

# Supervisory Control of Infinite State Systems under Partial Observation

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Séminaire CIRM - LMeASI

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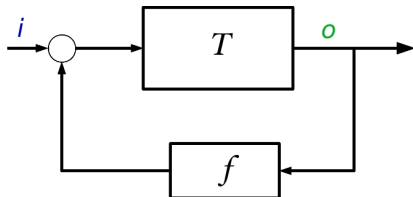
## Outline

- 1 Motivation
- 2 State Avoidance Control Problem
- 3 Control of Systems under Partial Observation
- 4 Decentralized Control Problem
- 5 Distributed Control Problem
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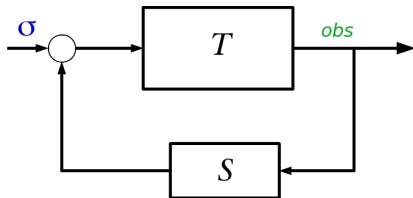
## Once upon a Time in Supervisory Control



### Automation and Control Theory

- **Feedback loop** to control an electronic device  $\mathcal{T}$
- An input signal  $i$ , a control function  $f$ , a specification for the output  $o$
- Question : what should be  $f$  so that the output signal matches the specification ?

## Once upon a Time in Supervisory Control (2)



### Computer science Theory [Ramadge & Wonham 86]

- Discrete event system  $\mathcal{T}$
- The supervisor  $\mathcal{S}$  **observes**  $\mathcal{T}$  and **may disable** some events
- Question : what should be  $\mathcal{S}$  so that  $\mathcal{T}||\mathcal{S}$  satisfies the specification ?

## Formal Definition of the Control Problem

### Formalism : Regular languages

- System :  $\mathcal{T} = \langle Q, \Sigma, q_0, Q_f, \rightarrow \rangle$ , language  $M$
- Partition :  $\Sigma = \Sigma_c \cup \Sigma_{uc}$
- Specification : language  $K$

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### Solution (for prefix-closed languages)

- $L$  is **controllable** with respect to  $M$  if :

$$L.\Sigma_{uc} \cap M \subseteq L$$

- There is a **unique supremal controllable** language  $\hat{L} \subseteq K$
- Supervision : forbid every events not enable by  $\hat{L}$

## Why does he talk about that ?

What about static analysis ? Abstract interpretation ? I want my money back !



# Principles of Abstract Interpretation

## Static Analysis and Abstract Interpretation

- **Static Analysis** : method to know what a program can do without running it
- Relies on a fixpoint computation in a lattice (generally  $2^{\mathcal{D}_V}$ )
- **Abstract Interpretation** : method to solve this fixpoint computation using approximation

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### Outline of the method

- **Concrete** lattice  $2^{\mathcal{D}_V} \xrightleftharpoons[\alpha]{\gamma} \wedge$  **Abstract** lattice
- We transpose the computation into the **abstract** lattice
- A **widening** operator  $\nabla$  ensures the convergence of this computation
- The obtained solution is an **overapproximation** of the least fixpoint

## From Supervisory Control to Abstract interpretation

### Supremal controllable language = fixpoint computation

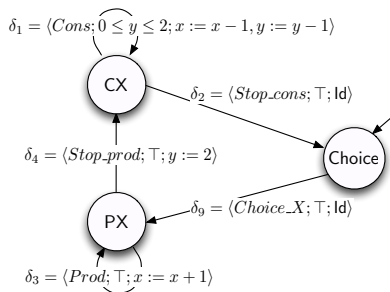
- Controllable = (post-) fixpoint
- State-based approach : if  $K$  is a set of “good” states, we want the greatest fixpoint of  $X \rightarrow \text{Post}_{uc}(X) \cap K$
- Supervision : disable all transitions leading out this set of states

### What about Abstract Interpretation ?

- When **reachability is undecidable**, we may obtain a valid supervisor
- Over-approximation of a least fixpoint
- Safe control, but possible loss of permissivity

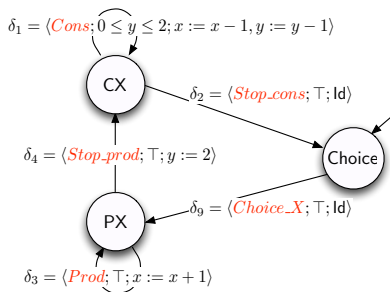
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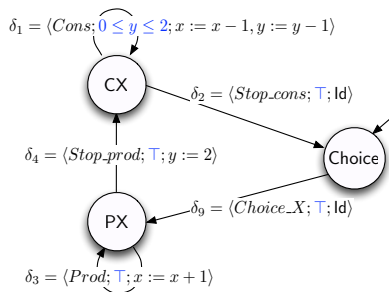
### Symbolic Transition System (STS)

- Numerical variables, domain  $\mathcal{D}_V$
- **Symbolic Transitions**  $\delta = \langle \sigma, G, A \rangle$
- Semantics : infinite Labelled Transition System (LTS)



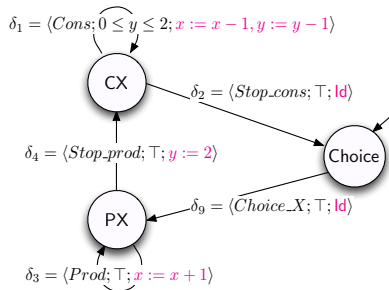
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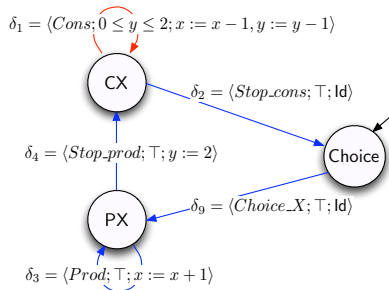
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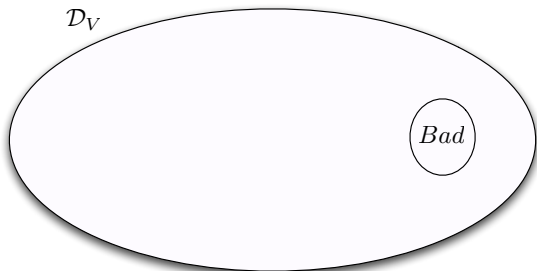
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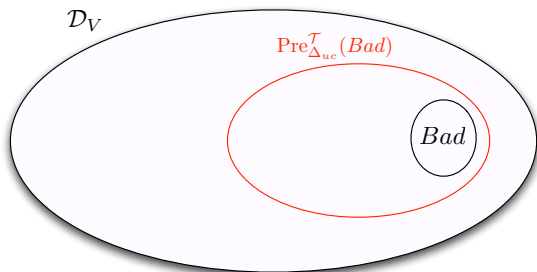


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- **Symbolic Transitions**  $\delta = \langle \sigma, G, A \rangle$
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- Transitions  $\Delta = \Delta_c \uplus \Delta_{uc}$
- Objective : avoid  $Bad \subseteq \mathcal{D}_V$

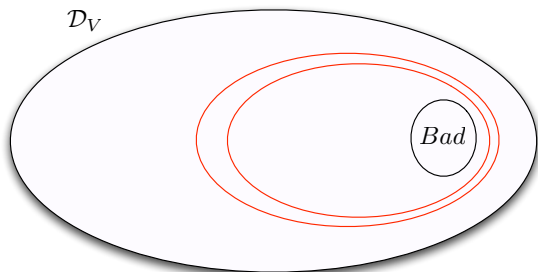


Fixpoint computation



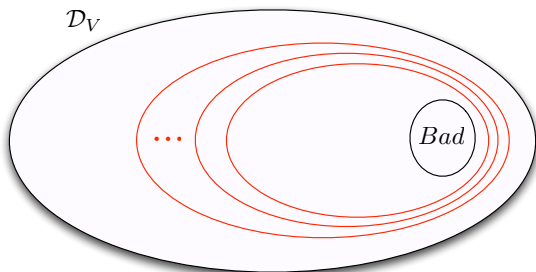
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- $\text{Pre}_{\Delta_{uc}}^T(\text{Bad}) =$  set of states leading to  $\text{Bad}$  through an uncontrollable transition



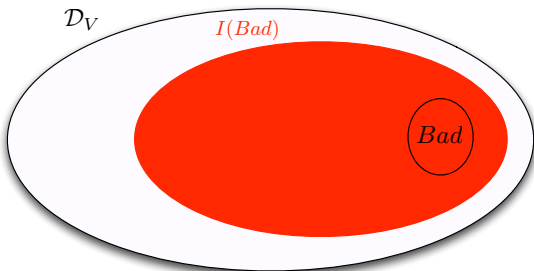
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- Iteration of  $\text{Pre}_{\Delta_{uc}}^{\mathcal{T}}$



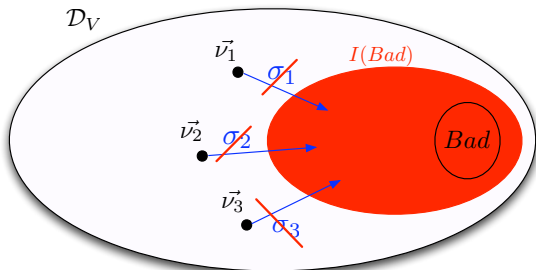
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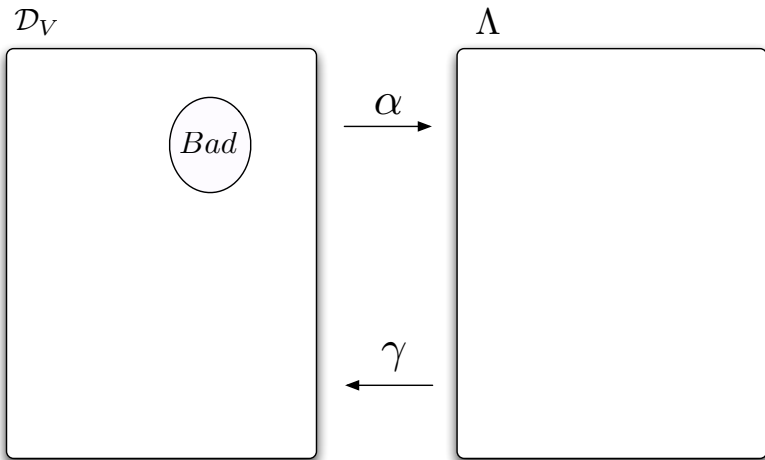
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- $\text{Pre}_{\Delta_{uc}}^T(Bad)$  = set of states leading to  $Bad$  through an uncontrollable transition
- Iterations of  $\text{Pre}_{\Delta_{uc}}^T$
- $I(Bad)$  = Set of states leading to  $Bad$  through several uncontrollable transitions

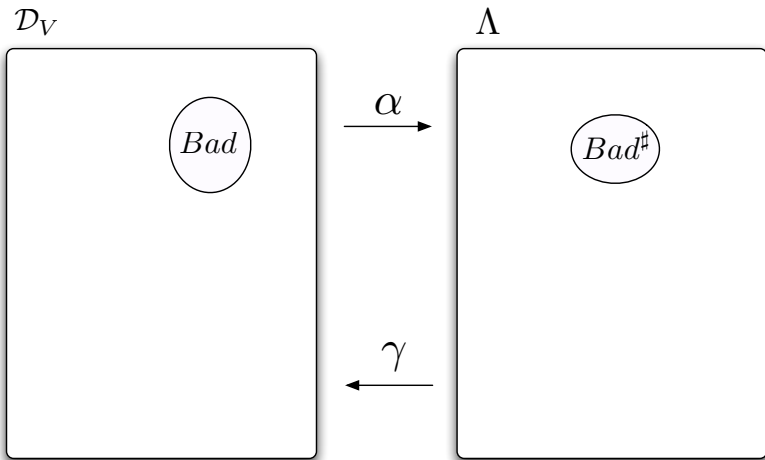


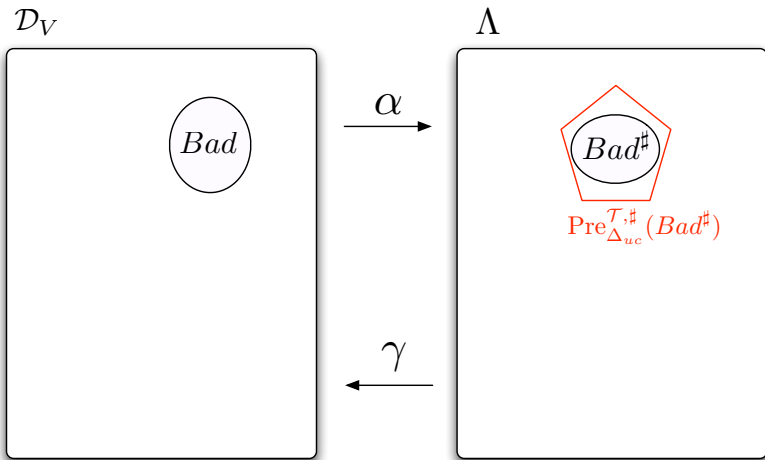
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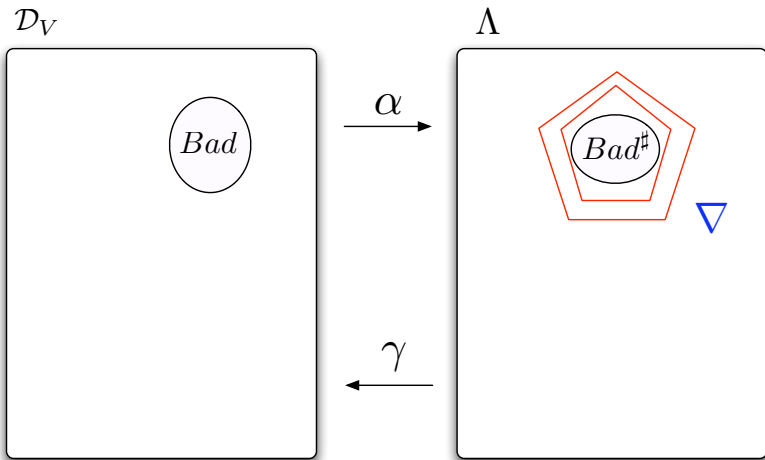
- $\text{Pre}_{\Delta_{uc}}^{\mathcal{T}}(Bad)$  = set of states leading to  $Bad$  through an uncontrollable transition
- Iterations of  $\text{Pre}_{\Delta_{uc}}^{\mathcal{T}}$
- $I(Bad)$  = Set of states leading to  $Bad$  through several uncontrollable transitions
- Supervisor : forbid all transitions leading to  $I(Bad)$

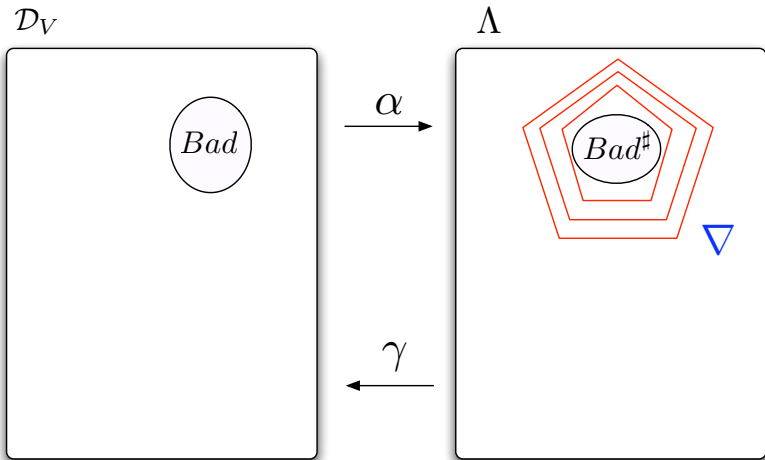


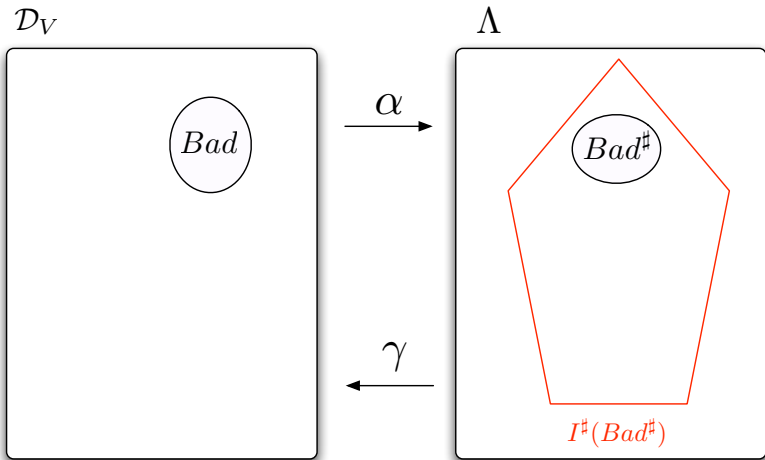


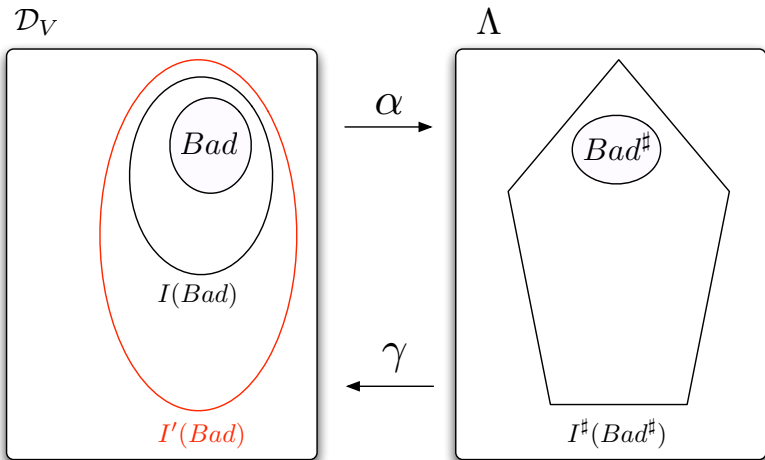


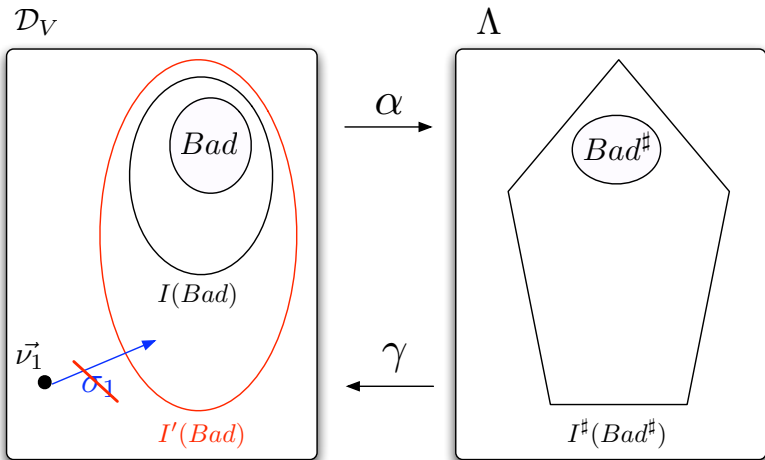












## Permissiveness and non-blocking control

### Permissiveness

- Quality of control : how permissive the supervisor is
- **More precise** fixpoint computation  $\Rightarrow$  **better supervisor**
- Choice of the abstract lattice, of the fixpoint computation strategy, ...



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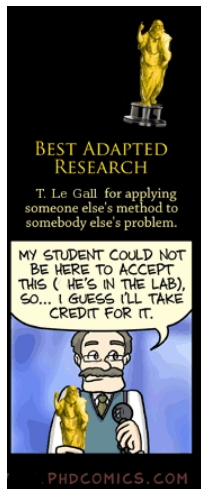
### Deadlock-free case

- **Deadlock-free** : at least one event is enable in every state
- **Non-blocking** : always able to reach a given objective
- We “solved” the deadlock-free case, **underapproximations** are needed so solve the non-blocking problem

## (Partial) Conclusion

### Advantages of the approach

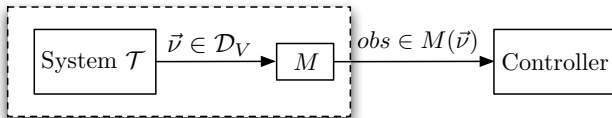
- For the “supervisory control” community :
  - ① **Rigorous fixpoint computation** method
  - ② **Termination** (even when the problem is undecidable)
- For the “static analysis” community :
  - ① A **new playground** !
  - ② Some problems that do not occur in software verification (e.g. non-blocking)



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## Systems under Partial Observation



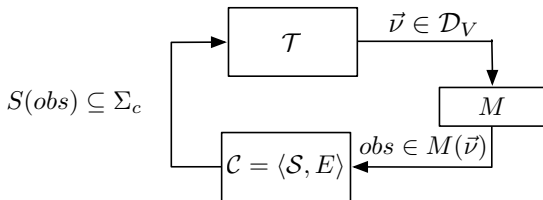
### Partial observation

- Modeled by an **observer**  $\langle \mathcal{D}_{Obs}, M \rangle$
- The observation space  $\mathcal{D}_{Obs}$  can be **infinite**
- $M : \mathcal{D}_V \mapsto 2^{\mathcal{D}_{Obs}}$  is a **mask**

### Example of observers

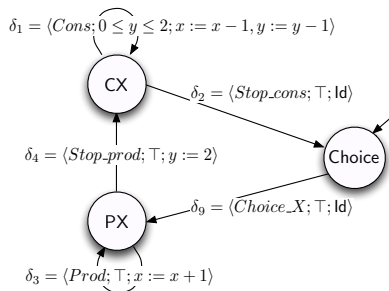
- Hidden variables :  $M(\langle PX, 10, 15 \rangle) = \langle PX, 10 \rangle$
- Undistinguishable locations :  $M(\langle PX, 10, 15 \rangle) = M(\langle Choice, 10, 15 \rangle)$
- ...

## Memoryless Controllers



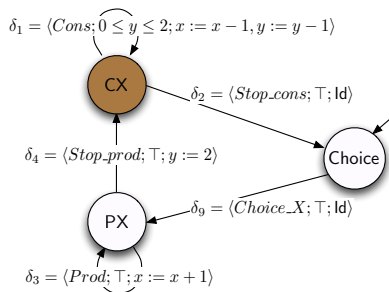
### Formalization of the memoryless controller

- Restricts the behavior of the system according to the observation
- The controller is a pair  $\mathcal{C} = \langle \mathcal{S}, E \rangle$  :
  - The supervisory function  $\mathcal{S} : \mathcal{D}_{Obs} \mapsto 2^{\Sigma_c}$  gives the sets  $\mathcal{S}(obs)$  of controllable actions to forbid in  $obs \Rightarrow$  **memoryless** controller
  - $E \subseteq \mathcal{D}_V$  restricts the set of initial states



### System to be controlled and bad states

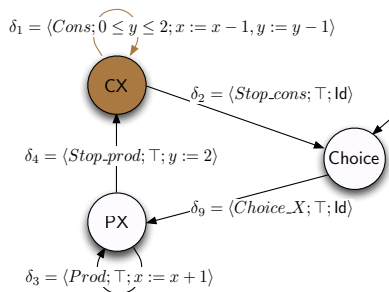
- A state is a tuple  $\langle \ell, x, y \rangle \subseteq \text{Loc} \times \mathbb{N} \times \mathbb{N}$
- The mask  $M$  is defined as follows for each state  $\vec{v} = \langle \ell, x, y \rangle$  :
  - if  $x \notin [10, 20]$ , then  $\vec{v}$  is perfectly observed
  - otherwise,  $\vec{v}$  is undistinguishable from  $\{\langle \ell, x_1, y \rangle \mid x_1 \in [10, 20]\}$
- $\text{Bad} = \{\langle \text{CX}, x, y \rangle \mid (x \leq 10) \wedge (0 \leq y \leq 2)\}$



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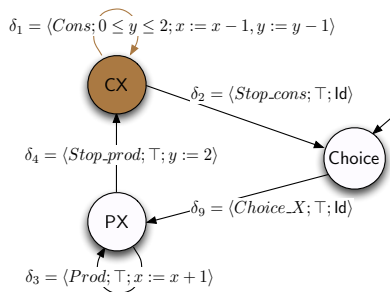
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- $I(\text{Bad}) = \{\langle \text{CX}, x, y \rangle \mid (x \leq 10) \wedge (0 \leq y \leq 2)\}$





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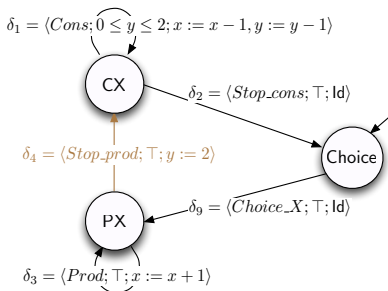
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- $\text{Bad} = \{\langle \text{CX}, x, y \rangle \mid (x \leq 10) \wedge (0 \leq y \leq 2)\}$
- $\cup \{\langle \text{CX}, x, y \rangle \mid (x \leq 11) \wedge (1 \leq y \leq 2)\} \cup \{\langle \text{CX}, x, y \rangle \mid (x \leq 12) \wedge (y = 2)\}$

## Example

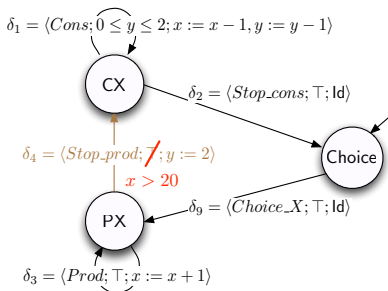


As a reminder :  $I(\text{Bad}) = \{ \langle \text{CX}, x, y \rangle \mid (x \leq 10) \wedge (0 \leq y \leq 2) \} \cup \{ \langle \text{CX}, x, y \rangle \mid (x \leq 11) \wedge (1 \leq y \leq 2) \} \cup \{ \langle \text{CX}, x, y \rangle \mid (x \leq 12) \wedge (y = 2) \}$ .

### Control function

$\text{Stop\_prod}$  forbidden in  $M^{-1}(M(\{ \langle \text{PX}, x, y \rangle \mid x \leq 12 \})) = \{ \langle \text{PX}, x, y \rangle \mid x \leq 20 \}$

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## Beyond Memoryless Controller

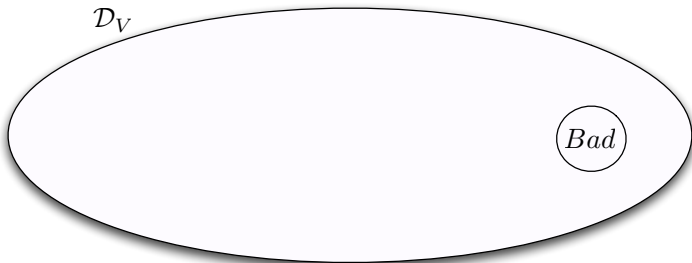
### Memory improves the control decision

- Memoryless controller must take their decision on a single observation
- What about states that have the same observation, but can be distinguished by the **past execution** ?

### Improvement of the controller

- $k$ -memory controllers
- **Online controllers**

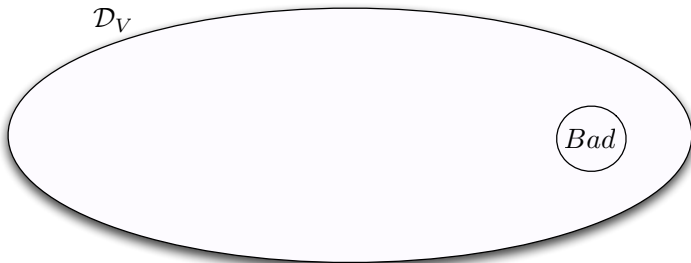
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### Online controllers

- The controller **maintains an estimate** of the current state of  $\mathcal{T}$  to define its control policy

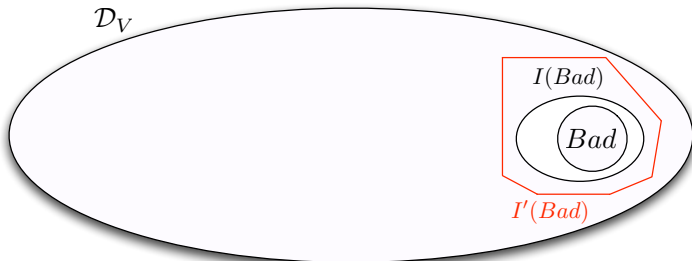
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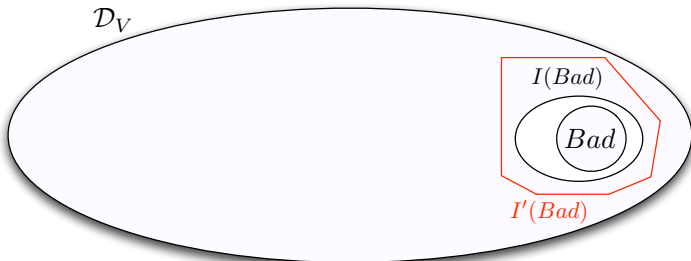


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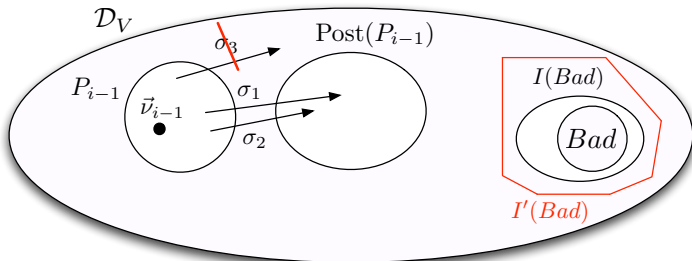
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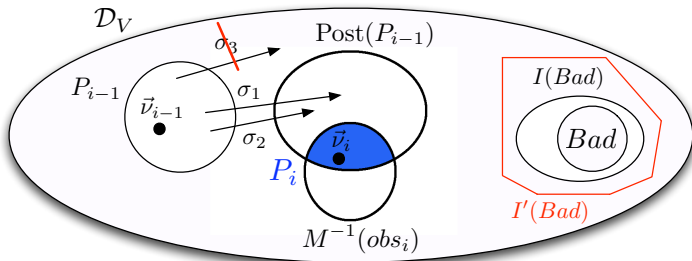
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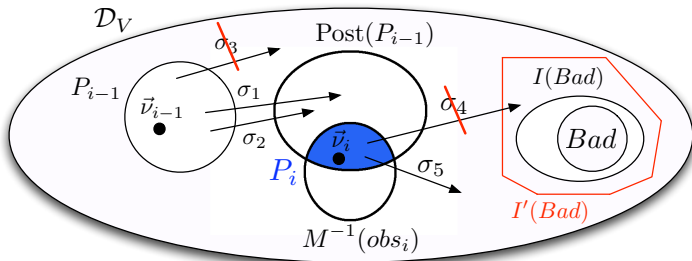
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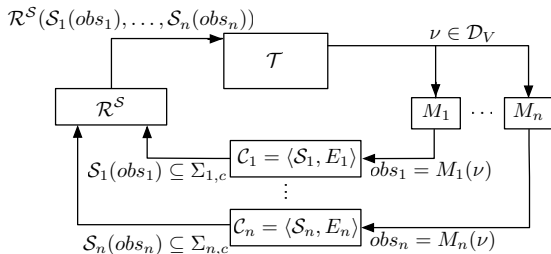


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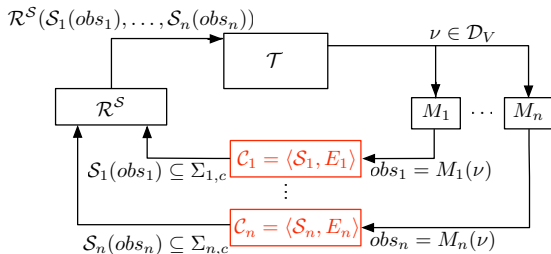
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- 6 Conclusion



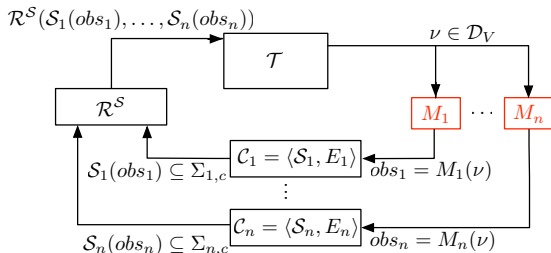
## Decentralized Approach

- The **decentralized approach** is more suitable for the control of distributed systems with **synchronous communications**



## Decentralized Approach

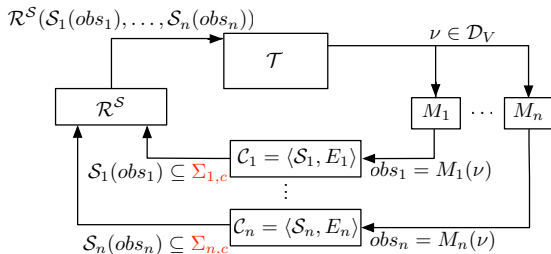
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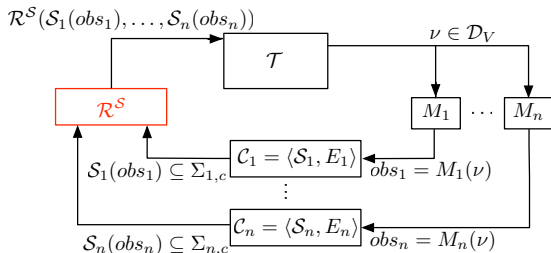
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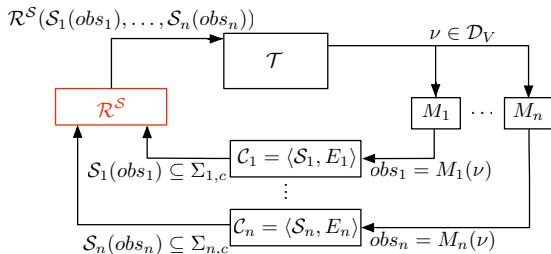
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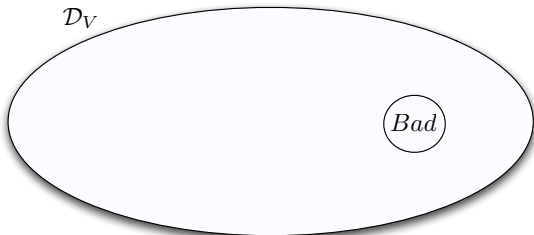
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## Decentralized Controller(2)

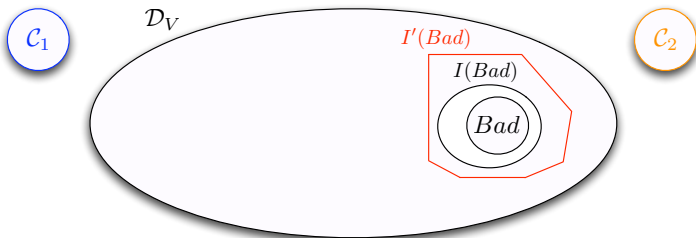


### Basic decentralized Problem

To synthesize  $n$  **valid** and **non-trivial** controllers i.e.,  $n$  controllers that

- prevent from reaching  $Bad$
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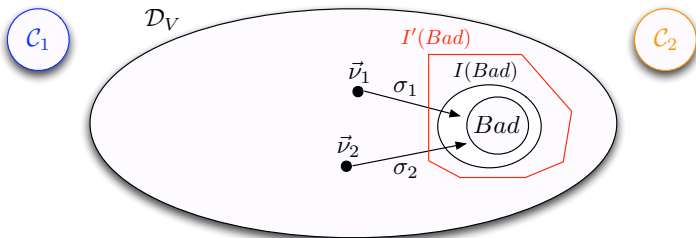
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### Control Policy

- Each controller  $\mathcal{C}_i$  forbids the actions that it controls and that lead to  $I'(Bad)$

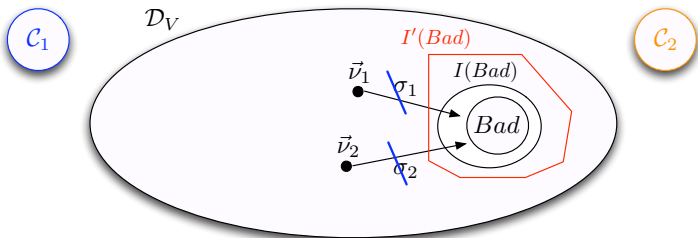
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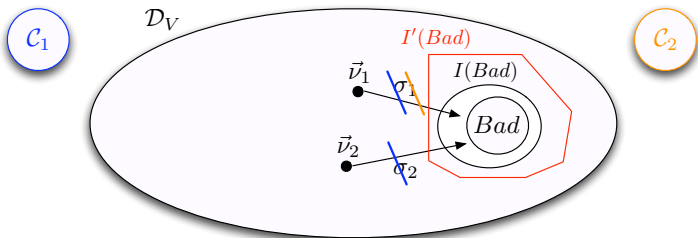
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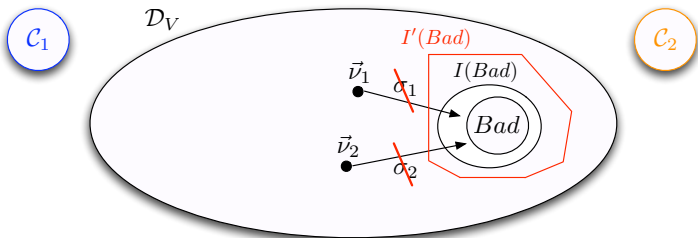


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$\mathcal{R}^S$  forbids  $\sigma_2$  in  $\vec{v}_2$  (because  $\mathcal{C}_2$  does not control  $\sigma_2$ )

## Outline

- 1 Motivation
- 2 State Avoidance Control Problem
- 3 Control of Systems under Partial Observation
- 4 Decentralized Control Problem
- 5 Distributed Control Problem**
- 6 Conclusion

## Distributed Systems with Asynchronous Communications

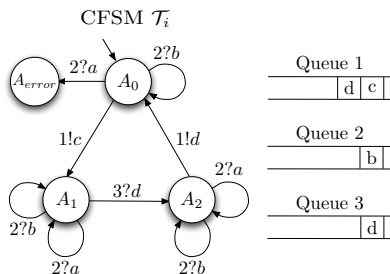
### Motivation

- The decentralized and modular approaches cannot be used for the control of distributed systems with **asynchronous communications**
- The communications between the subsystems are not instantaneous

### Distributed Approach

- We propose a **distributed approach** that takes into account the asynchronous nature of communications
- We consider distributed systems  $\mathcal{T}$  composed of several subsystems  $\mathcal{T}_i$  communicating through **reliable unbounded FIFO channels**
- $\mathcal{T}_i$  is modeled by a **communicating finite state machine** (CFSM)

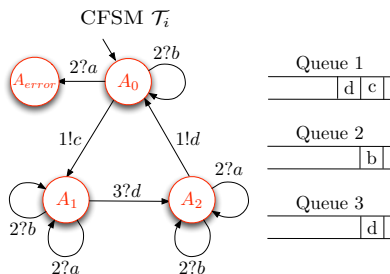
## System to be Controlled



### Communicating Finite State Machine $\mathcal{T}_i$

- Finite set  $L_i$  of locations
- Reliable and unbounded FIFO channels
- Finite set  $\Sigma_i$  of actions. An action  $\sigma$  is :
  - either an output  $Q!m$
  - or an input  $Q?m$
- Finite set of transitions  $\langle \ell_i, \sigma, \ell'_i \rangle$
- Semantics = infinite Labeled Transition System (LTS)

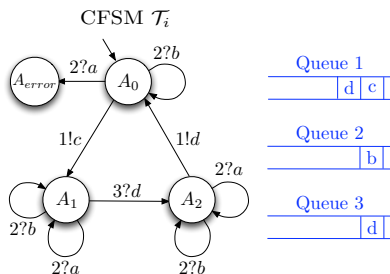
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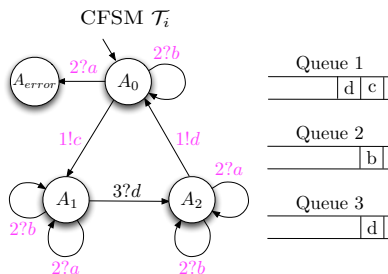
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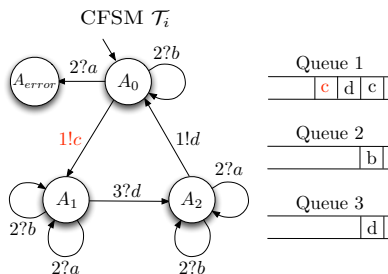
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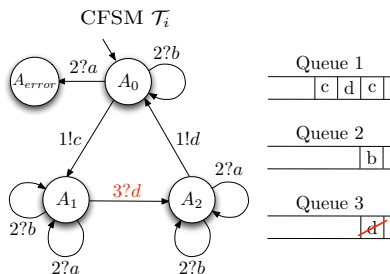


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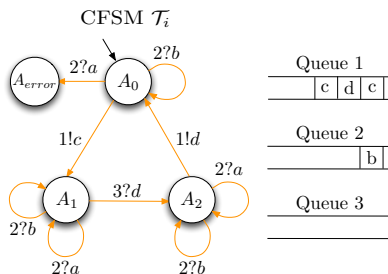
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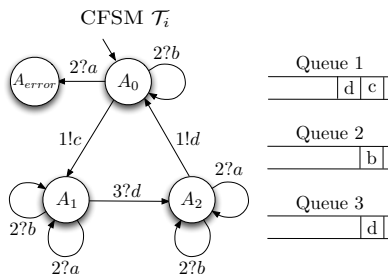
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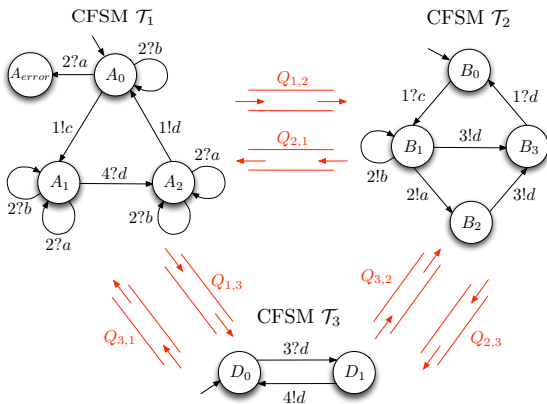
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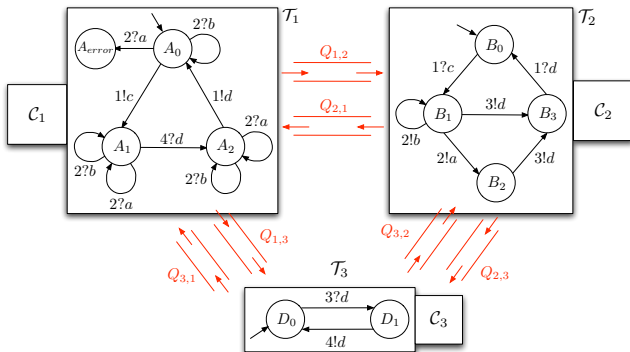


### Communication Architecture

There two queues between each pair of subsystems  $\mathcal{T}_i$  and  $\mathcal{T}_j$  :

- $Q_{i,j}$  :  $\mathcal{T}_i$  writes on this queue and  $\mathcal{T}_j$  reads the sent messages
- $Q_{j,i}$  :  $\mathcal{T}_i$  reads on this queue and  $\mathcal{T}_j$  writes on it

# Means of Observation and Control



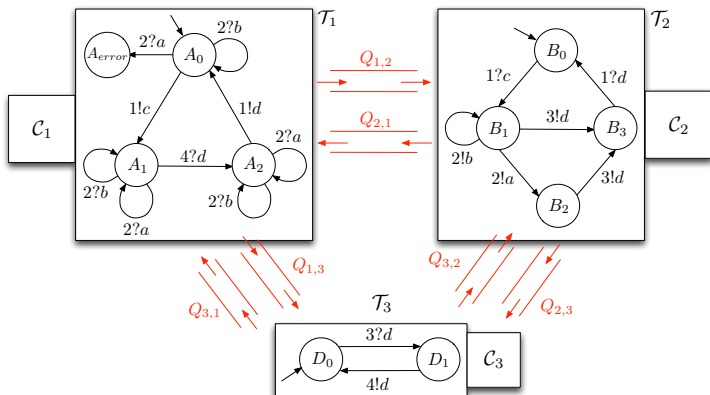
## Observation

- Each subsystem  $\mathcal{T}_i$  is controlled by a controller  $\mathcal{C}_i$
- $\mathcal{C}_i$  only observes the current state of  $\mathcal{T}_i$

## Control Mechanism

- For each  $\mathcal{T}_i$ , the set  $\Sigma_i = \Sigma_{i,c} \uplus \Sigma_{i,uc}$

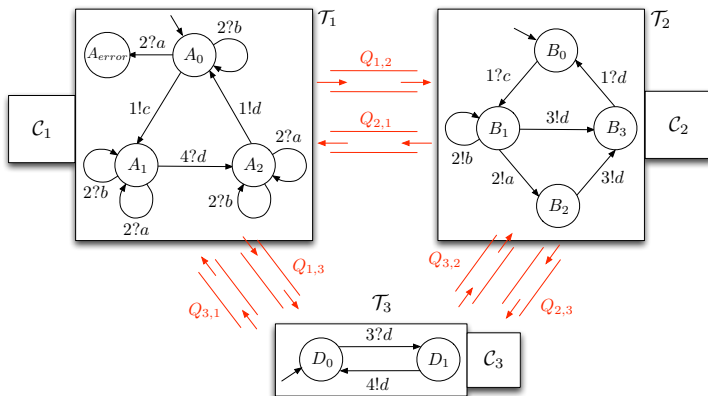
# Formalization of the Controllers



## Communication

- The controllers  $C_i$  **communicate** with each other to have a **better knowledge** of the system  $\mathcal{T}$
- They communicate by adding information to the messages normally exchanged by the subsystems
- Each controller  $C_i$  uses the exchanged information and the information received from  $\mathcal{T}_i$  to compute an estimate of the current state of the distributed system  $\mathcal{T}$

# Formalization of the Controllers



## Formalization of the controllers $C_i = \langle S_i, E_i \rangle$

- 1  $S_i$  defines, for each set  $P$  of states of  $T$ , a set  $S_i(P)$  of controllable actions that  $T_i$  cannot execute when  $P$  is the estimate of the current state of  $T$  computed by  $C_i$ .
- 2  $E_i$  restricts the set of initial states of  $T$ .

## Problem

### Distributed Problem

To synthesize **valid** and **non-trivial** controllers i.e., controllers that

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### Our approach

- Online controllers
- States estimates computed using abstract interpretation
- Communication (without explicit synchronisation) between controllers

## Algorithm for the Distributed Problem

### Outline

Synthesize  $n$  controllers that compute, during the execution of the distributed system  $\mathcal{T}$ , estimates of the current state of  $\mathcal{T}$  and define their control policy from their state estimates. Since the system is **asynchronous**, a state estimates for controller  $\mathcal{C}_i$  must “guess” the **possible future behaviour** of the other subsystems  $\mathcal{T}_j, j \neq i$ .

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### Algorithm computing the state estimates

- $\mathcal{C}_i$  maintains a estimate  $CS_i$  of the current state of  $\mathcal{T}$
- The controllers exchange their state estimate by adding these information to the messages normally exchanged by the subsystems
- For each transition fired by  $\mathcal{T}_i$ , the controller  $\mathcal{C}_i$  updates  $CS_i$  from the information received from  $\mathcal{T}_i$  and the other controllers

## Computation of the state estimates

Update of  $CS_i$  after the output transition  $\delta = \langle \ell_i, Q_{i,j}!m, \ell'_i \rangle$

When  $\mathcal{T}_i$  wants to send a message  $m$  to  $\mathcal{T}_j$  on the queue  $Q_{i,j}$  :

- $CS_i$  is sent to  $\mathcal{C}_j$  with  $m$
- $CS_i$  is updated :
  - $\text{Post}_\delta^{\mathcal{T}}(CS_i)$  : takes into account the execution of  $\delta$
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- $\mathcal{C}_i$  tries to refine its knowledge of the system using the state estimate  $CS_j$
- Roughly an intersection, followed by  $\text{Post}_\delta$  :  $CS_i := \text{Post}_\delta(CS_i \cap CS_j)$

## Computation of the state estimates

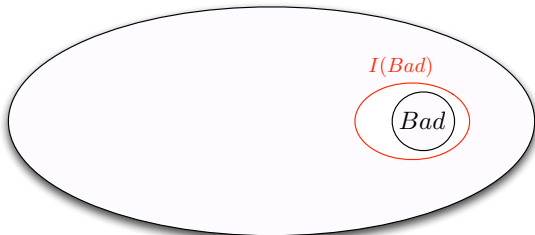
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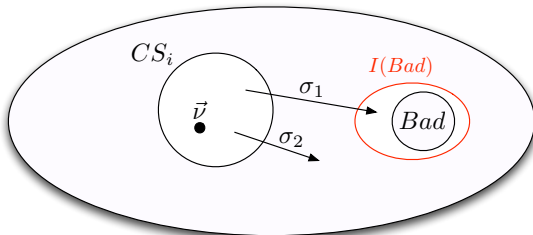
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- $CS_j$  may be out-of-date, we may have to update it first, or ignore it. We use **vector clocks** to detect out-of-date messages



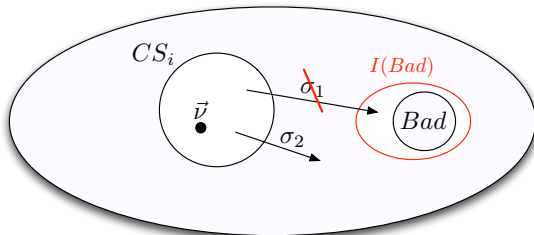
## Semi-algorithm

- **Offline part** : Computation of the set  $I(Bad)$  of states of  $\mathcal{T}$  leading uncontrollably to  $Bad$



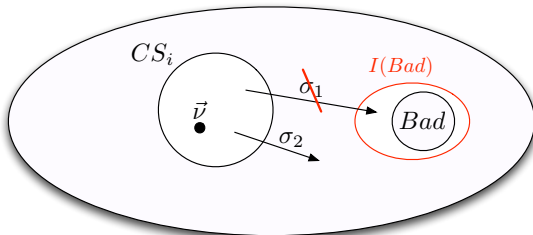
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## Semi-algorithm

- **Offline part** : Computation of the set  $I(Bad)$  of states of  $\mathcal{T}$  leading uncontrollably to  $Bad$
- **Online part** : For each action executed by  $\mathcal{T}_i$ , the controller  $\mathcal{C}_i$  defines its control policy as follows :
  - Updates its estimate  $CS_i$  of the current state  $\vec{v}$  of  $\mathcal{T}$
  - Forbids the actions leading to  $I(Bad)$  from  $CS_i$

## Effective Algorithm by Means of Abstract Interpretation

- Abstract lattice : regular languages is used to abstract the content of the FIFO channels
- Widening operator : works on regular languages

## Abstract Lattices for FIFO Systems

### Regular languages as an abstract lattice

- Concrete lattice :  $2^{\Sigma^*}$  , abstract lattice  $\text{Reg}(\Sigma)$
- Canonical representation : minimal deterministic **finite automomata**
- When there are several FIFO channels : QDD representation
- **Representation framework** (no Galois connection)



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### Widening operator

- Idea : quotient the automaton by an equivalence relation
- (colored)  $k$ -bounded bisimulation
- Convergence : number of equivalence classes is **bounded** (depends on  $k$  and  $|\Sigma|$ )

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Remark : we may work with an infinite alphabet of messages

## Outline

- 1 Motivation
- 2 State Avoidance Control Problem
- 3 Control of Systems under Partial Observation
- 4 Decentralized Control Problem
- 5 Distributed Control Problem
- 6 Conclusion

## Conclusion

### Contributions

- Abstract interpretation is an efficient tool for controller synthesis
- The “real” problems : partial observation, interaction between controllers

### Open questions

- Non-blocking properties : is it possible to use under-approximations?
- Is it interesting for LMeASI?