_{\tau,\eta,\mu}, X_{0,\tau,\eta,\mu}, U_{\tau,\eta,\mu}, \xrightarrow{\tau,\eta,\mu}, Y, H)$ , where:

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- $X_{0,\tau,\eta,\mu} = X_{\tau,\eta,\mu} \cap X_0$
- $U_{\tau,\eta,\mu} = [U]_{2\mu}$
- $p \xrightarrow{u}_{\tau,\eta,\mu} q$ , if  $\|x(\tau,p,u) - q\| \leq \eta$
- $Y = X$
- $H$  is the identity function

**Theorem** If  $\Sigma$  is  $\delta$ -ISS, for any desired precision  $\varepsilon > 0$  and for any  $\tau, \eta, \mu > 0$  satisfying

$$\beta(\varepsilon, \tau) + \eta + \gamma(\mu) \leq \varepsilon$$

then  $T_{\tau}(\Sigma)$  and  $T_{\tau,\eta,\mu}(\Sigma)$  are  $\varepsilon$ -bisimilar

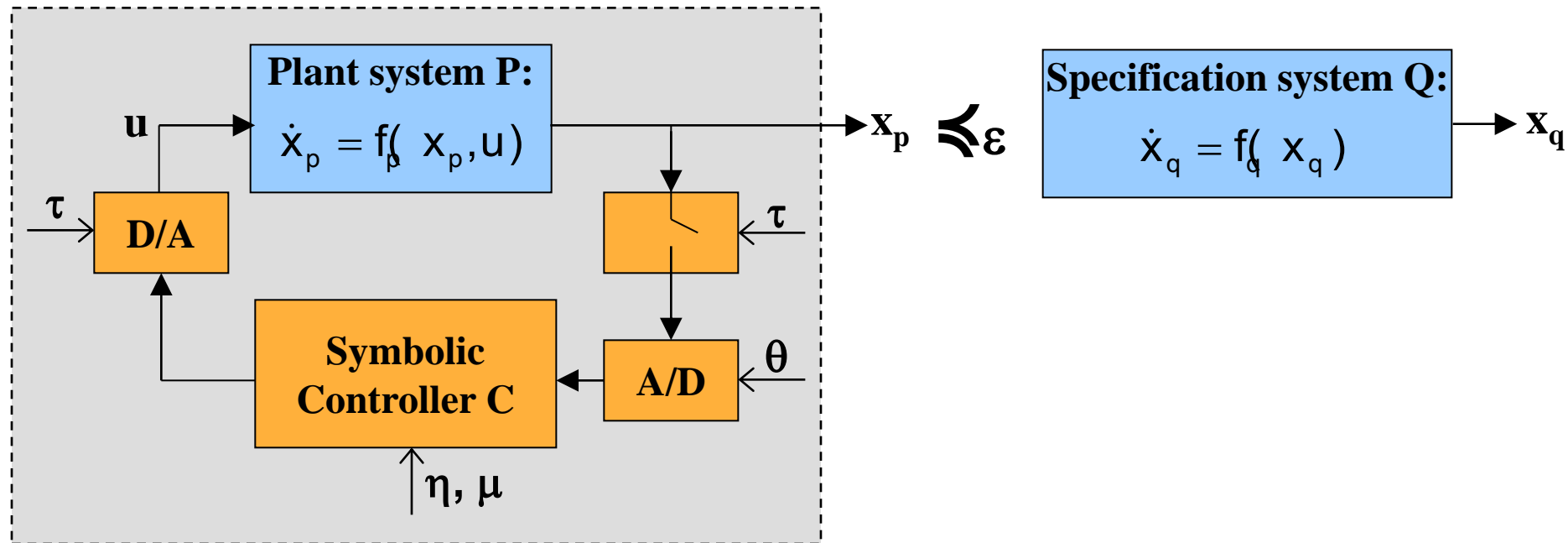






## Problem 1: Continuous Specifications [cf. Borri, Pola, Di Benedetto, CDC 2010]

Given a plant  $P$ , a specification  $Q$  and a desired precision  $\varepsilon > 0$ , find a symbolic controller that implements  $Q$  up to the precision  $\varepsilon$  and that is non-blocking when interacting with  $P$ .



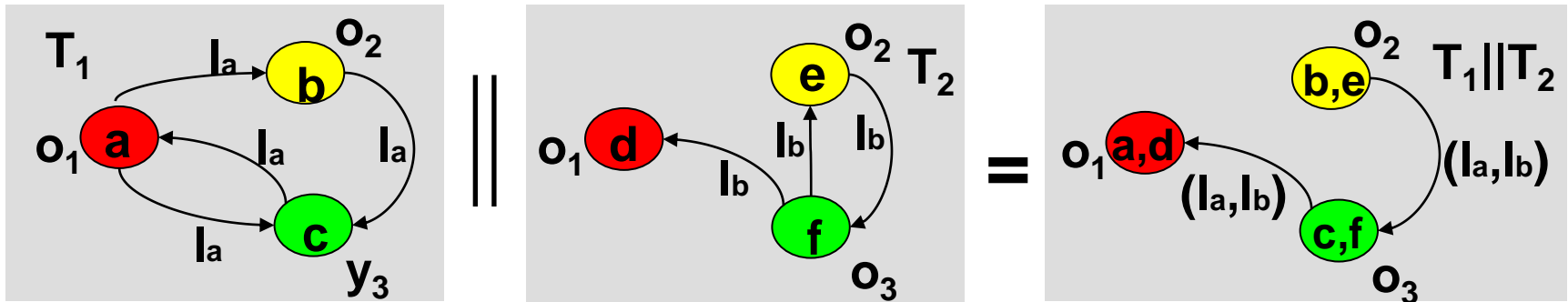


**Definition** Given  $T_1 = (Q_1, Q_{01}, L_1, \longrightarrow_1, O_1, H_1)$  and  $T_2 = (Q_2, Q_{02}, L_2, \longrightarrow_2, O_2, H_2)$ , with  $O_1 = O_2$ , and a precision  $\theta > 0$ , the approximate composition of  $T_1$  and  $T_2$  is the system

$$T = T_1 ||_{\theta} T_2 = (Q, Q_0, L, \longrightarrow, O, H)$$

where:

- $Q = \{(q_1, q_2) \in Q_1 \times Q_2 : d(H_1(q_1), H_2(q_2)) \leq \theta\}$
- $Q_0 = Q \cap (Q_{01} \times Q_{02})$
- $L = L_1 \times L_2$
- $(q_1, q_2) \xrightarrow{l_1, l_2} (p_1, p_2)$ , if  $q_1 \xrightarrow{l_1} p_1$  and  $q_2 \xrightarrow{l_2} p_2$
- $O = O_1 = O_2$
- $H(q_1, q_2) = H_1(q_1)$

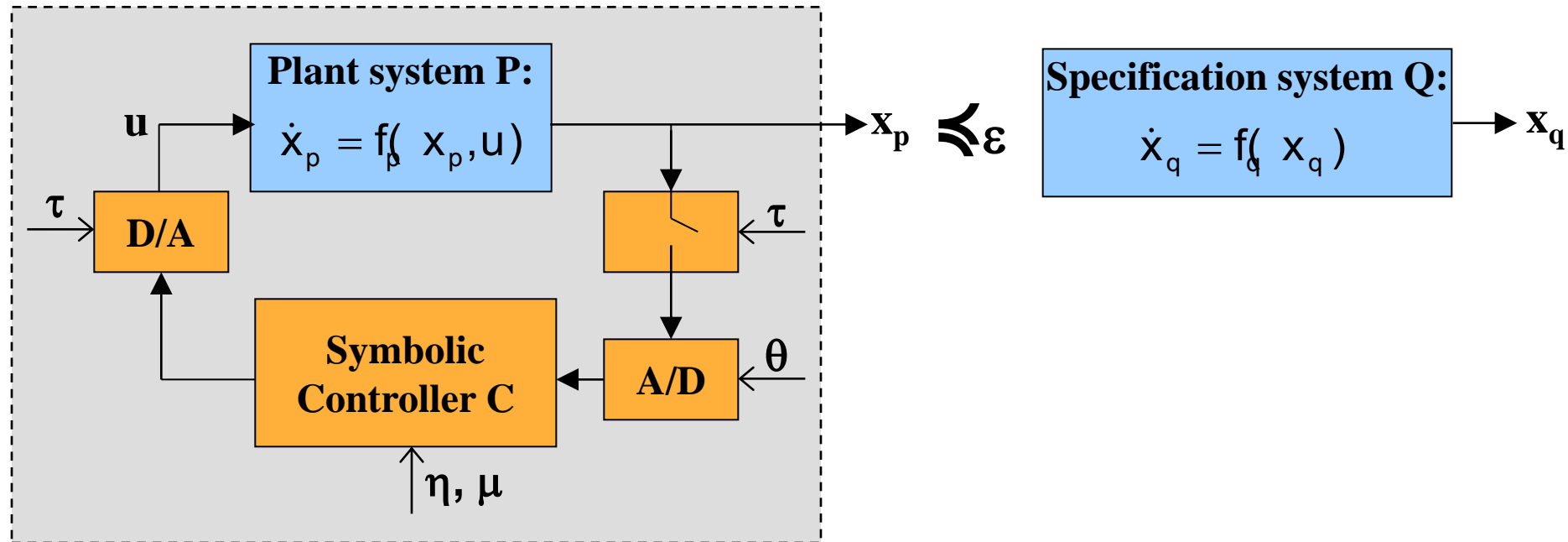




## Problem 1

Given a plant  $P$ , a specification  $Q$  and a desired precision  $\varepsilon > 0$ , find a symbolic controller  $C$  such that

1.  $T_{\tau, \eta, \mu}(P) \parallel_{\theta} C \preceq_{\varepsilon} T_{\tau, \eta, 0}(Q)$
2.  $T_{\tau, \eta, \mu}(P) \parallel_{\theta} C$  is non-blocking





# Solution of Problem 1

Synthesis through a four-step process:

1. Compute the symbolic model  $T_{\tau,\eta,\mu}(P)$  of  $P$
2. Compute the symbolic model  $T_{\tau,\eta,0}(Q)$  of  $Q$
3. Compute the symbolic controller  $C^* = T_{\tau,\eta,\mu}(P) || T_{\tau,\eta,0}(Q)$
4. Compute the non-blocking part  $Nb(C^*)$  of  $C^*$

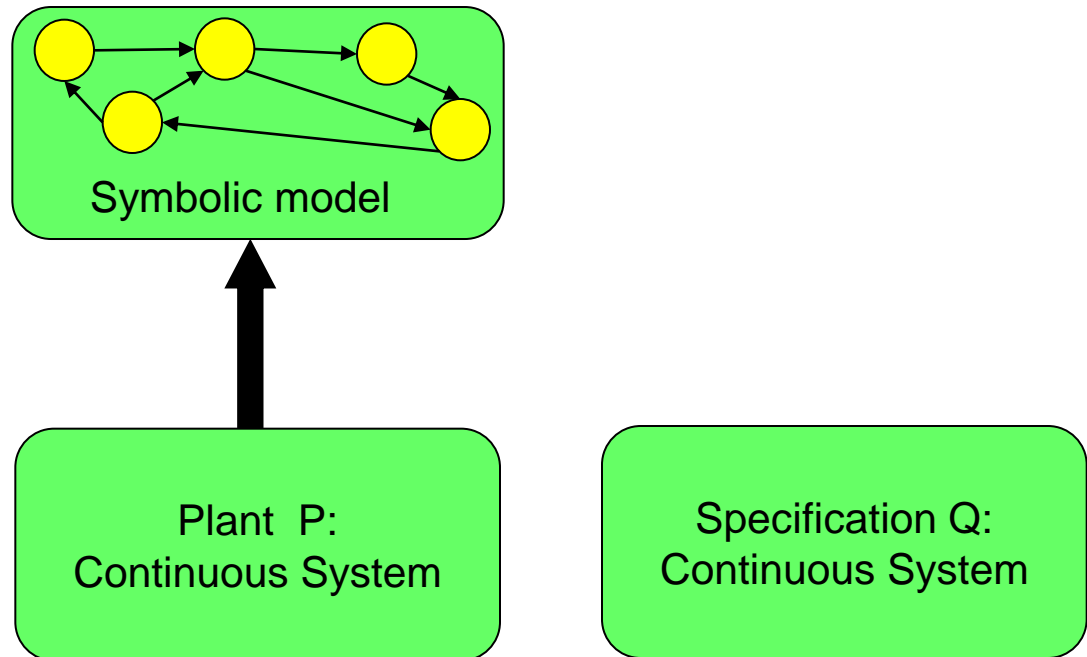
Plant P:  
Continuous System

Specification Q:  
Continuous System



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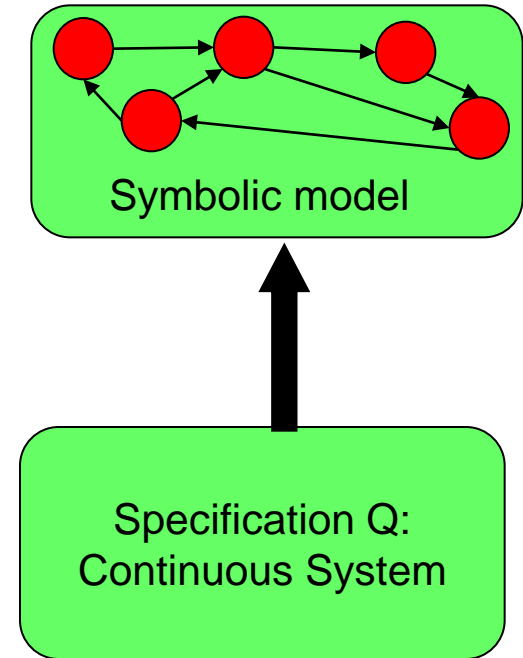
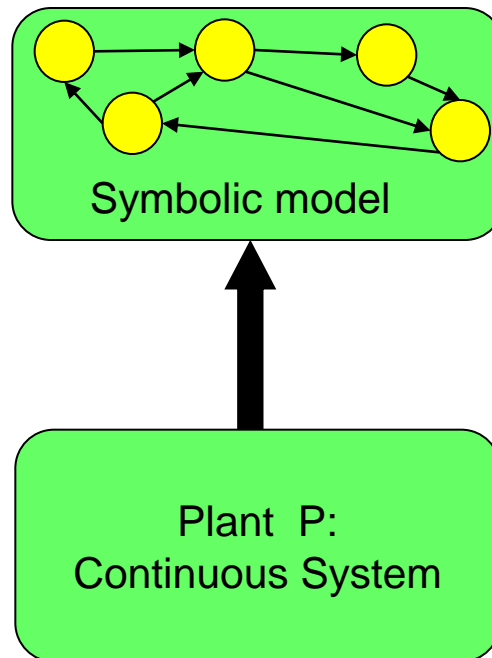
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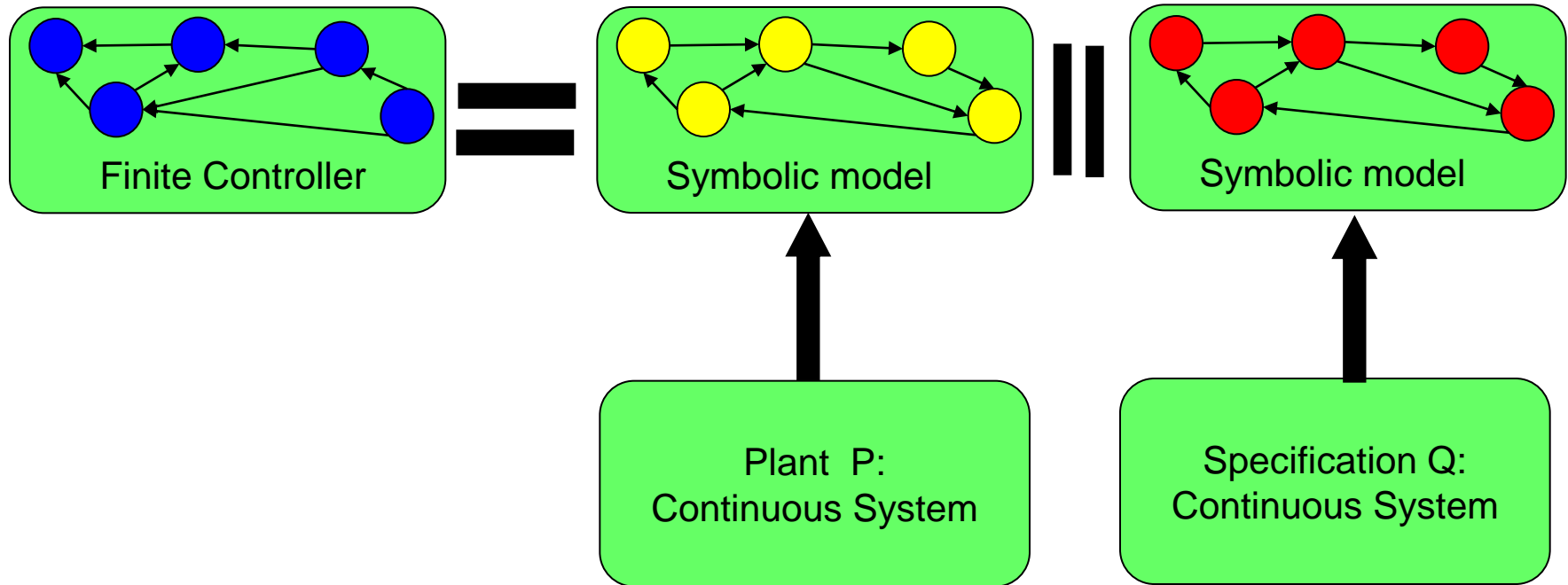
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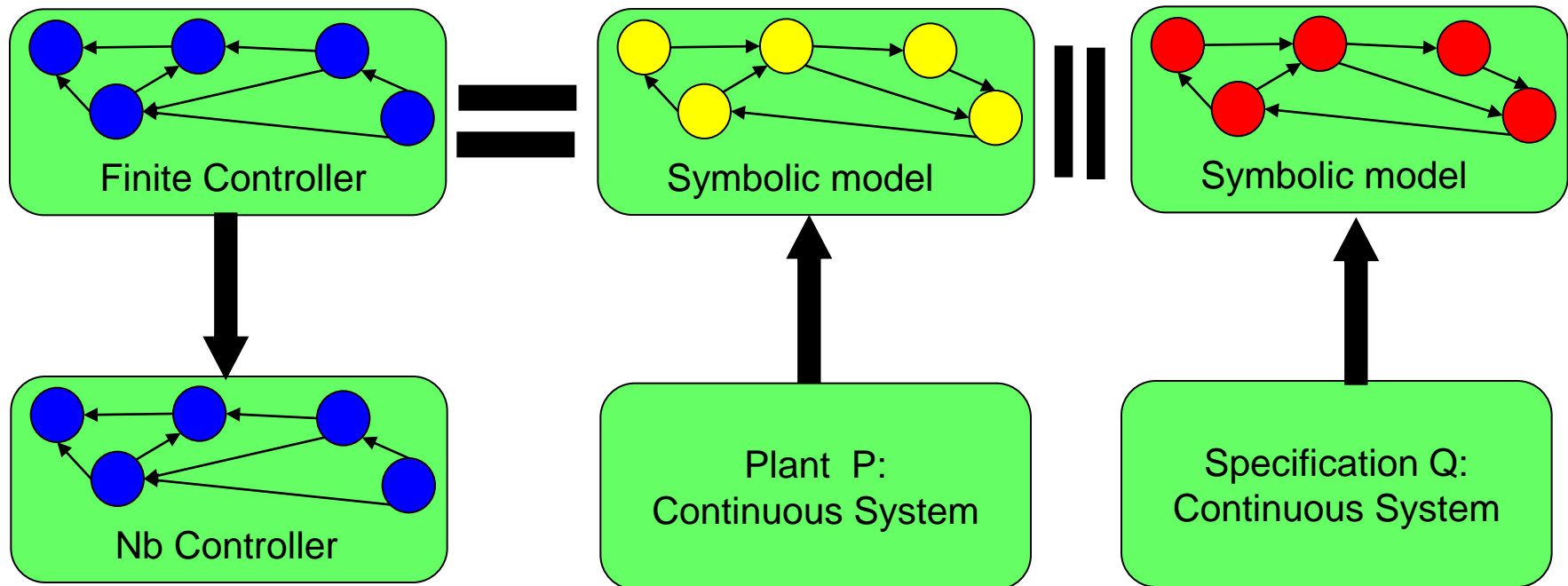
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Synthesis through a four-step process:

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Synthesis through a four-step process:

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4. Compute the non-blocking part  $Nb(C^*)$  of  $C^*$

**Theorem** Suppose that  $P$  and  $Q$  are  $\delta$ -ISS and choose parameters  $\varepsilon_p, \varepsilon_q > 0$  so that

$$(1) \quad \varepsilon_p + \varepsilon_q \leq \varepsilon$$

Choose parameters  $\tau, \eta, \mu > 0$  satisfying

$$(2) \quad \beta_p(\varepsilon_p, \tau) + \eta + \gamma_p(\mu) \leq \varepsilon_p$$

$$(3) \quad \beta_q(\varepsilon_q, \tau) + \eta \leq \varepsilon_q$$

The symbolic controller  $Nb(C^*)$  solves Problem 1 with  $\theta = \varepsilon_p$



## Drawbacks

- It considers the whole sets of states of  $T_{\tau,\eta,\mu}(P)$  and  $T_{\tau,\eta,0}(Q)$
- For any source state  $x$  and target state  $y$ , it includes all transitions  $x \xrightarrow{u} y$  with any control input  $u$  by which state  $x$  reaches state  $y$
- It first constructs  $T_{\tau,\eta,\mu}(P)$  and  $T_{\tau,\eta,0}(Q)$ , then  $C^*$ , to finally eliminate blocking states from  $C^*$

To cope with space and time complexity, instead of computing separately

- (1) Discrete abstraction  $T_{\tau,\eta,\mu}(P)$  of  $P$
- (2) Discrete abstraction  $T_{\tau,\eta,0}(Q)$  of  $Q$
- (3) Symbolic controller  $C^* = T_{\tau,\eta,\mu}(P) || T_{\tau,\eta,0}(Q)$
- (4) Non-blocking part  $Nb(C)$  of  $C^*$

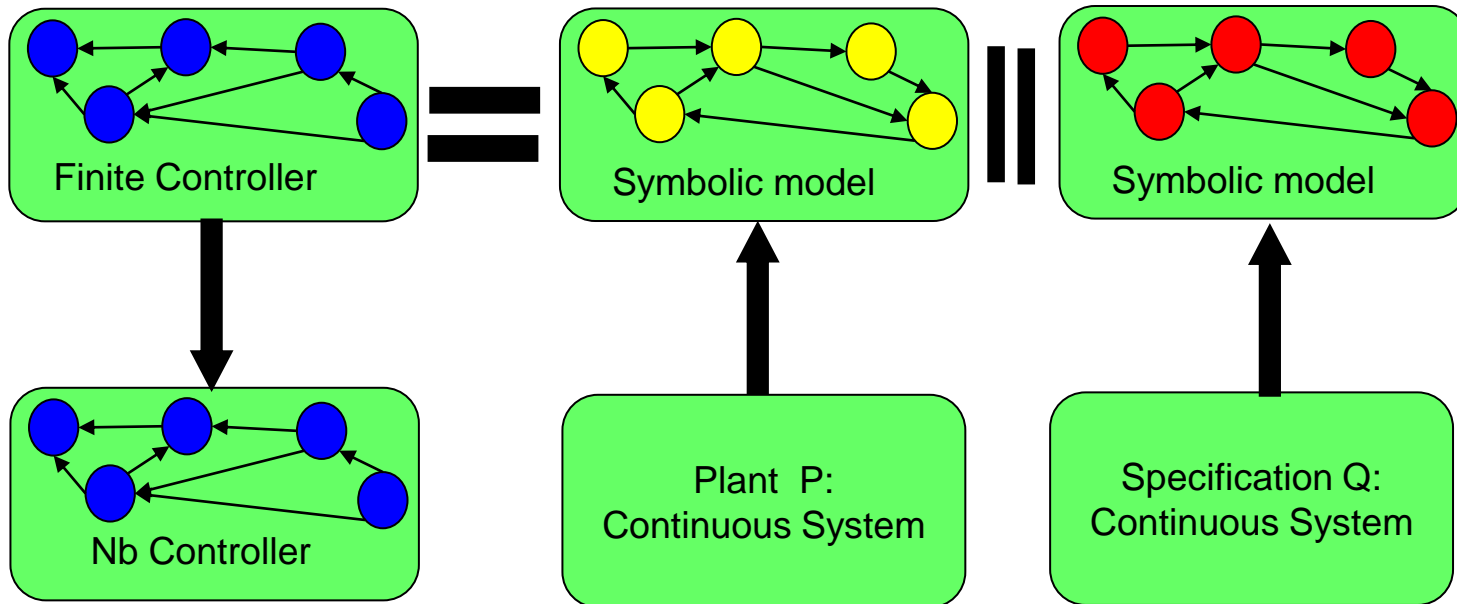
**Integrated Approach: Compute (1) + (2) + (3) + (4) at once!**

Space/time complexity analysis of the proposed algorithm formally quantifies the gain of the integrated approach



## Basic ideas

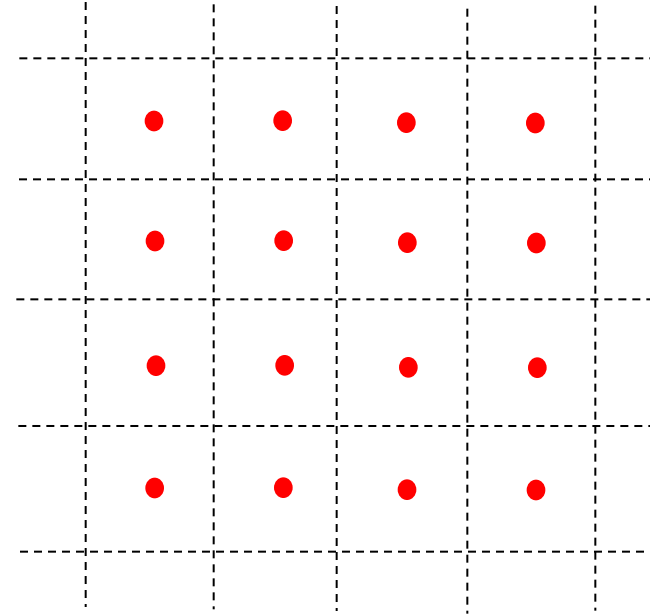
1. It only considers the intersection of the accessible parts of  $P$  and  $Q$
2. For any given source state  $x$  and target state  $y$ , it considers only one transition  $(x,u,y)$
3. It eliminates blocking states as soon as show up





## How does it work?

First, we consider the target space as the intersection of the sets of initial states of  $T_{\tau,\eta,\mu}(P)$  and  $T_{\tau,\eta,0}(Q)$ .

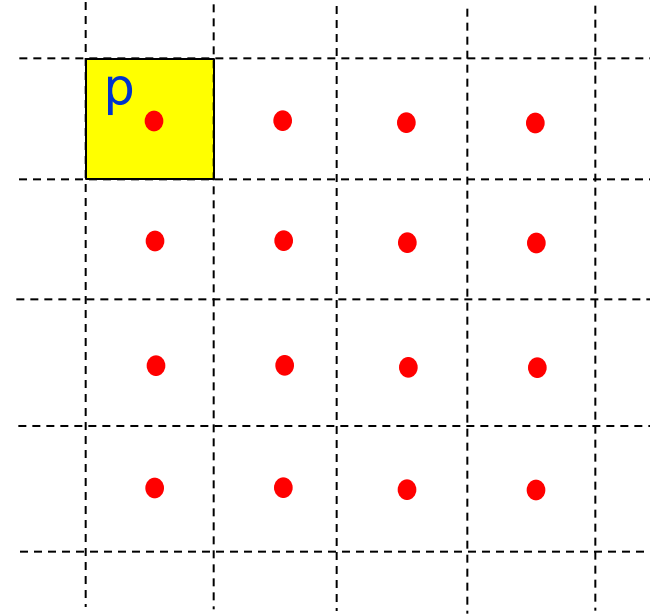




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Pick a "symbolic" state  $p$  from the target space and compute  $[x_q(\tau,p)]_{2\eta}=q$  by integrating the specification differential equation

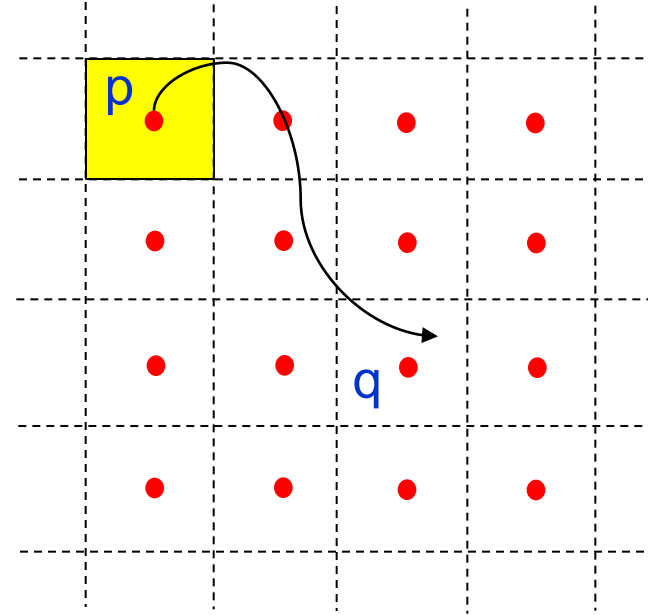




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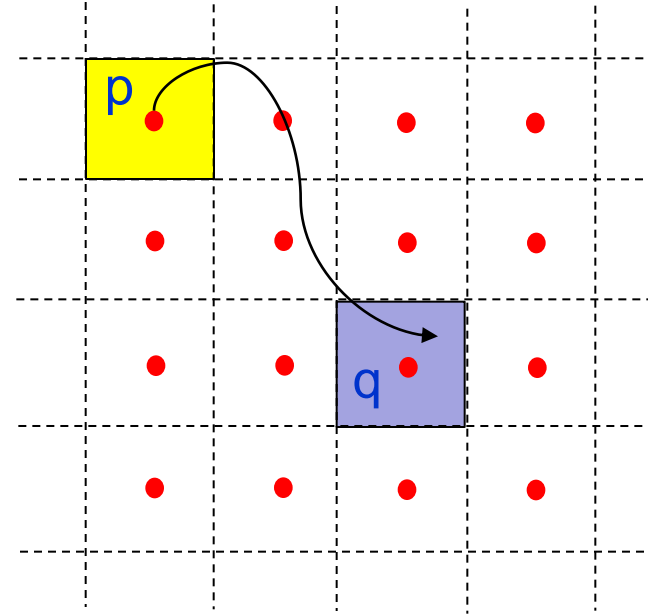




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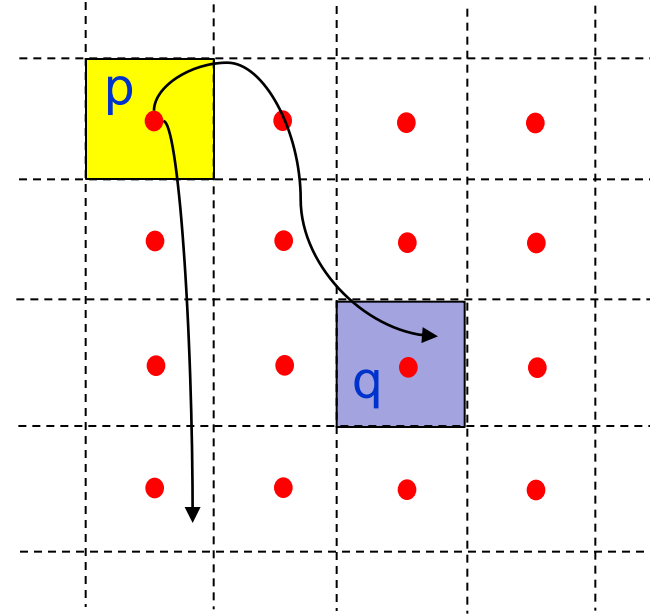


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Pick control inputs in  $[U]_{2\mu}$  and integrate the plant differential equation until  $q=[x_p(\tau,p,u)]_{2\eta}$  for some  $u$ .





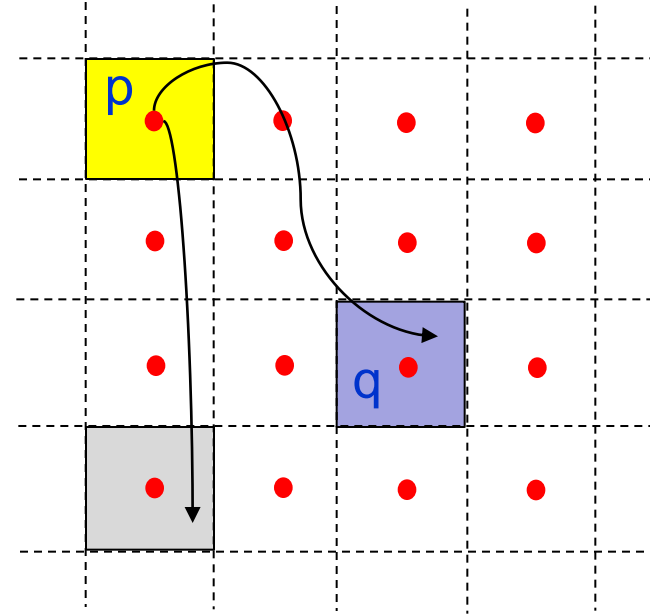


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Pick control inputs in  $[U]_{2\mu}$  and integrate the plant differential equation until  $q=[x_p(\tau,p,u)]_{2\eta}$  for some  $u$ .



No matching! Try another input!

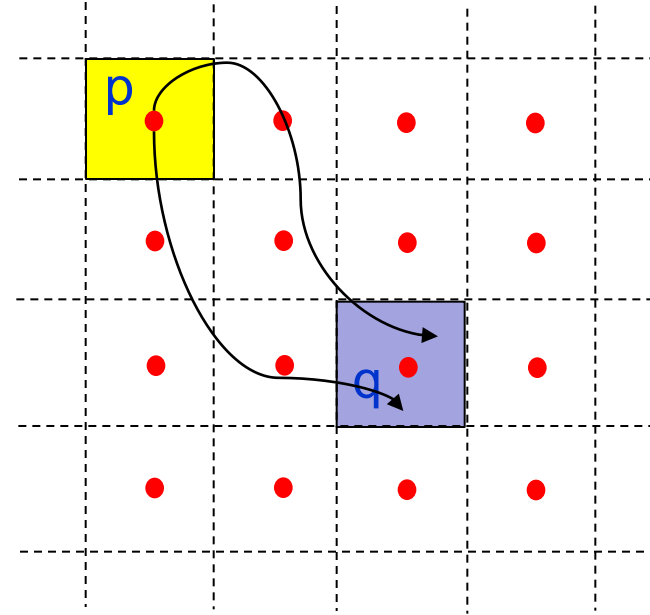


## How does it work?

First, we consider the target space as the intersection of the sets of initial states of  $T_{\tau,\eta,\mu}(P)$  and  $T_{\tau,\eta,0}(Q)$ .

Pick a "symbolic" state  $p$  from the target space and compute  $[x_q(\tau,p)]_{2\eta}=q$  by integrating the specification differential equation

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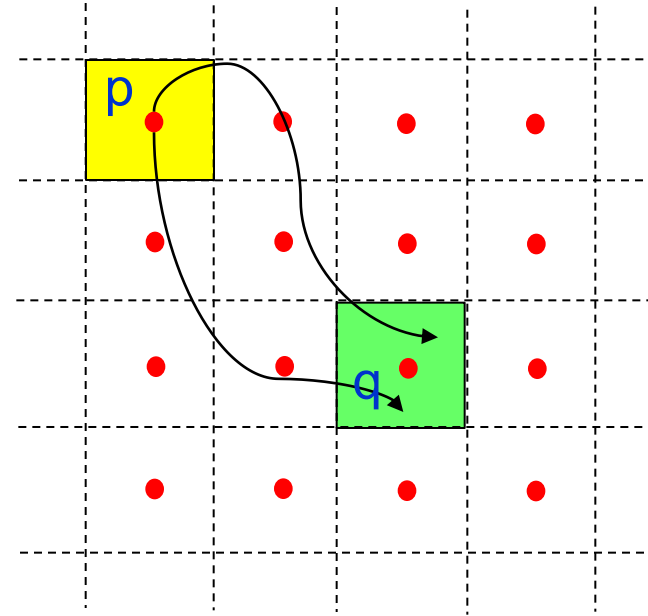


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Matching found!!



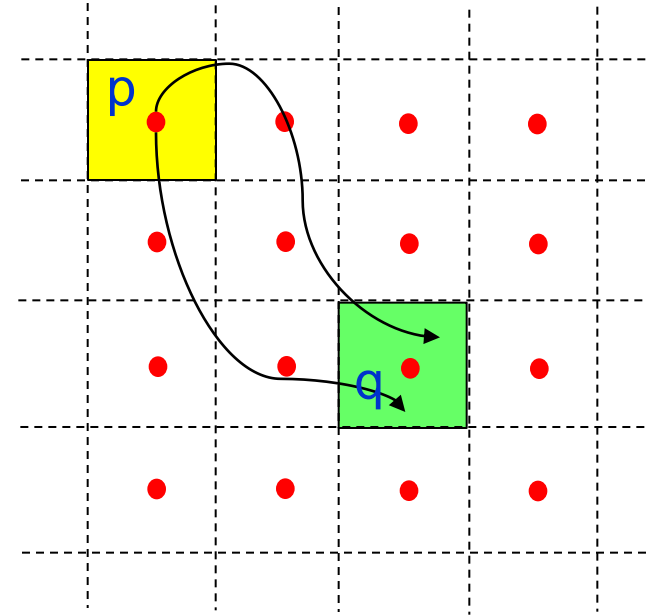
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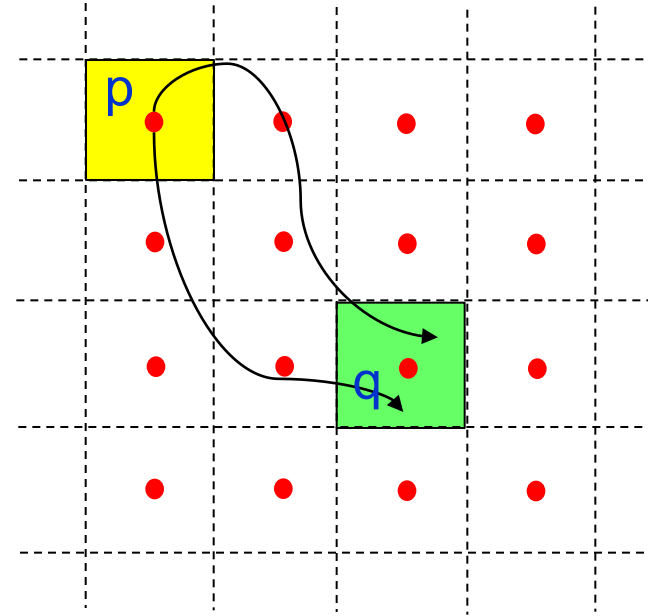
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Add the transition  $(p,u,q)$  to the controller.

If any "good" input does not exist, then  $p$  is **blocking!**

A backwards procedure is executed to eliminate  $p$  and all its ingoing transitions from the controller, until a controller is found which is NB.





## Properties

Let  $C^{**}$  be the outcome of the integrated procedure:

1. The integrated algorithm terminates in a finite number of steps
2.  $C^{**}$  and  $Nb(C^*)$  are exactly bisimilar  $\Rightarrow C^{**}$  solves Problem 1
3.  $C^{**}$  is the minimal 0-bisimilar system of  $Nb(C^*)$
4.  $C^{**}$  is accessible
5. Space/time complexity of the integrated procedure is not larger than the one of the classical procedure

