

# An Introduction to Hybrid Automata

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# Plan of the talk

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- Introduction - Motivations
- Hybrid automata: syntax and semantics
- Properties of hybrid automata
- Rectangular hybrid automata
- Semi-algorithms for rectangular hybrid automata
- Approximations of affine hybrid automata by rectangular hybrid automata
- Conclusion

# Introduction

# Motivations

# Reactive and embedded systems

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- **Reactive systems** are systems that maintain a continuous interaction with their environment.
- Reactive systems :
  - are **non-terminating systems**
  - have to respect or enforce **real-time properties**
  - have to cope with **concurrency**
  - are often **embedded** into an complex, continuous and safety critical, environments.





300 horses power  
100 processors



## Windows

An exception 06 has occurred at 0028:C11B3ADC in VxD DiskTSD(03) + 00001660. This was called from 0028:C11B40C8 in VxD voltrack(04) + 00000000. It may be possible to continue normally.

- \* Press any key to attempt to continue.
- \* Press CTRL+ALT+RESET to restart your computer. You will lose any unsaved information in all applications.

Press any key to continue

French Guniea, june 4, 1996





# Reactive and embedded systems

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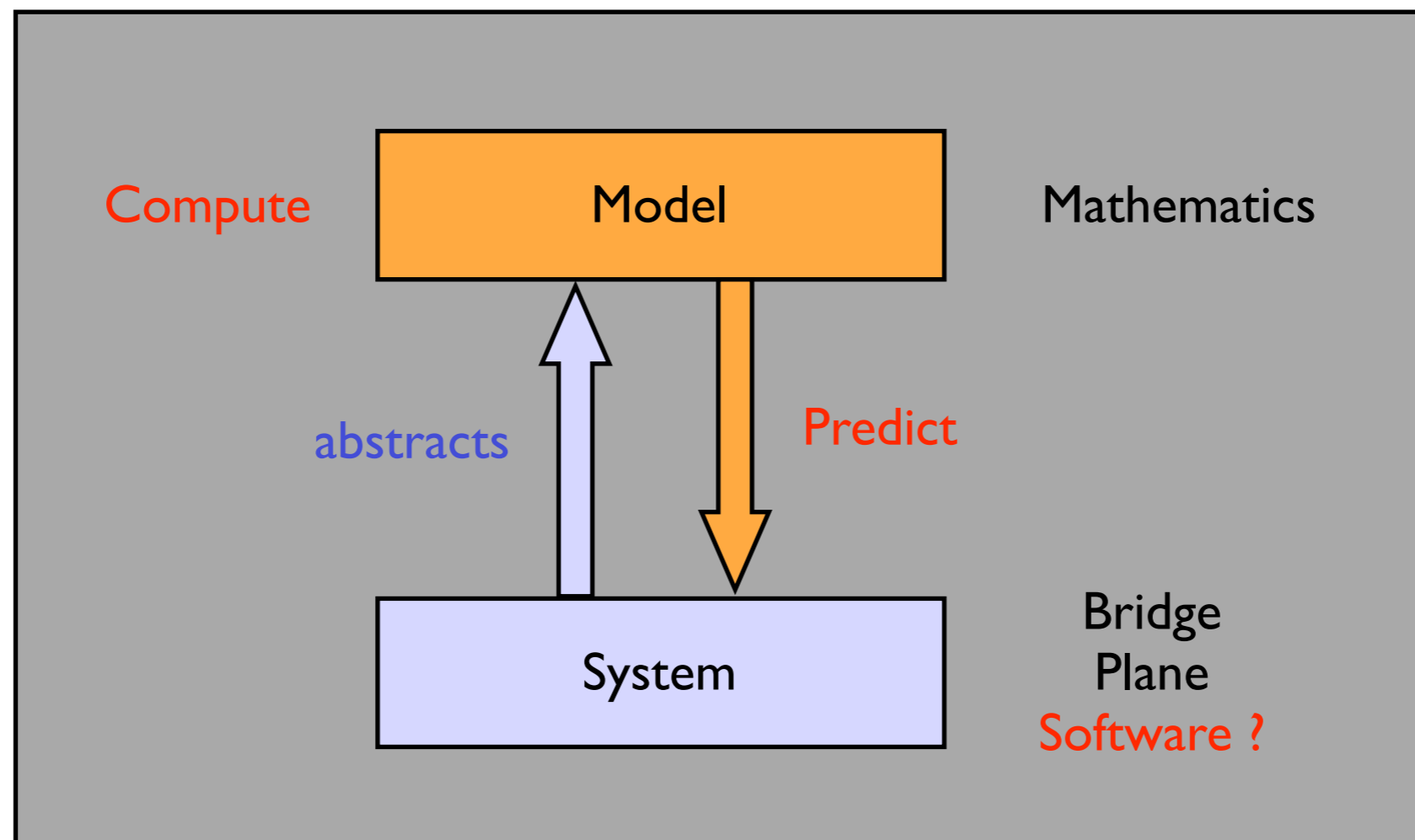
- The **specification** that have to meet ES are **very complex** (e.g. environment=continuous system, concurrency, real-time, ...)
- ES are **difficult to test**:
  - the **environment** in which they are embedded does not preexist/is difficult to simulate (e.g. rocket, medical equipment, ...);
  - even when errors are found, their **diagnostic is difficult**, we may not be able to “replay” the erroneous behavior.

# Need for FM and verification

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- ... they are **difficult** to develop **correctly** !
  - ... they are often **safety critical** !
- ⇒ **we should verify them** !

# How to cope with complexity in sciences ?



# Hybrid Automata



# Mixing discrete-continuous evolutions

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- **Finite state automata** have shown useful to model the control of **reactive systems**
- Reactive systems often have non-trivial interactions with **continuous environment** in which they are embedded
- We need a model which is able to model the **discrete evolution** of the controller and the **continuous evolution** of the environment
- **Hybrid automata** extend finite automata with continuous variables whose behaviors are described using differential constraints.

# Our running example

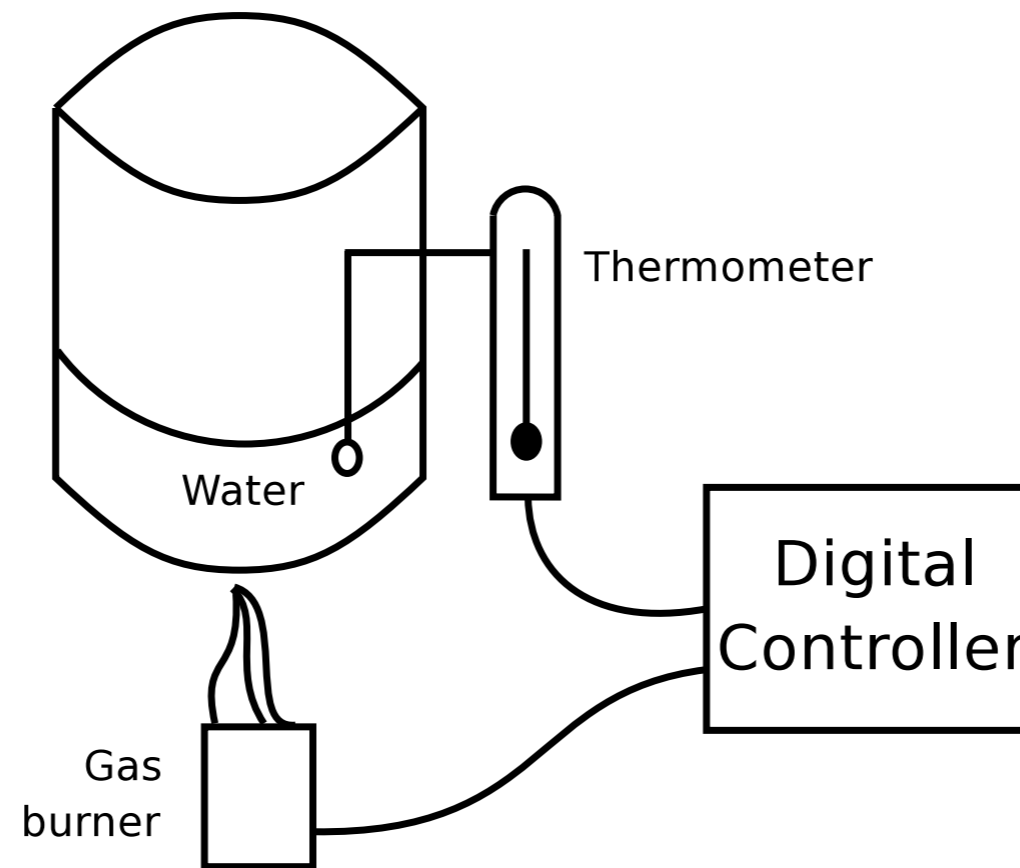


Fig. 1. Our running example

# Our running example

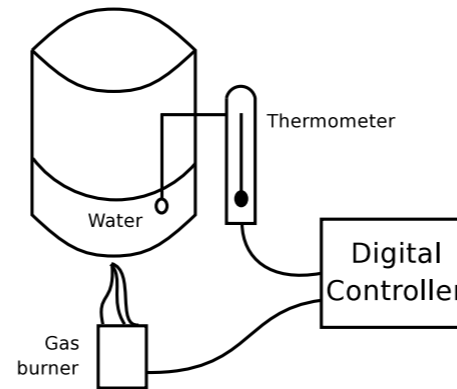


Fig. 1. Our running example

- Three environment **components** plus a **controller**:
  - A tank containing water;
  - A gas burner that can be turn on or off;
  - A digital thermometer that monitor the temperature within the tank.
- We want to design a controller that will maintain the temperature in the tank **within an interval of safe temperatures**.

# Continuous part

- Behavior of the temperature in the tank
  - When the gas burner is OFF the temperature **evolves** according to
$$\mathbf{x(t)} = \mathbf{l e^{-Kt}}$$
i.e.  $x' = -Kx$
  - When the gas burner is ON the temperature **evolves** according to
$$\mathbf{x(t)} = \mathbf{l e^{-Kt} + h (1 - e^{-Kt})}$$
i.e.  $x' = K(h-x)$

Where  $l$  is the initial temperature of the water,  $K$  is a constant that depends on the nature of the tank (how much it conducts heat for example),  $h$  is a constant that depends on the power of the gas burner, and  $t$  models time.

- We will refer to ON and OFF as **modes** of the tank evolution.
- Note that those rules are valid only when the temperature of the water is **less than**  $100^\circ$  celcius.

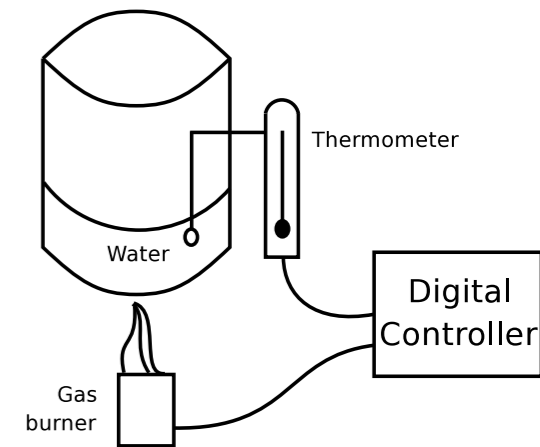


Fig. 1. Our running example



# Fragment of the evolution of the temperature

● Mode changes

— Continuous Evolutions

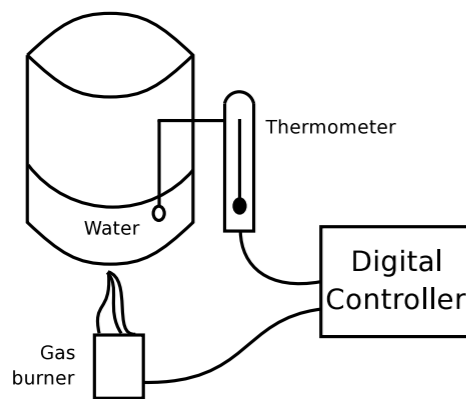


Fig. 1. Our running example

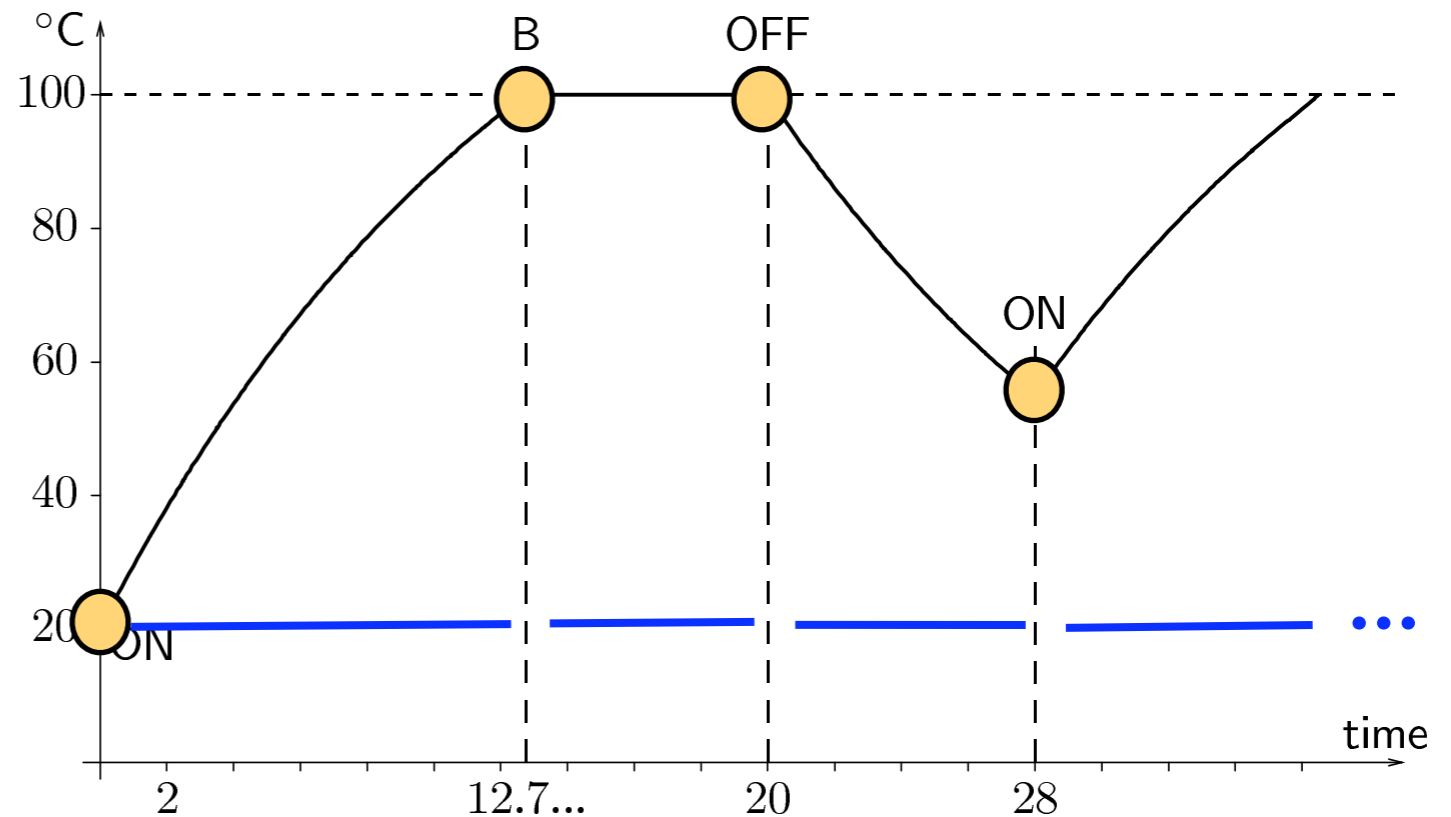


Fig. 2. One possible behavior of the tank

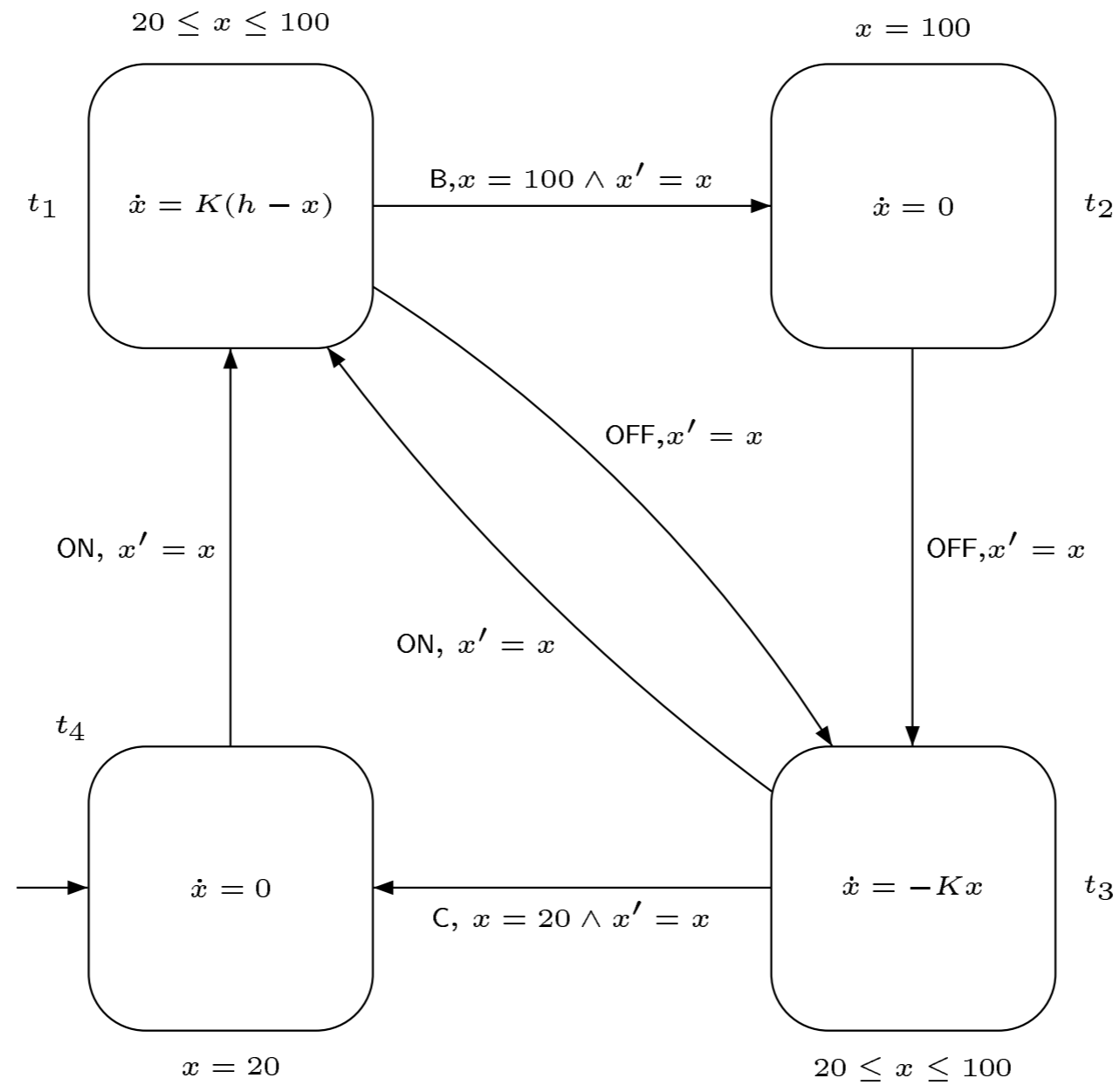
Clearly the evolution of the temperature is **not purely continuous**. It depends on the **mode** ON and OFF for example, and on the fact that the temperature is below 100° Celcius or not.

# HA syntax and semantics

# Hybrid automata - Syntax

- $H=(Loc,\Sigma,Edge,X,Init,Inv,Flow,Jump)$ , where:
  - $Loc$  is a finite set  $\{l_1,l_2,\dots,l_n\}$  of (control locations) modeling **control modes** of the automaton;
  - $\Sigma$  is a finite set of **event names**;
  - $Edge \subseteq Loc \times \Sigma \times Loc$  is a finite set of labelled edges that represent **discrete changes** between control modes;
  - $X$  is a finite set  $\{x_1,x_2,\dots,x_m\}$  of **real-valued variables**.  
We write  $X'=\{x'_1,x'_2,\dots,x'_m\}$  for the associated dotted variables and  $X''=\{x''_1,x''_2,\dots,x''_m\}$  for the associated primed variables.
  - $Init$ ,  $Inv$ , and  $Flow$  are functions that assign three predicates to each location.
  - $Jump$  is a function that assigns a predicate to each labelled edge.

# An hybrid automaton for the tank



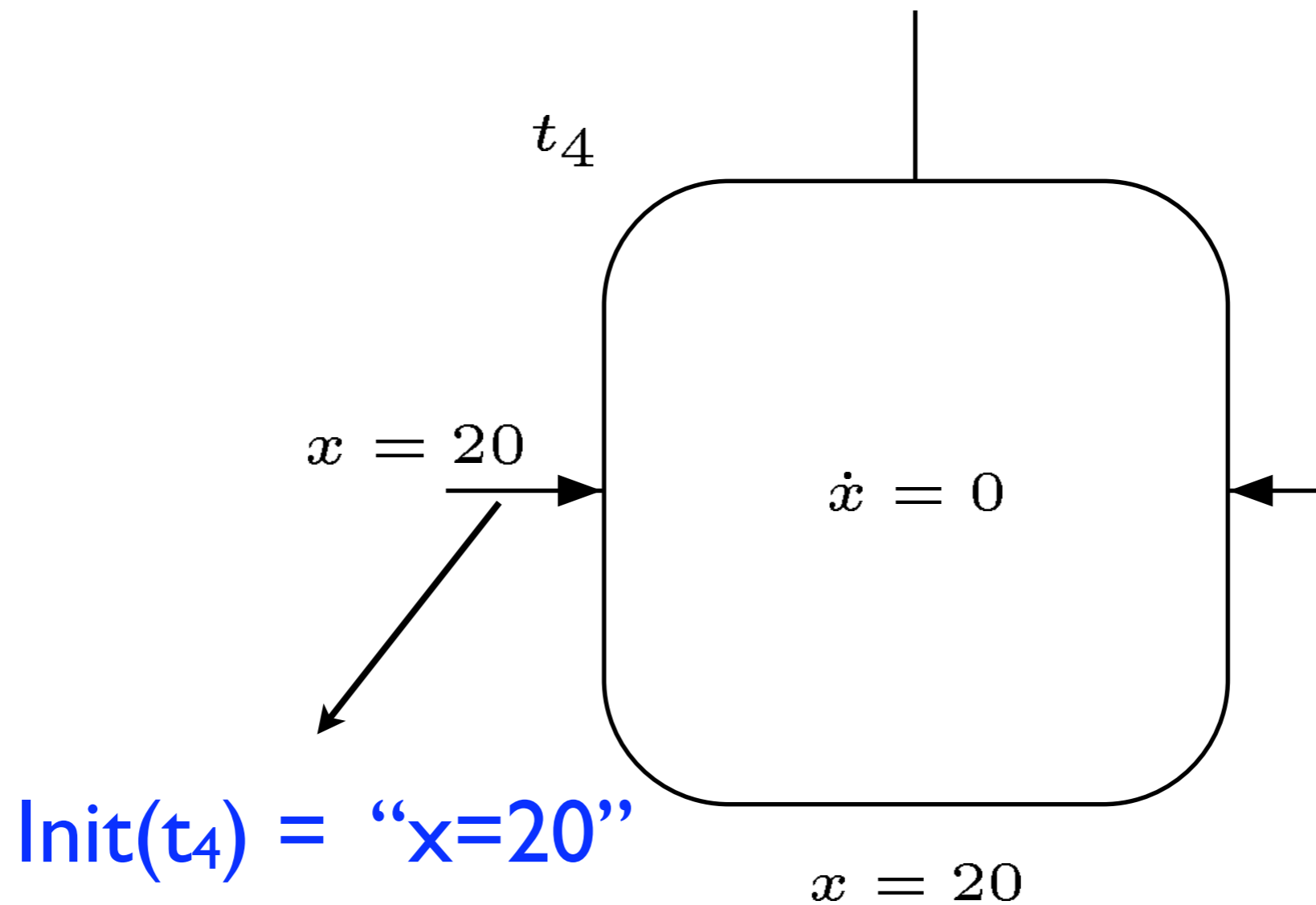


# Hybrid automata - Syntax

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- $\text{Init}(l)$  is a predicate whose free variables are in  $X$  and which states the possible **initial valuations** for those variables when the automaton starts its execution in  $l$ ;

# An hybrid automaton for the tank



# Hybrid automata - Syntax

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- $\text{Init}(l)$  is a predicate whose free variables are in  $X$  and which states the possible **initial valuations** for those variables when the automaton starts its execution in  $l$ ;
- $\text{Inv}(l)$  is a predicate whose free variables are in  $X$  and which states the possible **valuations** for those variables when the control of the automaton lies in  $l$ ;

# An hybrid automaton for the tank

Inv

$$20 \leq x \leq 100$$

$t_1$

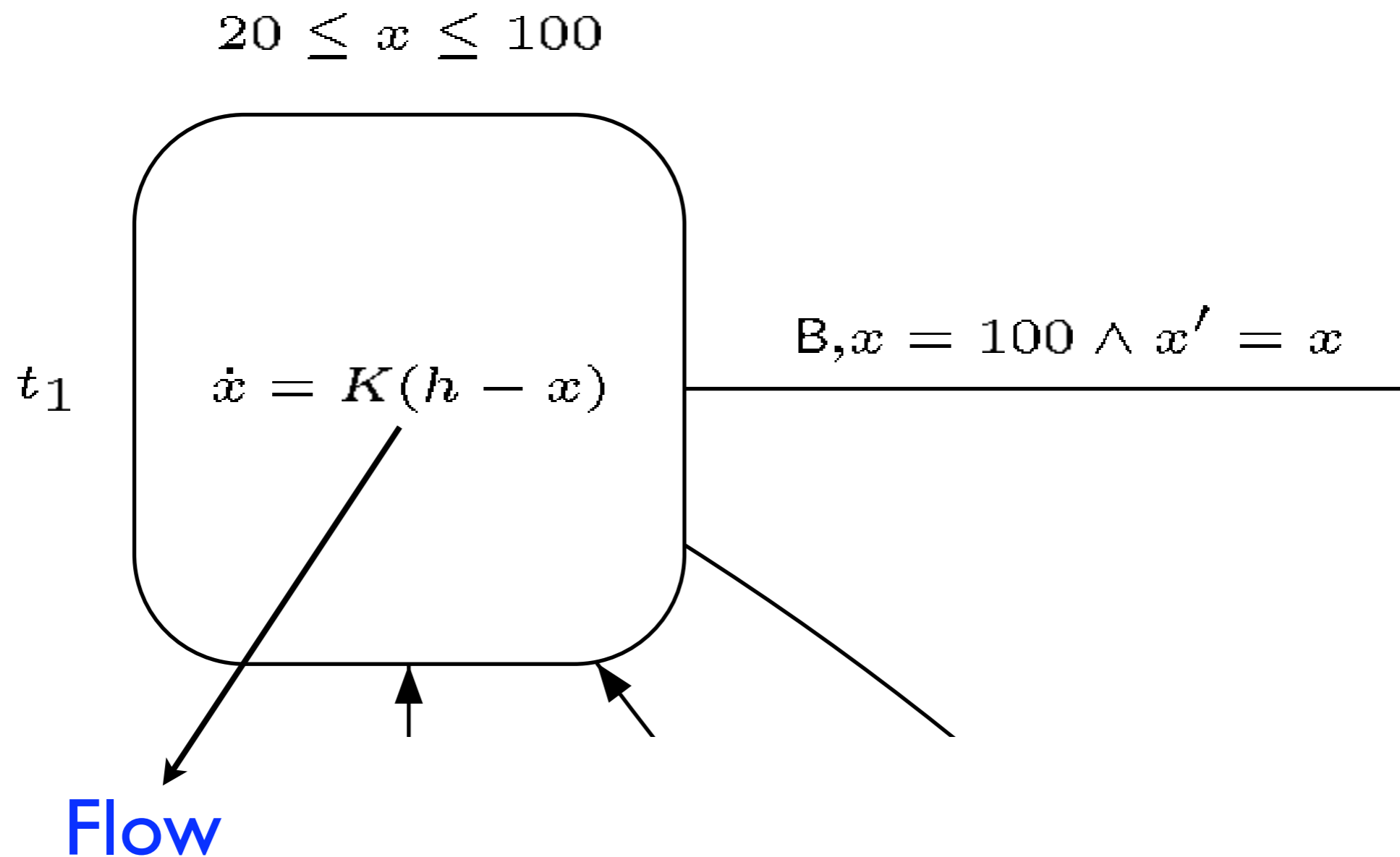
$$\dot{x} = K(h - x)$$

$$B, x = 100 \wedge x' = x$$

# Hybrid automata - Syntax

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- $\text{Flow}(l)$  is a predicate whose free variables are in  $X \cup X'$  and which states the possible **continuous evolutions** when the control of the hybrid automaton is in  $l$ ;
- $\text{Jump}(e)$  is a predicate whose free variables are in  $X \cup X'$  and which states when the discrete jump is possible and what is its effect on the continuous variables.

# An hybrid automaton for the tank



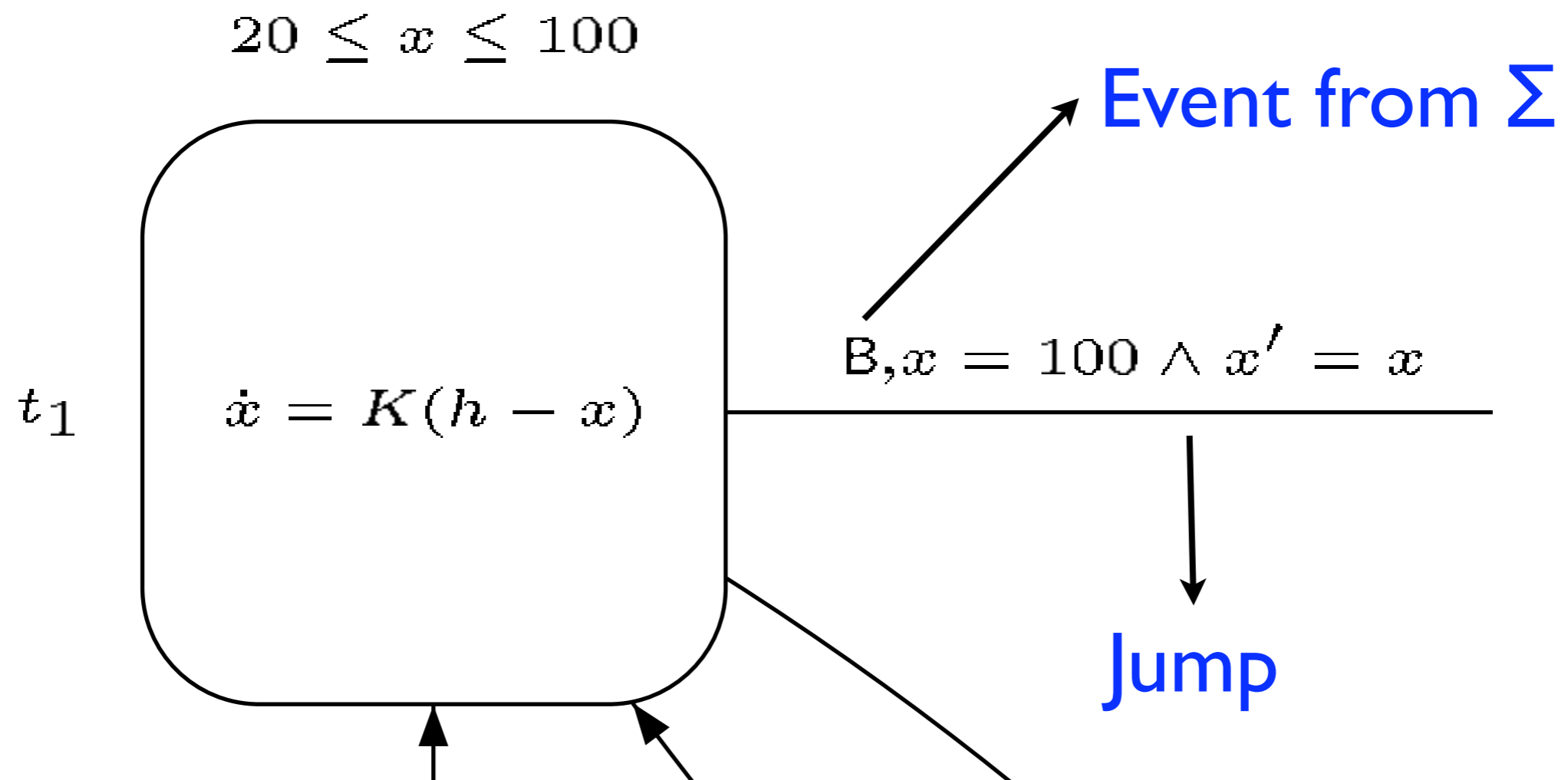
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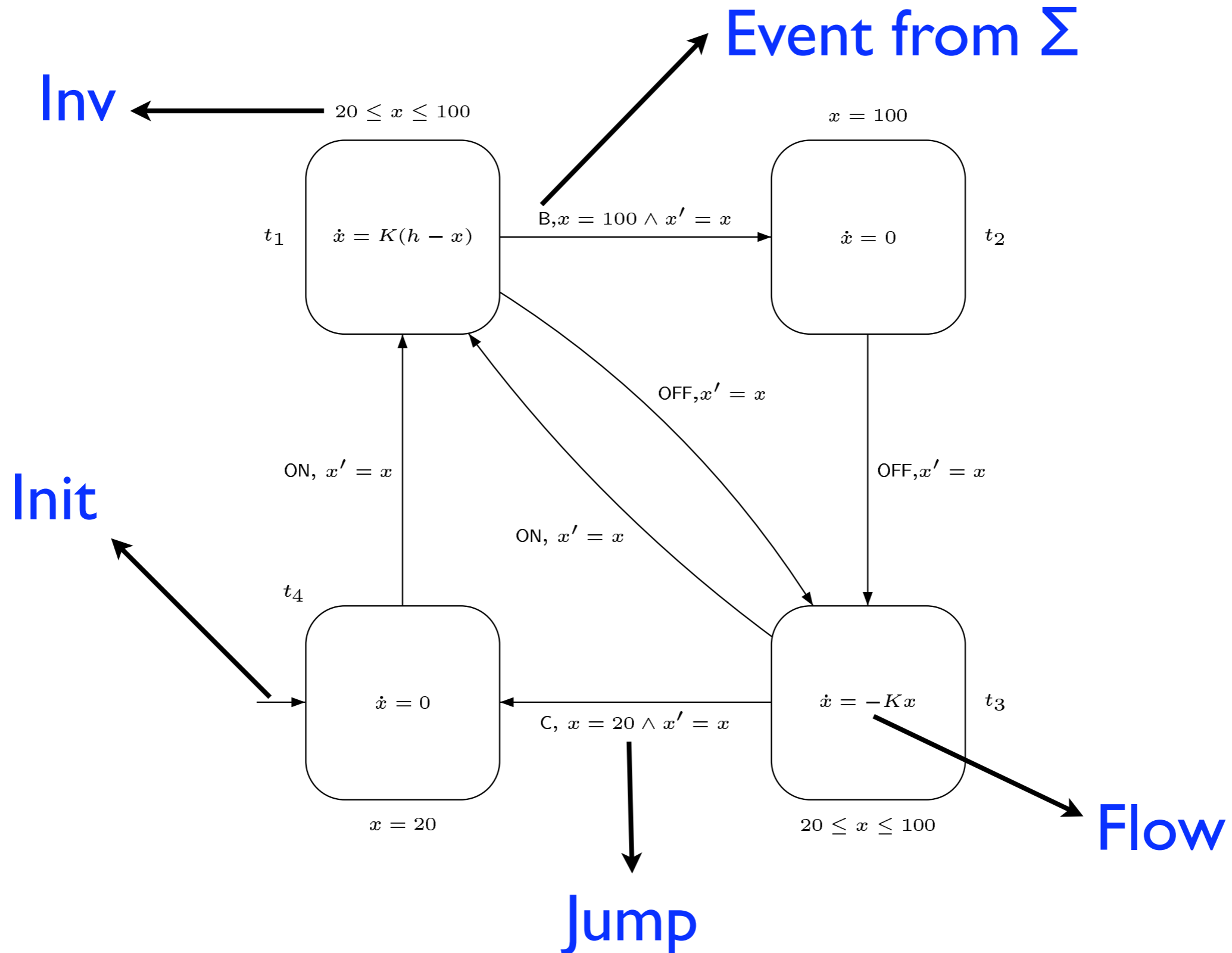
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# An hybrid automaton for the tank



# An hybrid automaton for the tank



# Semantics

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- At any instant in time, the state of the hybrid automaton specifies the **control** location and **values** for all the real-valued variables.
- The state can change in two ways:
  - **discrete**: by an instantaneous jump that changes possibly both the control and the values of real-variables;
  - **continuous**: by a time delay that changes only the values of the real-valued variables in a smooth manner according to the flow and invariant of the current control location.
- To capture such behaviors in a formal way, we use **timed transition systems**.

# Timed transition systems

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- A **timed transition system** (TTS) is a tuple  $(S, S_0, \Sigma, \rightarrow)$  where:
  - $S$  is a (possibly infinite) set of **states**;
  - $S_0$  is the subset of **initial states**;
  - $\Sigma$  is a finite set of **labels**;
  - $\rightarrow \subseteq S \times \Sigma \cup \mathbb{R}^{\geq 0} \times S$  is the **transition relation**.

# Timed transition systems

- Notations:

- $[X \rightarrow \mathbb{R}]$  denotes the set of functions from  $X$  to  $\mathbb{R}$ ;
- Let  $p$  be a predicate over the set of variables  $X$ , we note  $\llbracket p \rrbracket$  the set of valuations  $v \in [X \rightarrow \mathbb{R}]$  satisfying  $p$ ;
- Let  $q$  be a predicate over the set of variables  $X \cup X'$ , we note  $\llbracket q \rrbracket$  the set of pairs of valuations  $(v, v') \in [X \rightarrow \mathbb{R} \times X' \rightarrow \mathbb{R}]$  satisfying  $q$ ;
- Let  $r$  be a predicate over the set of variables  $X \cup X'$ , we note  $\llbracket r \rrbracket$  the set of pairs of valuations  $(v, v') \in [X \rightarrow \mathbb{R} \times X' \rightarrow \mathbb{R}]$  satisfying  $r$ .

# Timed transition system of a HA

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- Let  $H=(\text{Loc},\Sigma,\text{Edge},X,\text{Init},\text{Inv},\text{Flow},\text{Jump})$  be a HA.
- Its associated **TTS**  $\llbracket H \rrbracket=(S,S_0,\Sigma,\rightarrow)$  is defined as follows:
  - **S** is the set of pairs  $(l,v)$  where  $l \in \text{Loc}$  and  $v \in \llbracket \text{Inv}(l) \rrbracket$ ;
  - **S<sub>0</sub>** is the subset of pairs  $(l,v) \in S$  such that  $v \in \llbracket \text{Init}(l) \rrbracket$ ;

# Timed transition system of a HA

## Transition relation

- **discrete steps:**  
for each edge  $e=(l,\sigma,l')\in E$ , we have  $(l,v)\rightarrow_{\sigma}(l',v')$   
if  $(l,v)\in S$ ,  $(l',v')\in S$  and  $(v,v')\in\llbracket\text{Jump}(e)\rrbracket$ ;
- **continuous steps:** for each  $\delta\in\mathbb{R}\geq 0$ , we have  $(l,v)\rightarrow_{\delta}(l',v')$   
if  $(l,v)\in S$ ,  $(l',v')\in S$ ,  $l=l'$ , and there exists a *differentiable function*  $f:[0,\delta]\rightarrow\mathbb{R}^m$ , with derivative  $f'(0,\delta)\rightarrow\mathbb{R}^m$   
such that :
  - 1)  $f(0)=v$ ,
  - 2)  $f(\delta)=v'$  and
  - 3) for all  $\varepsilon\in(0,\delta)$ , both  $f(\varepsilon)\in\llbracket\text{Inv}(l)\rrbracket$  and  
 $(f(\varepsilon), f'(\varepsilon))\in\llbracket\text{Flow}(l)\rrbracket$ .



# Timed transition system of a HA

- In the timed transition system giving the semantics of the HA, we **abstract continuous flows** by transitions retaining only the information about the **source, target and duration of each flow**.

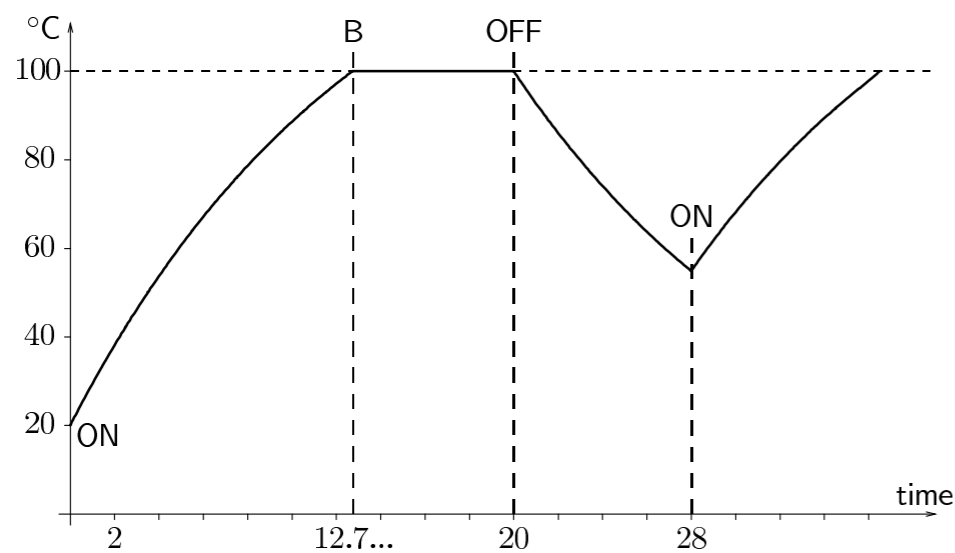
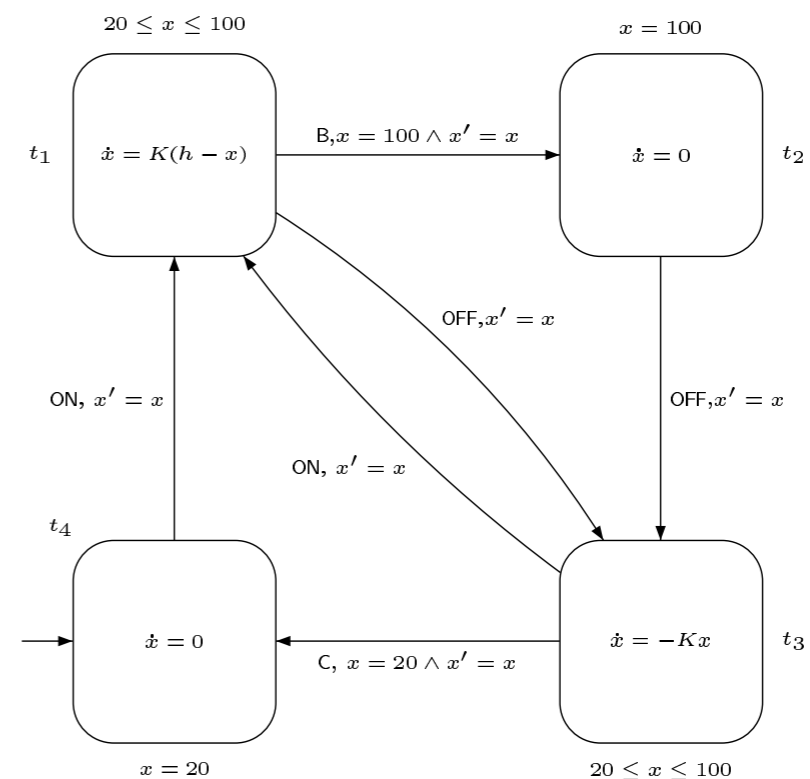


Fig. 2. One possible behavior of the tank



Abstracted by:  
(t1,20)

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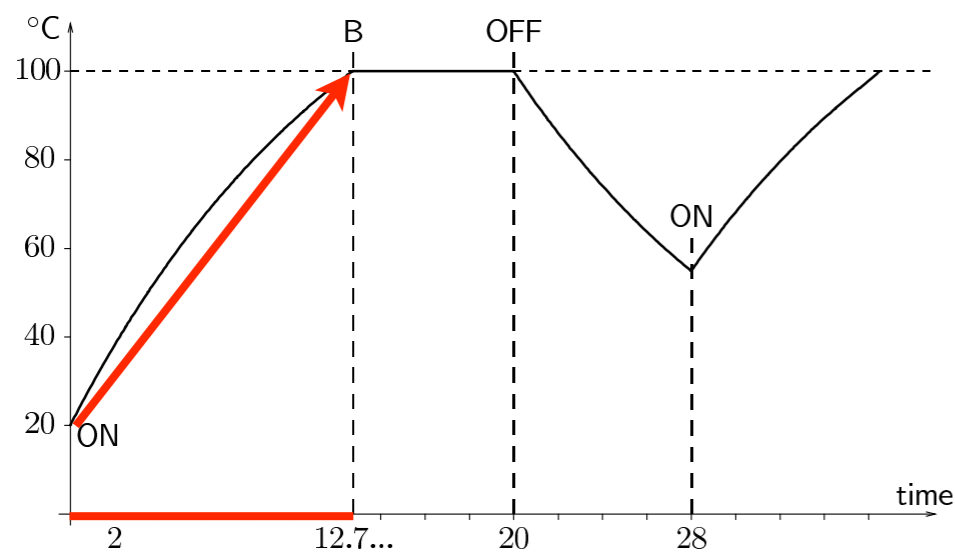
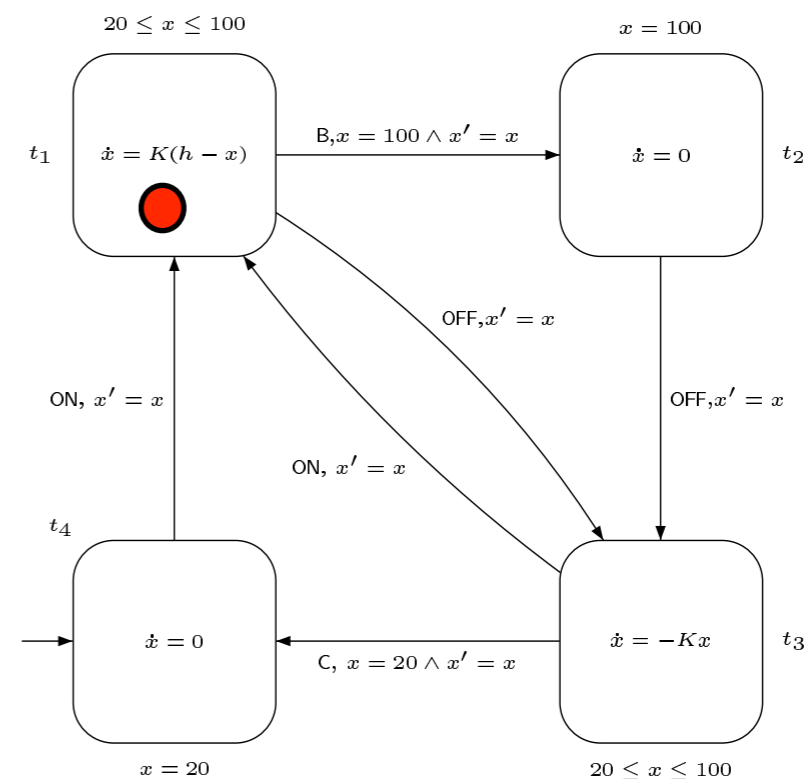


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Abstracted by:

$(t1, 20) \rightarrow 12,7... \rightarrow (t1, 100)$

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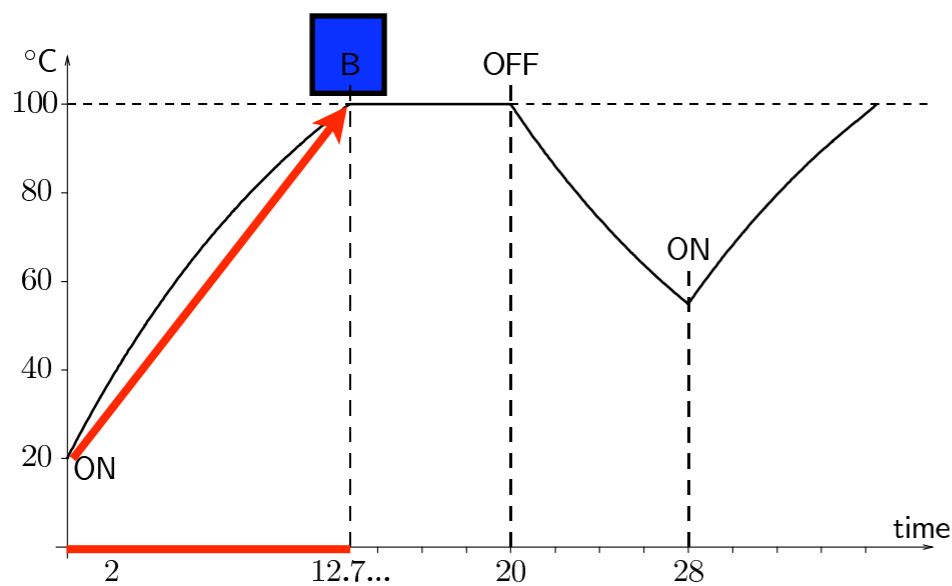
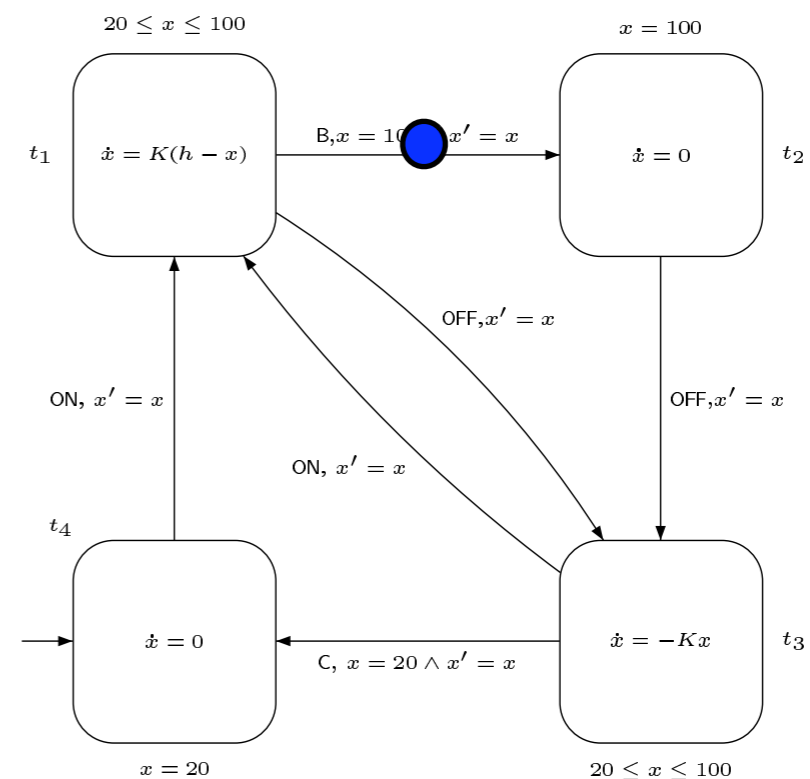


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Abstracted by:

$(t1, 20) \rightarrow 12,7... \rightarrow (t1, 100) \rightarrow B \rightarrow (t2, 100)$

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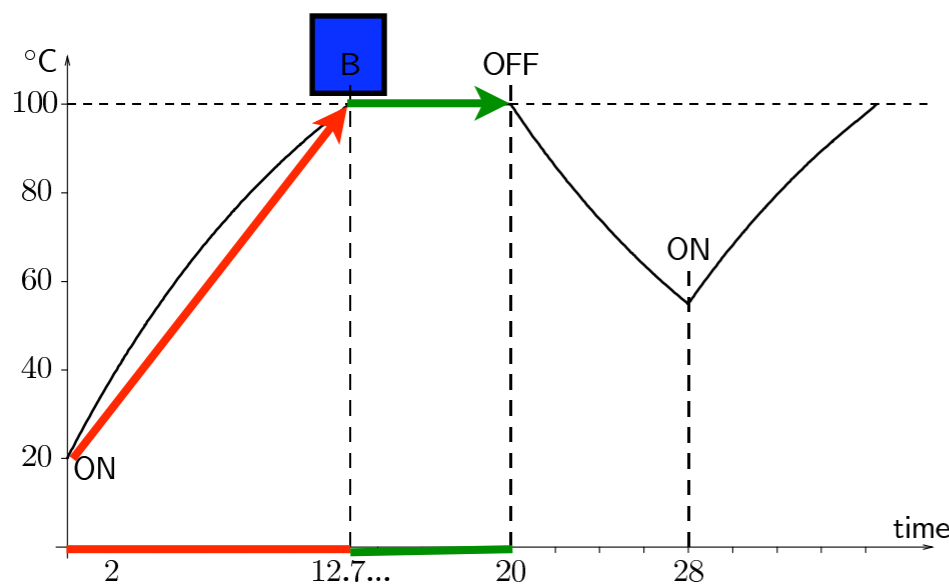
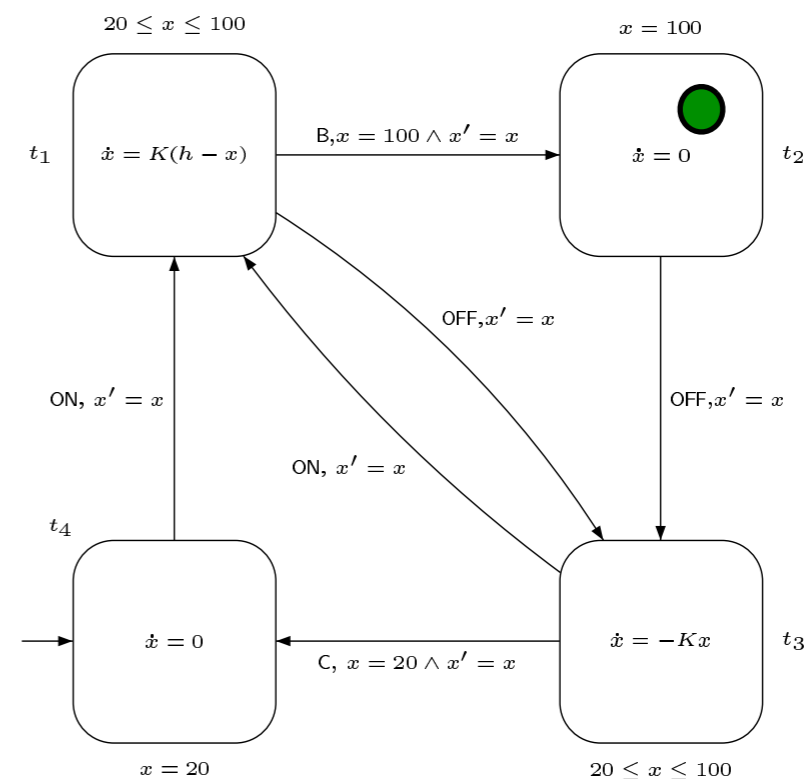


Fig. 2. One possible behavior of the tank



Abstracted by:

$(t1, 20) \rightarrow 12,7... \rightarrow (t1, 100) \rightarrow B \rightarrow (t2, 100) \rightarrow 7,2... \rightarrow (t1, 100)$

# Timed transition system of a HA

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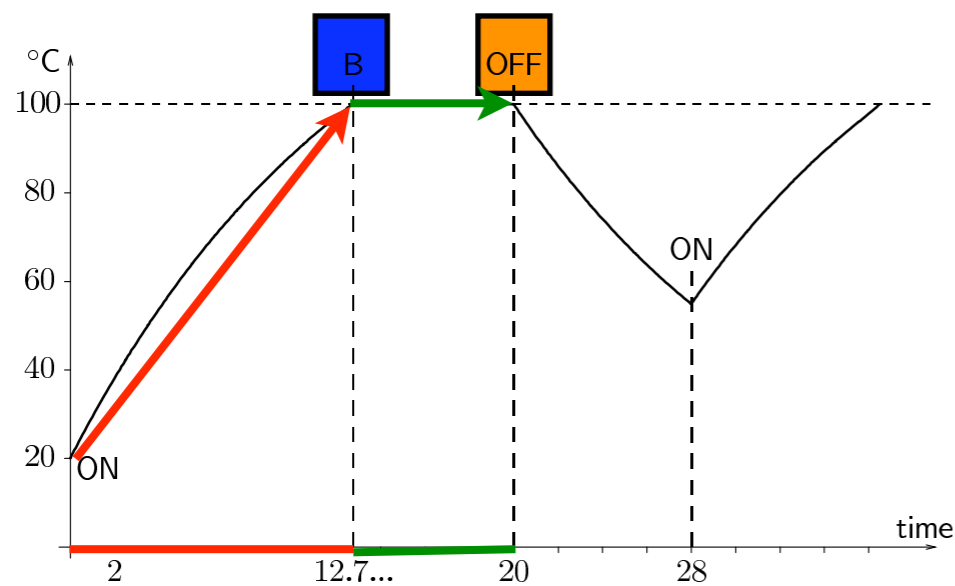
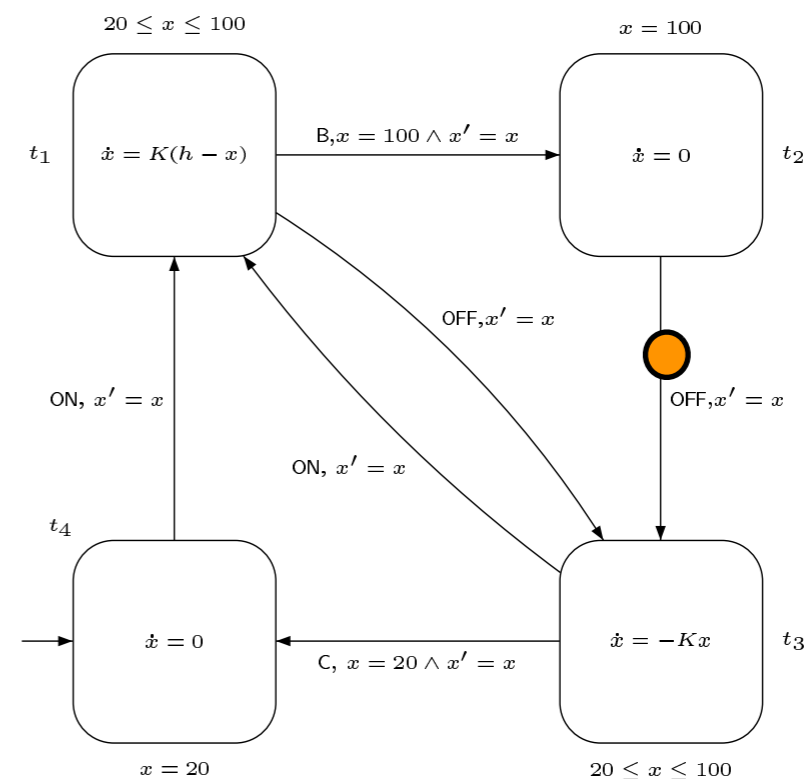


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Abstracted by:

$(t1, 20) \rightarrow 12,7... \rightarrow (t1, 100) \rightarrow B \rightarrow (t2, 100) \rightarrow 7,2... \rightarrow (t1, 100) \rightarrow OFF \rightarrow (t3, 100)$

# Timed transition system of a HA

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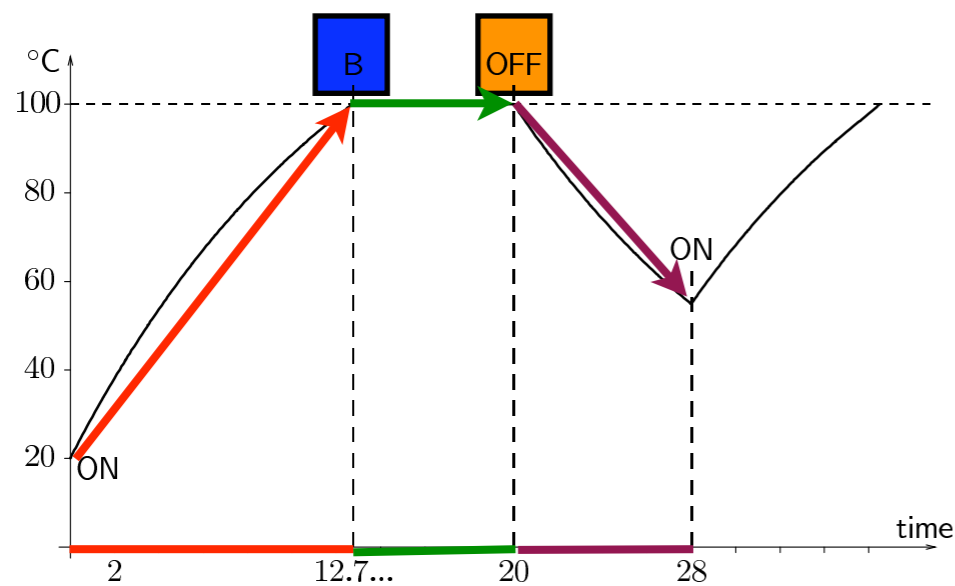
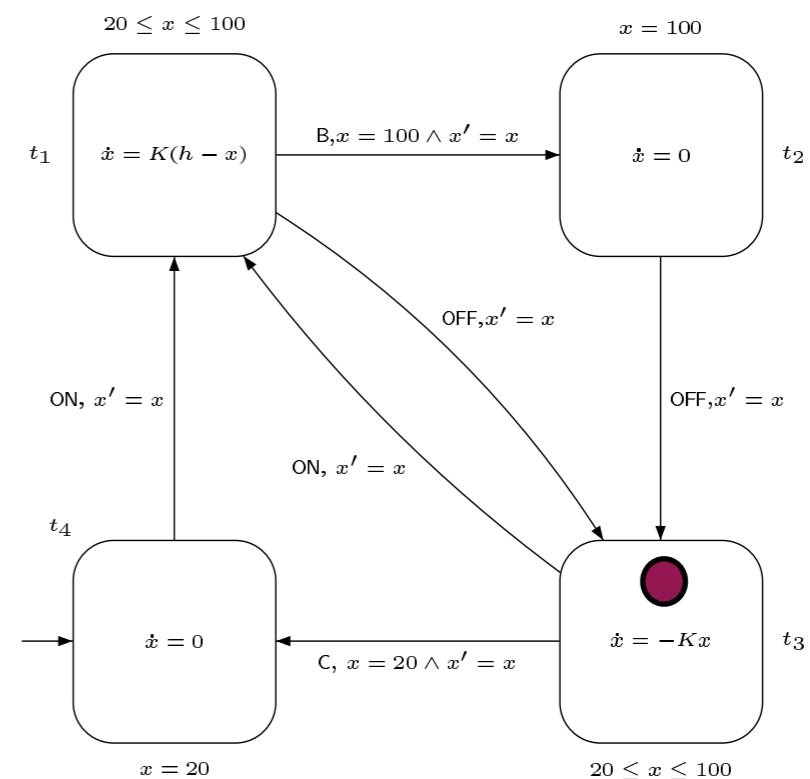


Fig. 2. One possible behavior of the tank



Abstracted by:

$(t1, 20) \rightarrow 12,7... \rightarrow (t1, 100) \rightarrow B \rightarrow (t2, 100) \rightarrow 7,2... \rightarrow (t1, 100) \rightarrow OFF \rightarrow (t3, 100) \rightarrow 8 \rightarrow (t3, 60)...$

# Behaviors of HA=paths in TTS

- The **paths** contained in the TTS formalize the **behaviors** of the HA;
- Formally, a finite path, noted  $\lambda$ , in the TSS  $T=(S,S_0,\Sigma,\rightarrow)$  is finite sequence  $s_0\tau_0s_1\tau_1\dots\tau_{n-1}s_n$  such that for all  $i$ ,  $1\leq i\leq n$ ,  $(s_i,\tau_i,s_{i+1})\in\rightarrow$ .

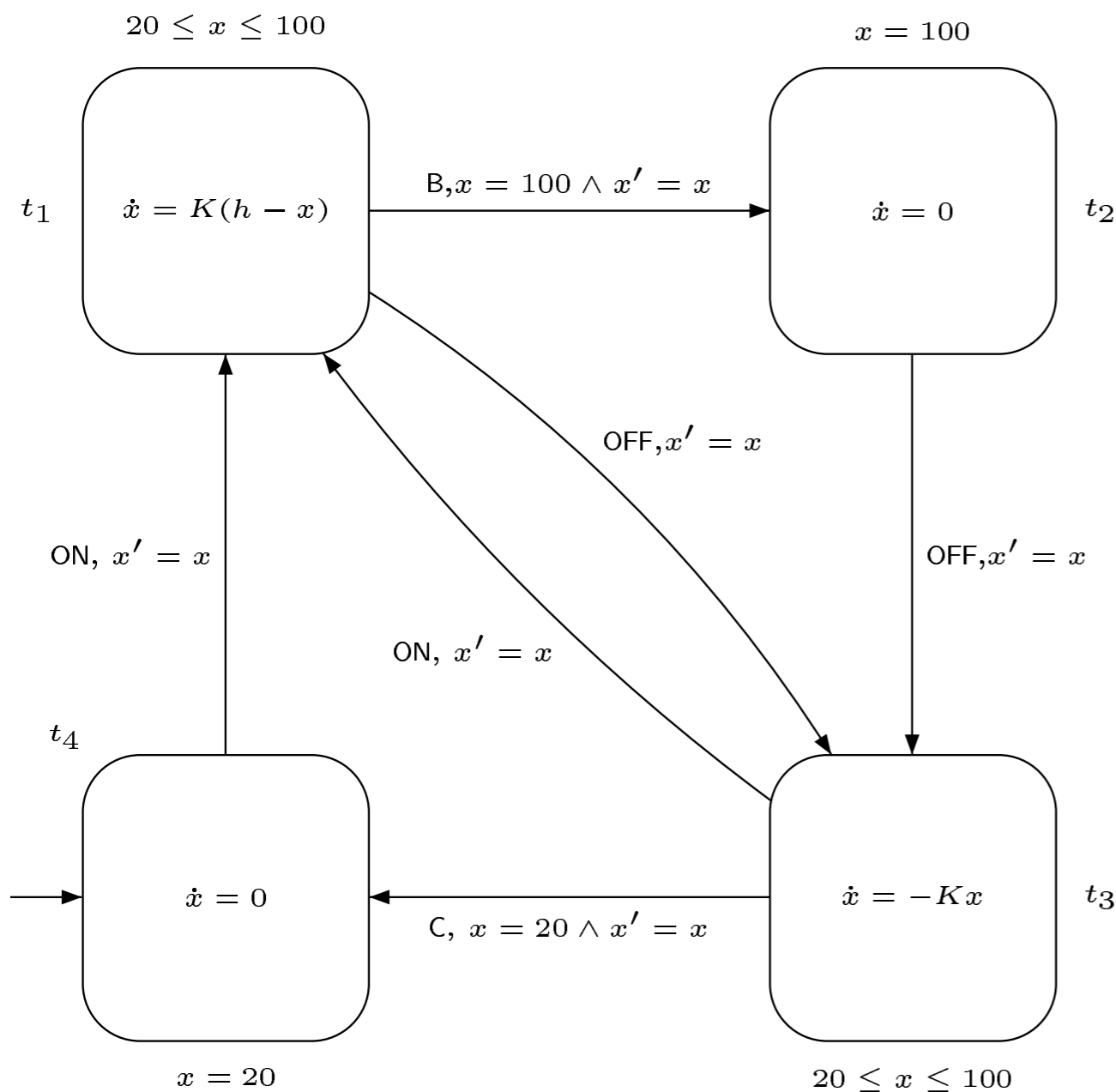
This definition extends to infinite paths.

- The **duration** of a path is the sum of the durations of its time elapsing steps.
- We write  $\text{Path}_F(\llbracket H \rrbracket)$  for the set of finite paths in  $\llbracket H \rrbracket$  and  $\text{Path}_\infty(\llbracket H \rrbracket)$  for the set of infinite paths in  $\llbracket H \rrbracket$ .



# Ex. of an element in PathF([Tank])

$$\begin{aligned}
 & (t_4, x \mapsto 20) \xrightarrow{(1) \text{ ON}} (t_1, x \mapsto 20) \xrightarrow{(2) \text{ 10}} (t_1, x \mapsto 88.59 \dots) \xrightarrow{(3) \text{ 2.74} \dots} (t_1, x \mapsto 100) \xrightarrow{(4) \text{ B}} \\
 & (t_2, x \mapsto 100) \xrightarrow{(5) \text{ 5}} (t_2, x \mapsto 100) \xrightarrow{(6) \text{ OFF}} (t_3, x \mapsto 100) \xrightarrow{(7) \text{ 8}} (t_3, x \mapsto 54.88 \dots)
 \end{aligned}$$



(1) discrete step

(2)  $f(t) = 20e^{-0.075t} + 150(1 - e^{-0.075t})$   
on  $[0, 10]$   
and  $f(0) = 20, f(10) = 88,59 \dots$

(3)  $f(t) = 88,59 \dots e^{-0.075t} + 150(1 - e^{-0.075t})$   
on  $[0, 2.75]$

...

(5)  $f(t) = 100$

# Remark on non Zenoness

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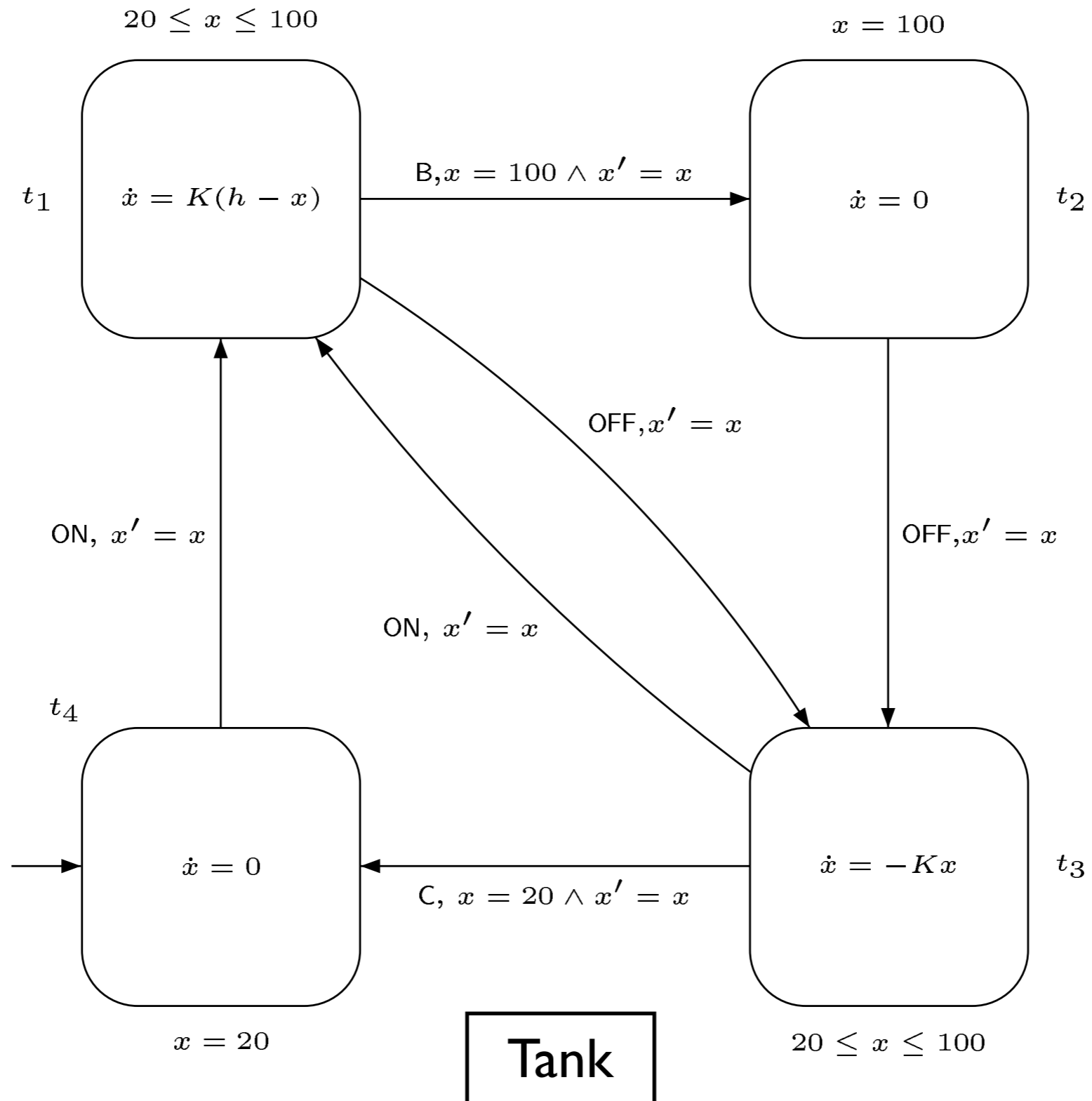
- Often, when considering behaviors of systems along (real) time, we are interested by **nonZeno** behaviors, that is behaviors in which time is not blocked.
- In fact, a trajectory in which there are discrete jumps say at times 0.5, 0.75, 0.875, 0.9375, 0.96875, ... is **not** implementable by a discrete controller.
- We say that an infinite path  $\lambda$  is **nonZeno** if  $\text{Duration}(\lambda) = +\infty$ .
- The divergence of time is a **liveness assumption**.

# Composition of HA

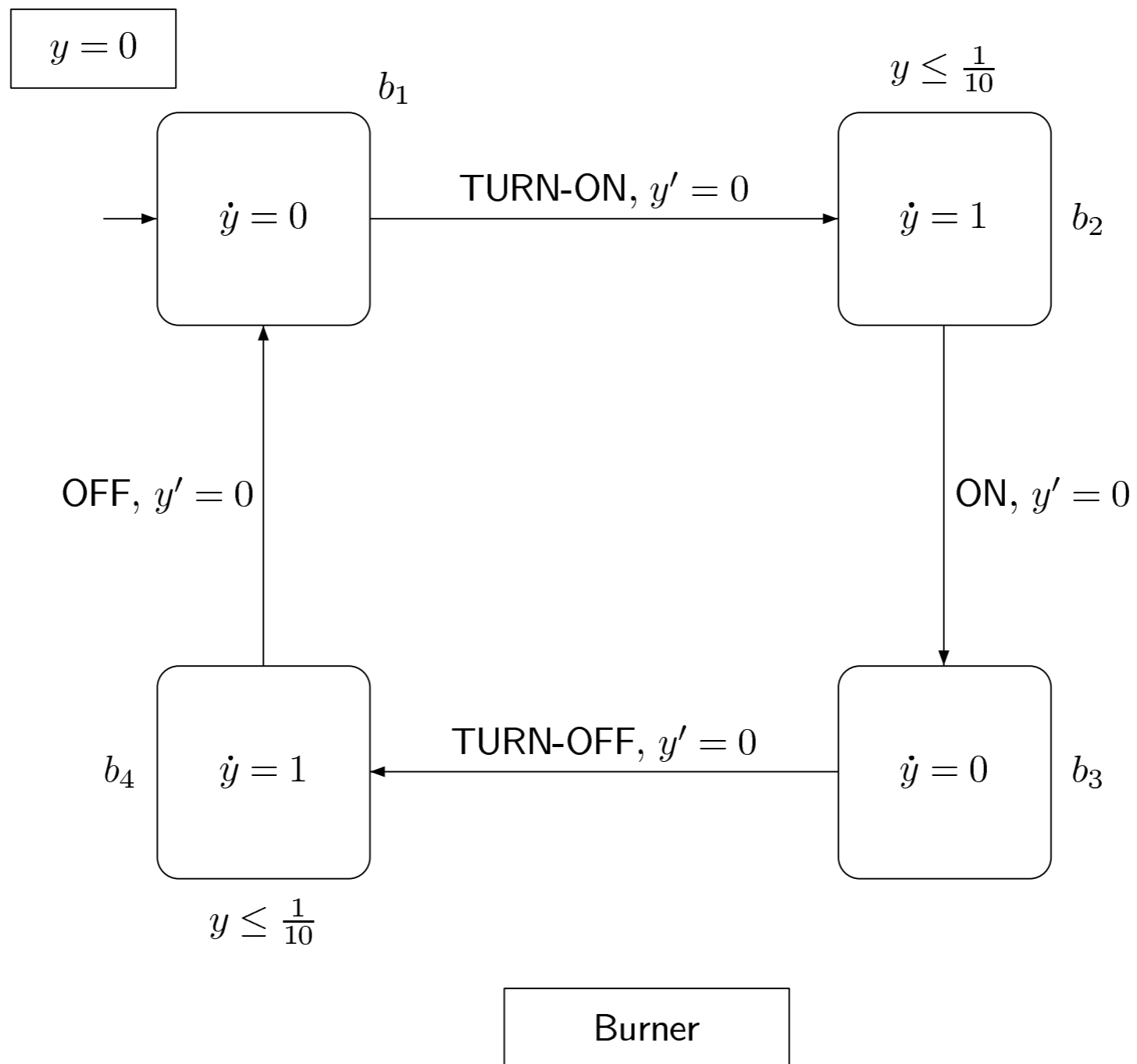
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- Nontrivial hybrid systems consist of several **interacting** components;
- We model each component as a hybrid automaton ...
- ... and the components coordinate with each other by **shared variables** and **shared events**;

# Our running example

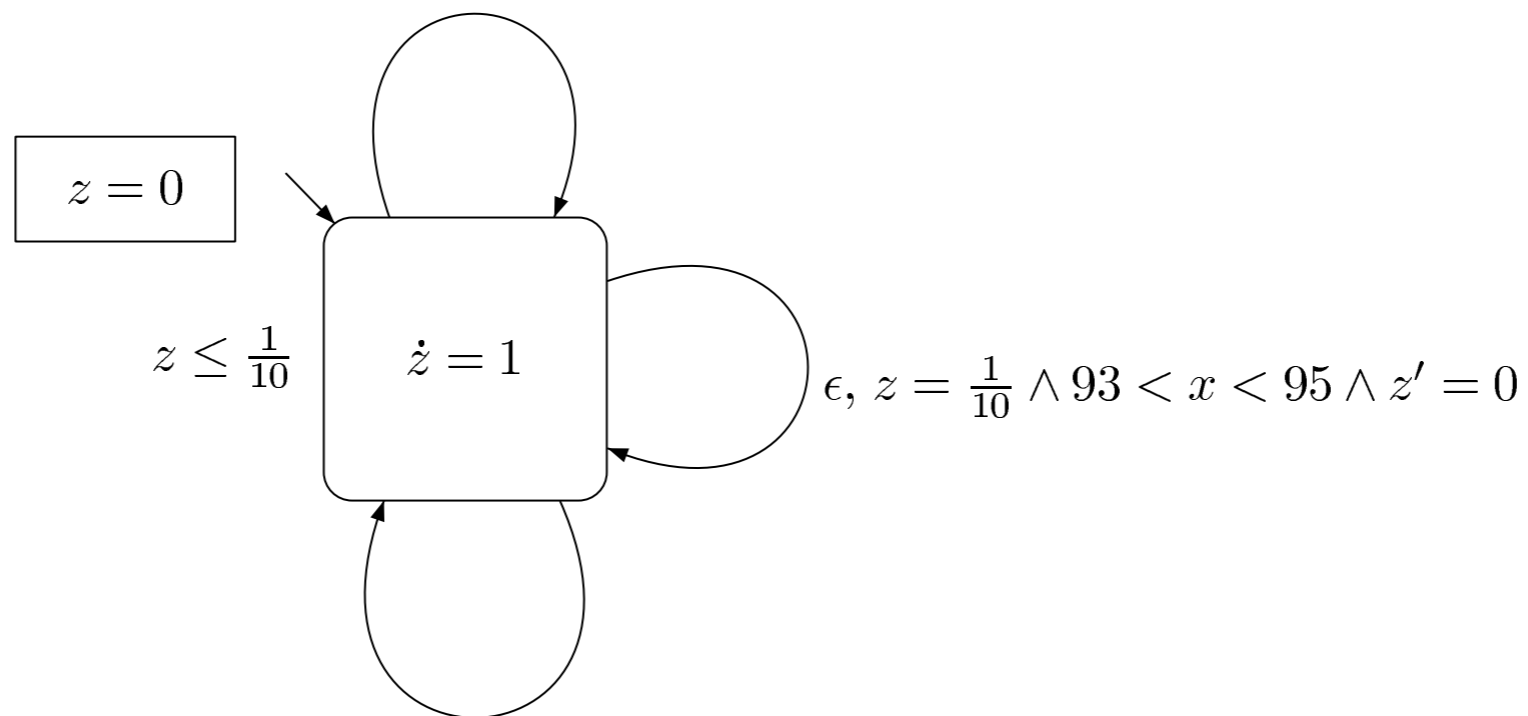


# Our running example



# Our running example

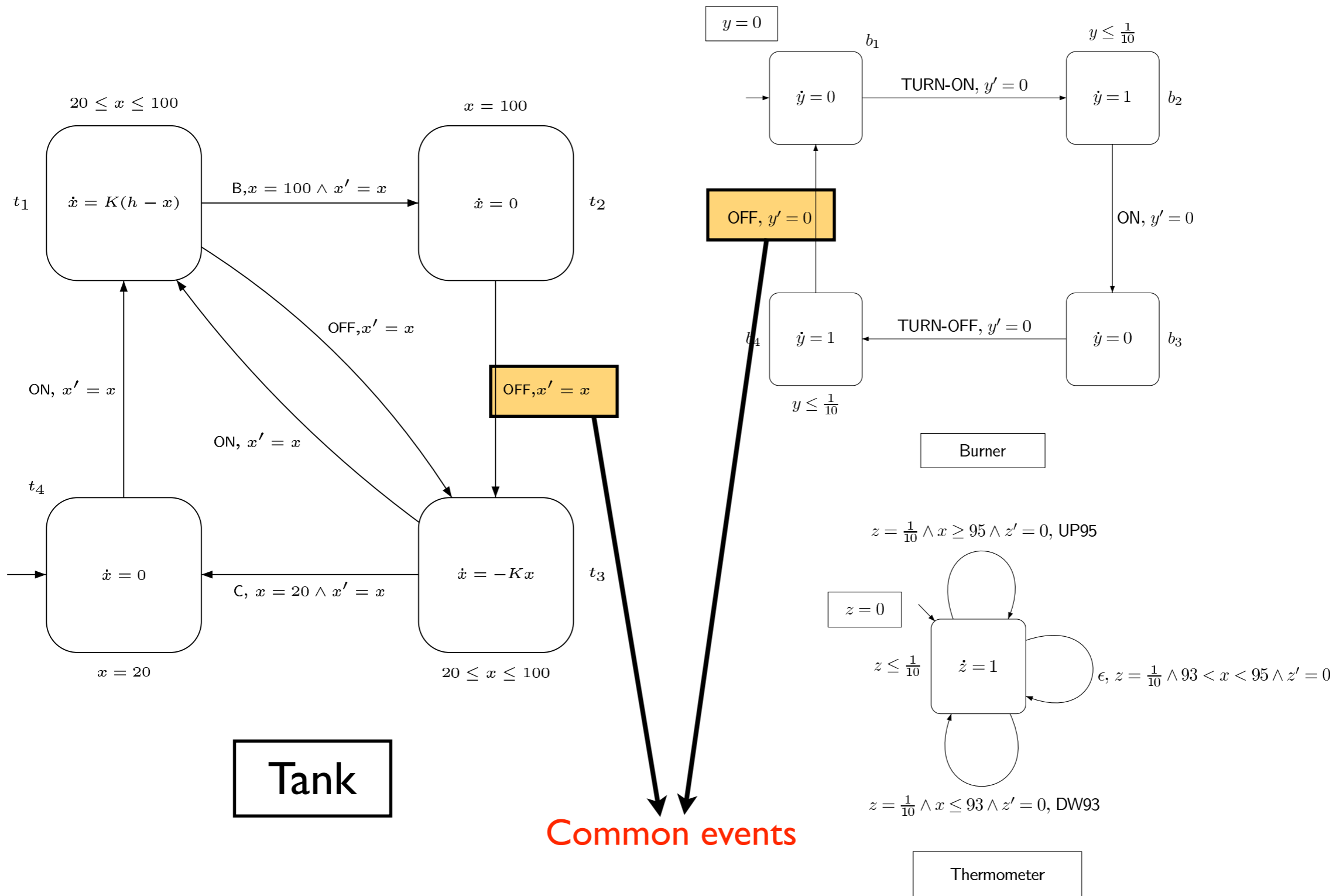
$$z = \frac{1}{10} \wedge x \geq 95 \wedge z' = 0, \text{ UP95}$$



$$z = \frac{1}{10} \wedge x \leq 93 \wedge z' = 0, \text{ DW93}$$

Thermometer

# Our running example





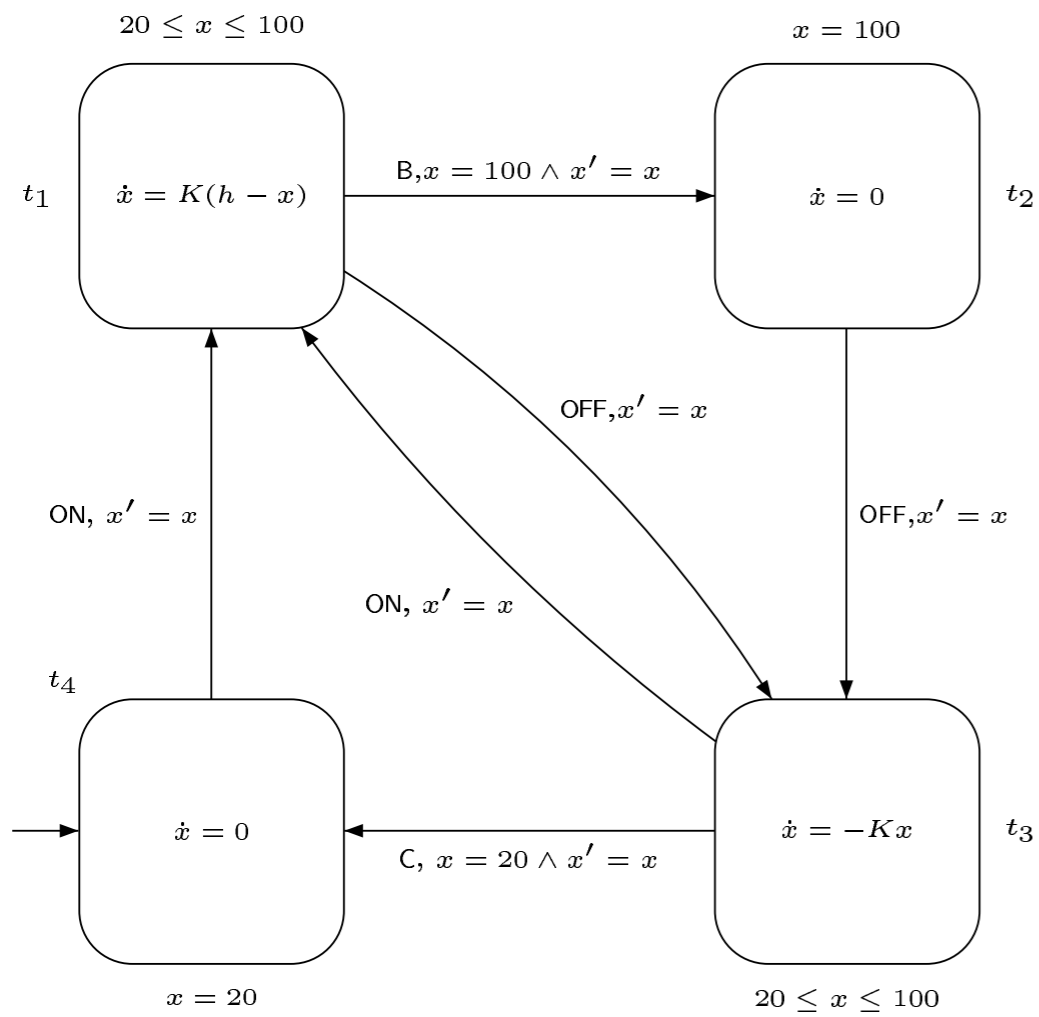
# HA product

- Let  $H^1=(Loc^1,\Sigma^1,Edge^1,X^1,Init^1,Inv^1,Flow^1,Jump^1)$  and  $H^2=(Loc^2,\Sigma^2,Edge^2,X^2,Init^2,Inv^2,Flow^2,Jump^2)$ .
- Their **synchronized product** is the hybrid automaton  $H_1 \otimes H_2=(Loc,\Sigma,Edge,X,Init,Inv,Flow,Jump)$  defined as follows:
  - $Loc=\{ \{l^1,l^2\} \mid l^1 \in Loc^1 \wedge l^2 \in Loc^2 \}$
  - $\Sigma=\Sigma^1 \cup \Sigma^2; X=X^1 \cup X^2;$
  - $Init(\{l^1,l^2\})=Init^1(l^1) \wedge Init^2(l^2);$   
 $Inv(\{l^1,l^2\})=Inv^1(l^1) \wedge Inv^2(l^2);$   
 $Flow(\{l^1,l^2\})=Flow^1(l^1) \wedge Flow^2(l^2);$

# HA product

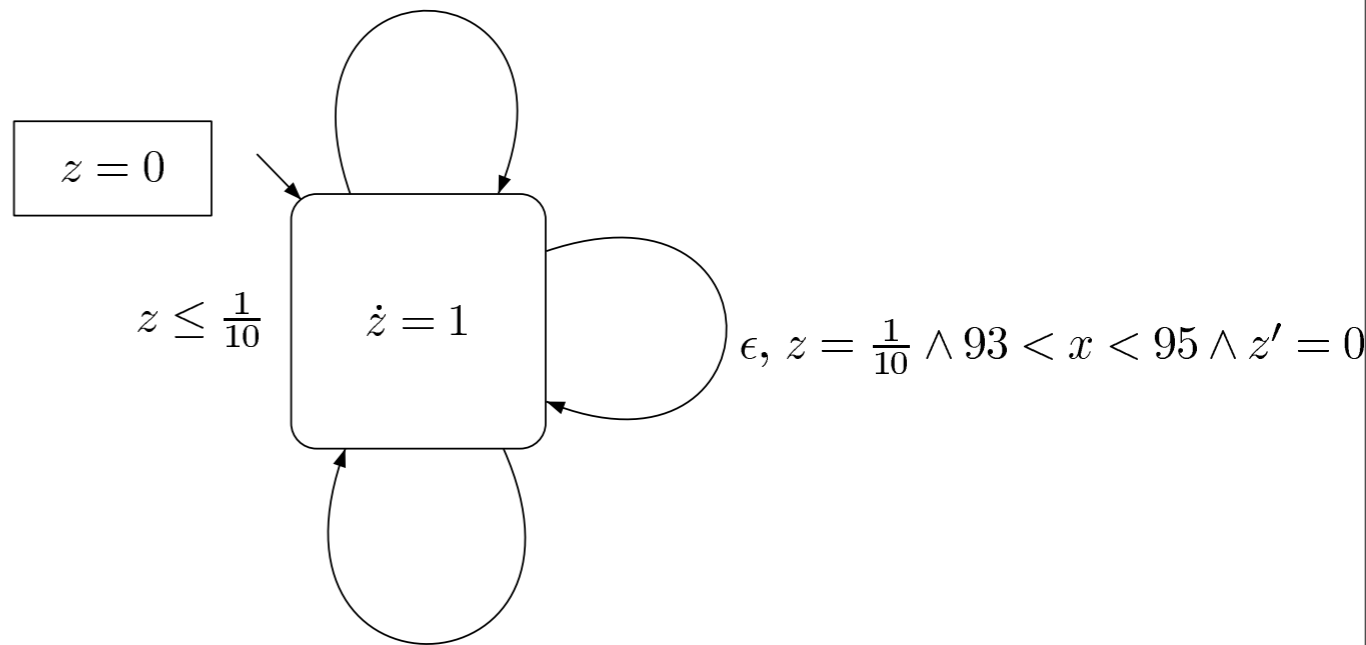
- $(\{I^1, I^2\}, \sigma, \{I^3, I^4\}) \in \text{Edge}$  iff either
  - (i)  $\sigma \in \Sigma^1 \setminus \Sigma^2$ ,  $(I^1, \sigma, I^3) \in \text{Edge}^1$ , and  $I^2 = I^4$ ;
  - (ii)  $\sigma \in \Sigma^2 \setminus \Sigma^1$ ,  $(I^2, \sigma, I^4) \in \text{Edge}^2$ , and  $I^1 = I^3$ ;
  - (iii)  $\sigma \in \Sigma^1 \cap \Sigma^2$ ,  $(I^1, \sigma, I^3) \in \text{Edge}^1$ , and  $(I^2, \sigma, I^4) \in \text{Edge}^2$ .
- for any edge  $(\{I^1, I^2\}, \sigma, \{I^3, I^4\}) \in \text{Edge}$ , we have that:
  - (i)  $\text{Jump}(\{I^1, I^2\}, \sigma, \{I^3, I^4\})$   
 $= \text{Jump}^1(I^1, \sigma, I^3) \wedge \bigwedge_{x \in X \setminus X^1} x' = x$  if  $\sigma \in \Sigma^1 \setminus \Sigma^2$
  - (ii) Symmetrically for  $\sigma \in \Sigma^2 \setminus \Sigma^1$
  - (ii)  $\text{Jump}(\{I^1, I^2\}, \sigma, \{I^3, I^4\})$   
 $= \text{Jump}^1(I^1, \sigma, I^3) \wedge \text{Jump}^2(I^2, \sigma, I^4)$  if  $\sigma \in \Sigma^1 \cap \Sigma^2$

# Ex. product of Burner and Thermometer



Tank

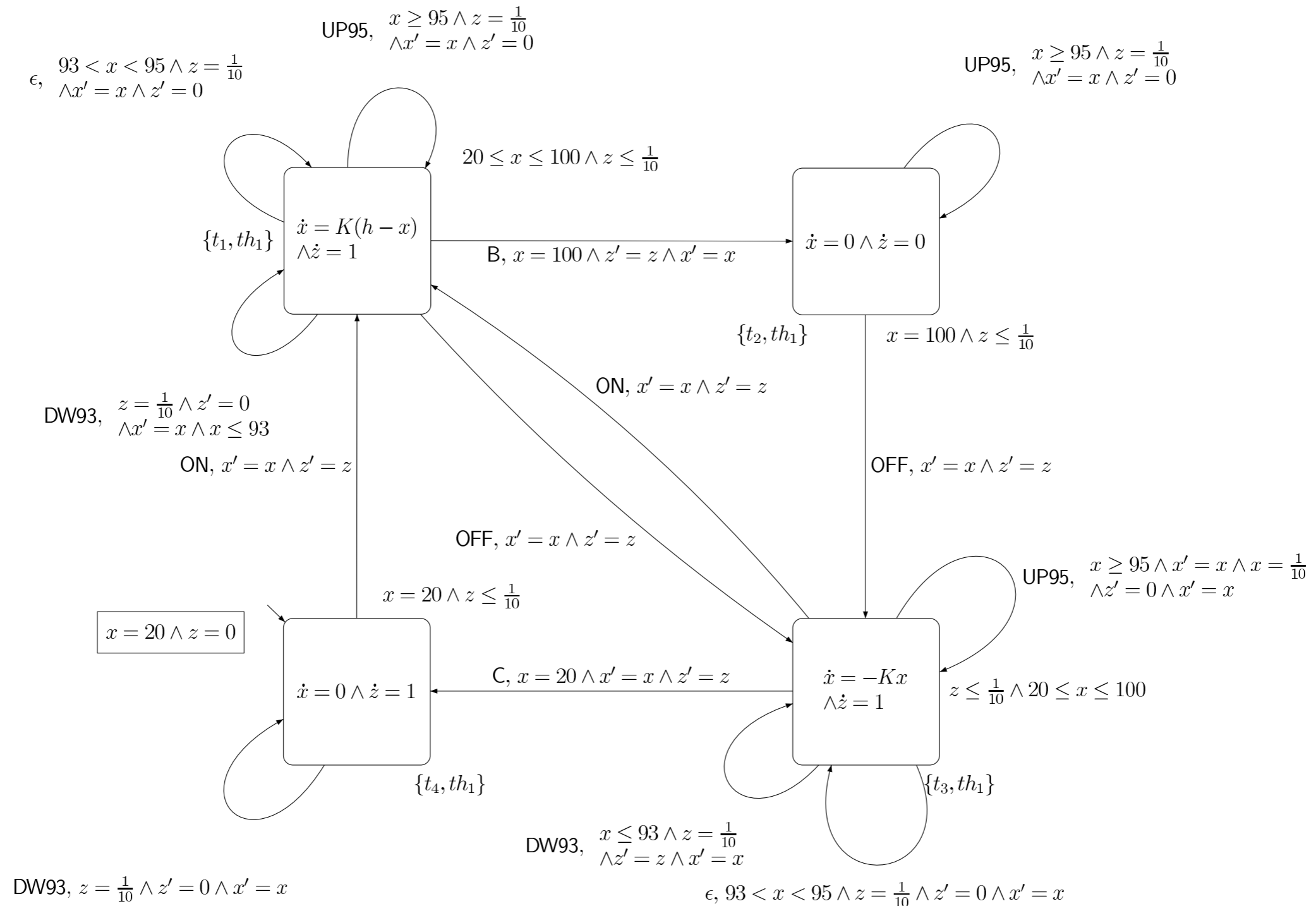
$$z = \frac{1}{10} \wedge x \geq 95 \wedge z' = 0, \text{ UP95}$$



$$z = \frac{1}{10} \wedge x \leq 93 \wedge z' = 0, \text{ DW93}$$

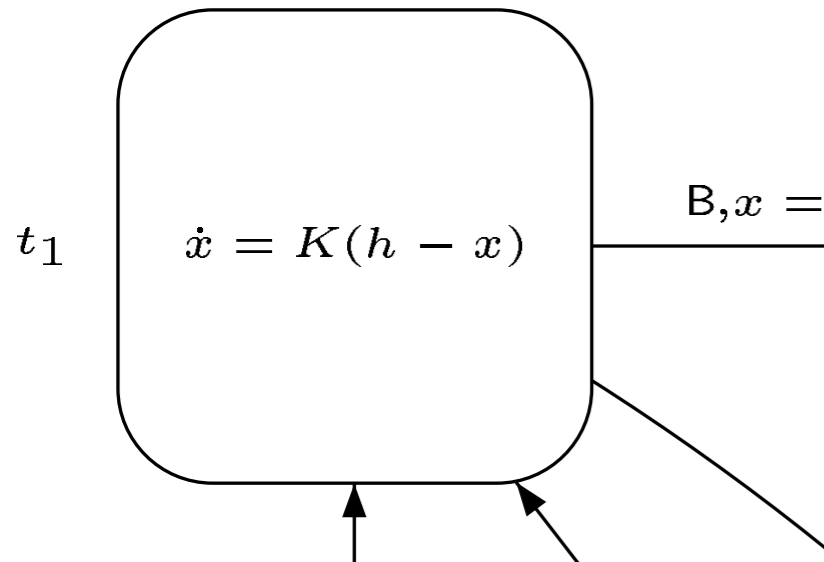
Thermometer

# Ex. product of Burner and Thermometer

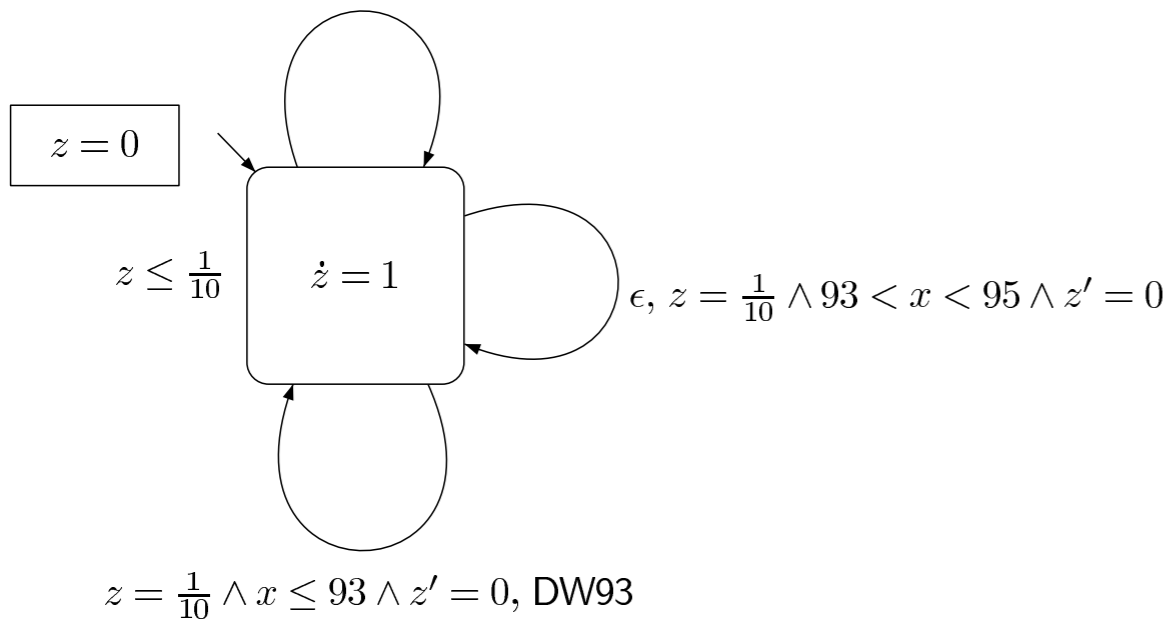


# Ex. product of Burner and Thermometer

$$20 \leq x \leq 100$$



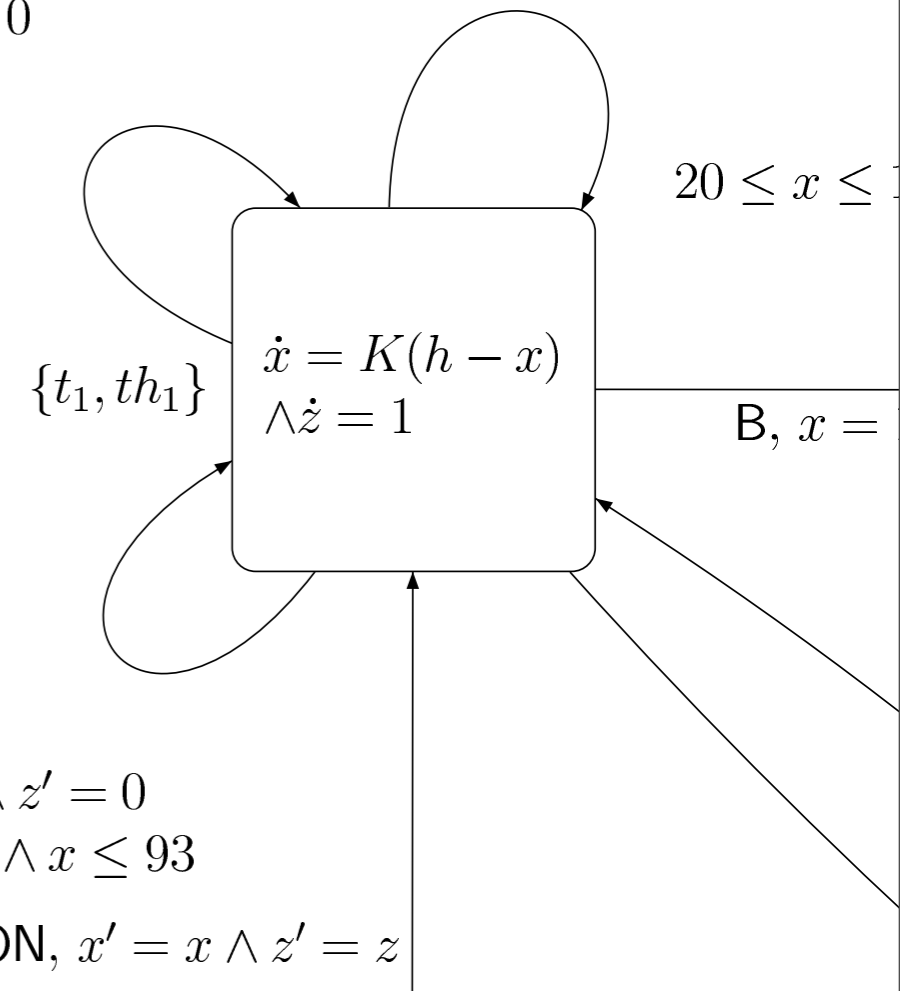
$$z = \frac{1}{10} \wedge x \geq 95 \wedge z' = 0, \text{ UP95}$$



$$z = \frac{1}{10} \wedge x \leq 93 \wedge z' = 0, \text{ DW93}$$

$$\epsilon, \quad 93 < x < 95 \wedge z = \frac{1}{10} \\ \wedge x' = x \wedge z' = 0$$

$$\text{UP95, } \quad x \geq 95 \wedge z = \frac{1}{10} \\ \wedge x' = x \wedge z' = 0$$



$$\text{DW93, } \quad z = \frac{1}{10} \wedge z' = 0 \\ \wedge x' = x \wedge x \leq 93$$

$$\text{ON, } \quad x' = x \wedge z' = z$$

# Properties of Hybrid Systems

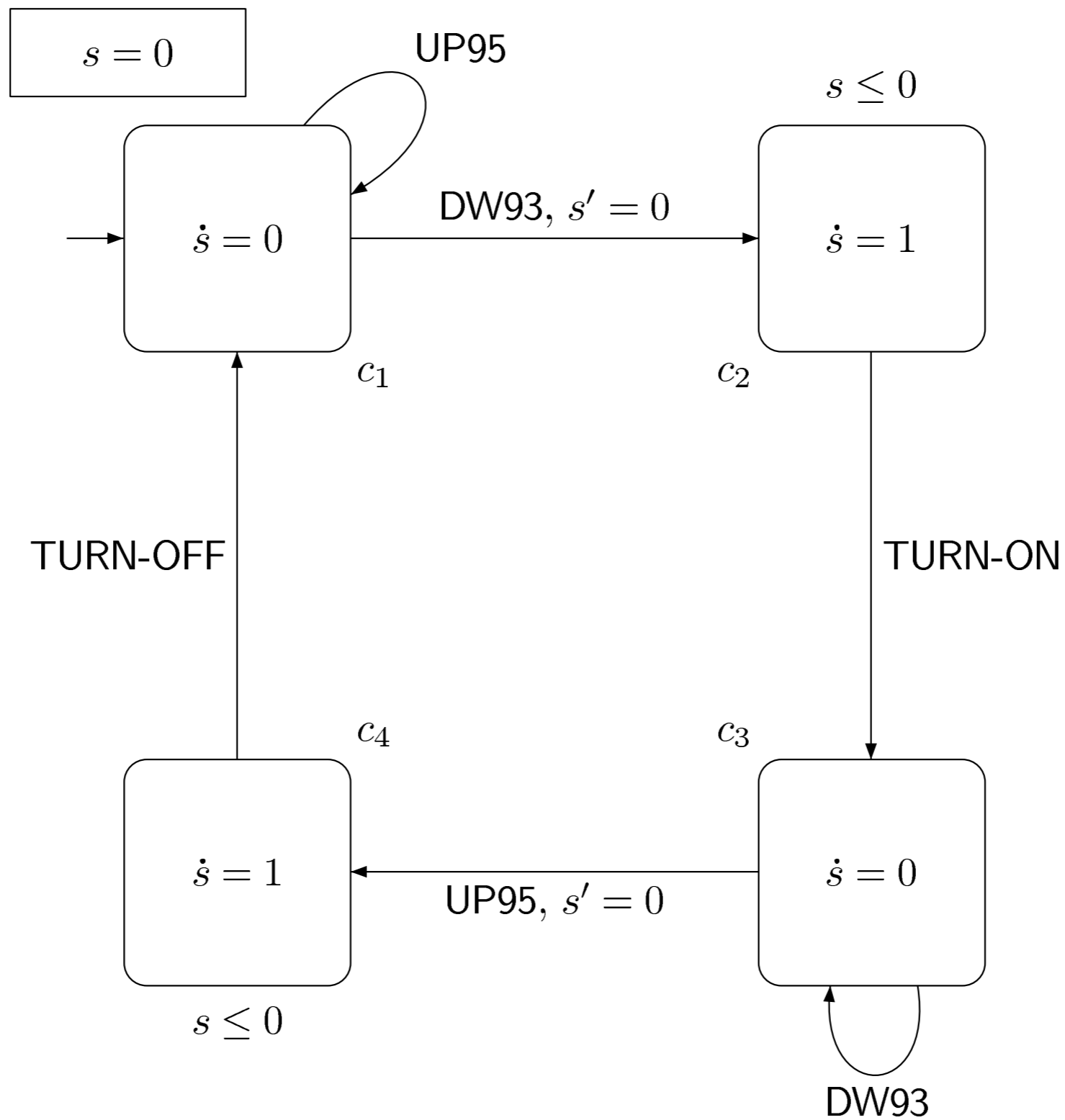
# Ex. of properties for our running example

---

- $(R_1)$  the temperature in the tank must never reach  $100^\circ$ ;
- $(R_2)$  after 15 seconds of operation, the system must be in **stable regime** (the temperature must stay in the interval  $91^\circ$ - $97^\circ$  Celcius);
- $(R_3)$  during this stable regime, the burner is never continuously ON for more than two seconds.

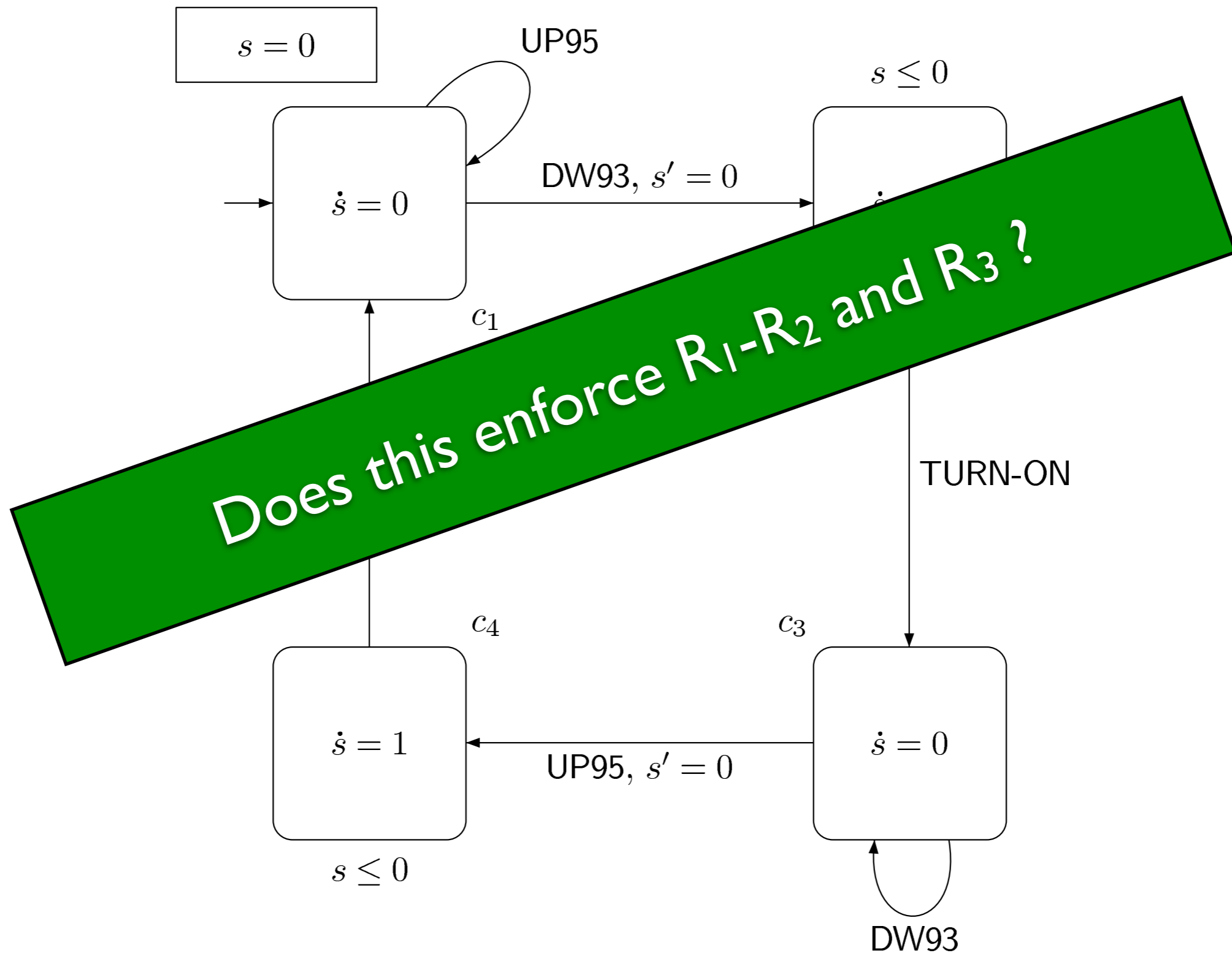
All those properties are **safety properties**.

# Candidate controller for our system





# Candidate controller for our system



# Safety and reachability

---

- To formalize safety, we need some more notations.
- Let  $T=(S,S_0,\Sigma, \rightarrow)$  be a TTS. Let  $\lambda=s_0\tau_0s_1\tau_1\dots s_n \in \text{Path}_F(T)$ .  $\text{State}(\lambda)$  denotes the set of states that appear along  $\lambda$ .
- We say that a path  $\lambda$  **reaches** a state  $s$  if  $s \in \text{State}(\lambda)$ .
- We say that  $s$  is **reachable** in  $T$  if  $s \in \bigcup_{\lambda \in \text{Path}_F(T)} \text{State}(\lambda)$ .
- $\text{Reach}(T)$  denotes the set of states reachable in  $T$ .

# Safety and reachability

- A set of state  $R \subseteq S$  is called a **region**.
- A region  $R$  is **reachable** in  $T$  iff  $R \cap \text{Reach}(T) \neq \emptyset$ .
- The **reachability problem** associated to a TTS  $T$  and a region  $R$  asks if  $R \cap \text{Reach}(T) \neq \emptyset$ .
- The **safety problem** associated to a TTS  $T$  and a region  $R$  asks if  $\text{Reach}(T) \subseteq R$ .
- Those two problems are **dual** in the following formal sense:

Let  $R$  be a region and  $R' = S \setminus R$ .

$$\text{Reach}(T) \subseteq R \text{ iff } R' \cap \text{Reach}(T) = \emptyset.$$

# Monitors

---

- Requirement  $R_1$  can be formalized using a region of **Bad** states.

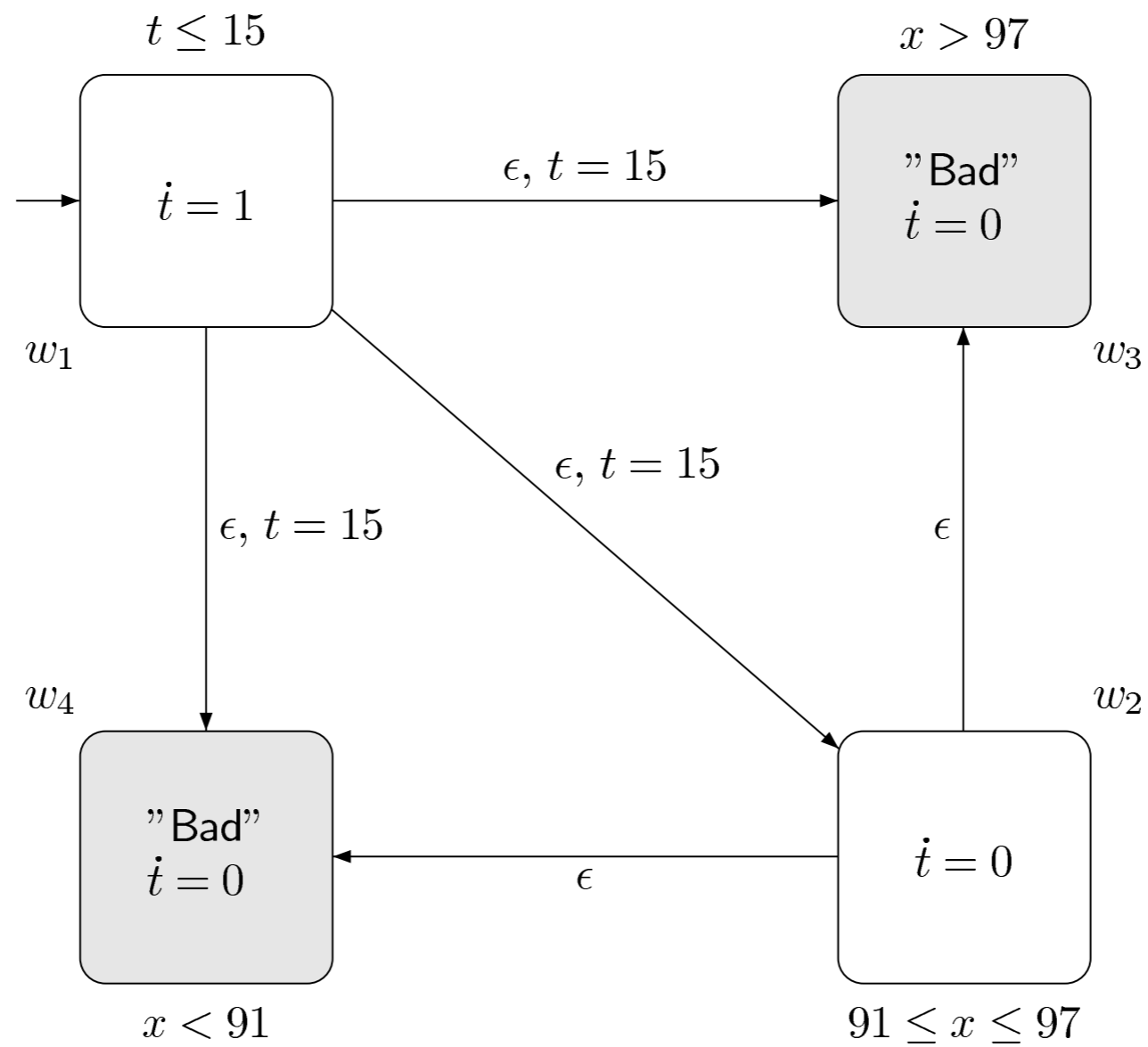
The system is **correct** if we avoid the region **Bad** i.e., **Bad** is **unreachable**.

- Requirements  $R_2$  and  $R_3$  can **not** be formalized directly using regions.

Instead, we will use **monitors**.

- A **monitor** (also called observer) is an HA that watches the trajectory of the system and enters “Bad” locations whenever the observed behavior **violates** the **safety condition**.

# Monitor for requirement $R_2$



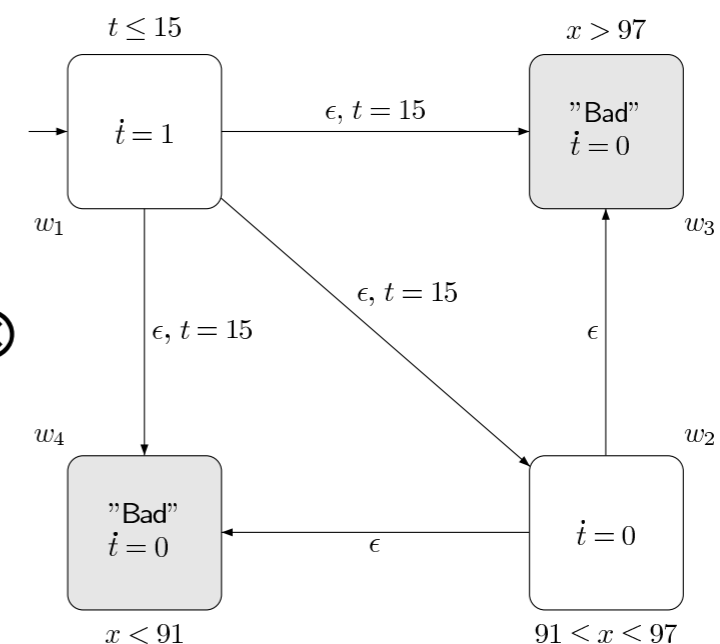
# From safety to monitors and reachability

- To verify  $R_2$  on our system, we consider the **product** of the **monitor** with the system i.e.,

$\text{Tank} \otimes \text{Burner} \otimes \text{Thermo} \otimes \text{Controller} \otimes \text{Moni}_2$

- Then we check for the **reachability** of the region that contains the states in which  $\text{Moni}_2$  is in location  $w_3$  or  $w_4$  (the locations labelled with “Bad”).

$\text{Tank} \otimes \text{Burner} \otimes \text{Thermo} \otimes \text{Controller} \otimes$



# How do we solve reachability problems ?

- Direct successor operator  $\text{Post}^T: 2^S \rightarrow 2^S$ :

$\text{Post}^T(S')$

$$= \{ s \in S \mid \exists s' \in S' \cdot (\exists \sigma \in \Sigma: (s', \sigma, s) \in \rightarrow) \vee (\exists \delta \in \mathbb{R}^{\geq 0}: (s', \delta, s) \in \rightarrow) \}$$

- Direct predecessor operator  $\text{Pre}^T: 2^S \rightarrow 2^S$ :

$\text{Pre}^T(S')$

$$= \{ s \in S \mid \exists s' \in S' \cdot (\exists \sigma \in \Sigma: (s, \sigma, s') \in \rightarrow) \vee (\exists \delta \in \mathbb{R}^{\geq 0}: (s, \delta, s') \in \rightarrow) \}$$

# How do we solve reachability problems ?

---

- The set of **reachable states** of a HA  $H$  with TTS  $\llbracket H \rrbracket$  is defined by the **least solution** of the following equation:

$$X = ( S_0 \cup \text{Post}^{\llbracket H \rrbracket}(X) )$$

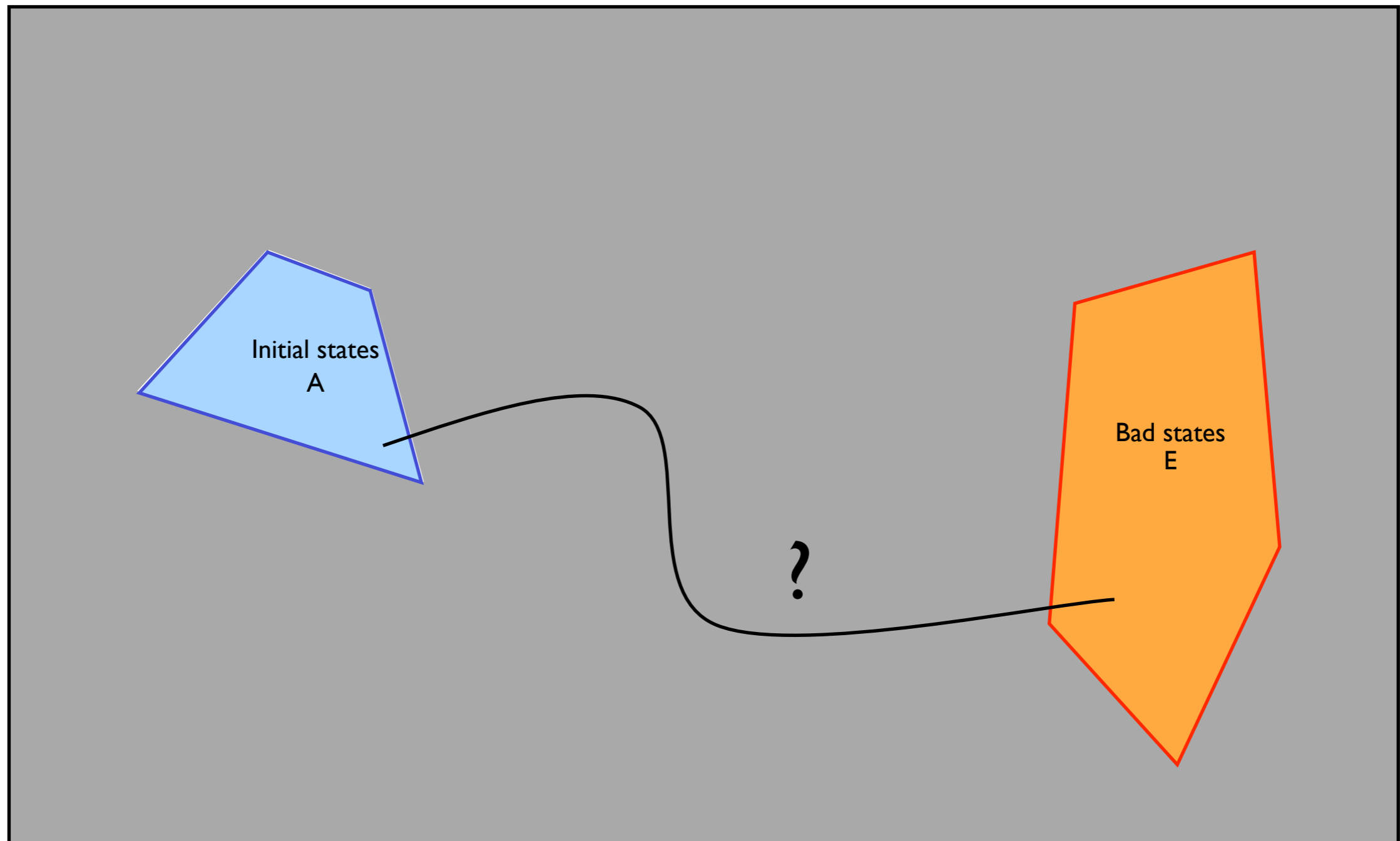
where  $X$  ranges over sets of states.

- Symmetrically, the set of states **that can reach  $R$**  is defined by the **least solution** of the following equation:

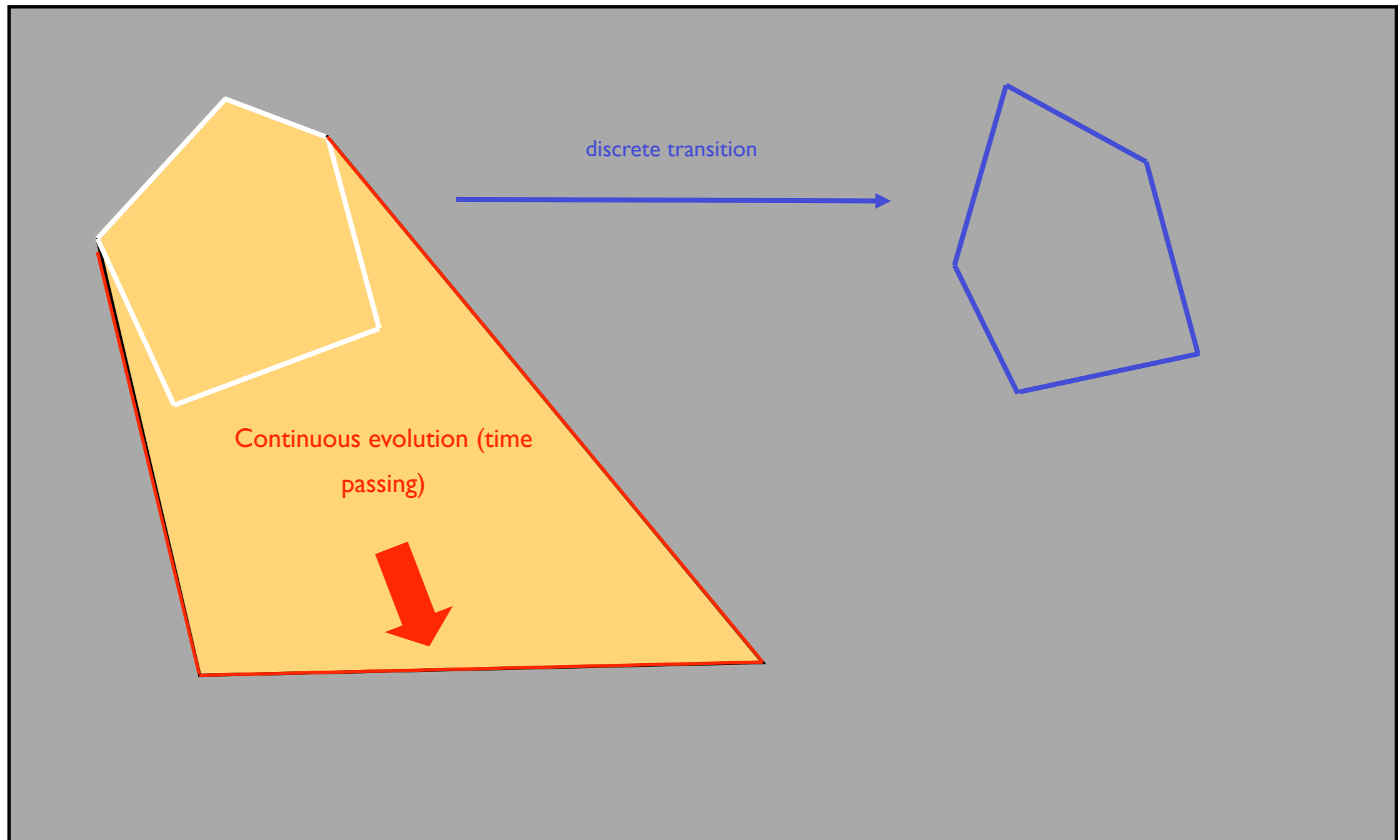
$$X = ( R \cup \text{Pre}^{\llbracket H \rrbracket}(X) )$$



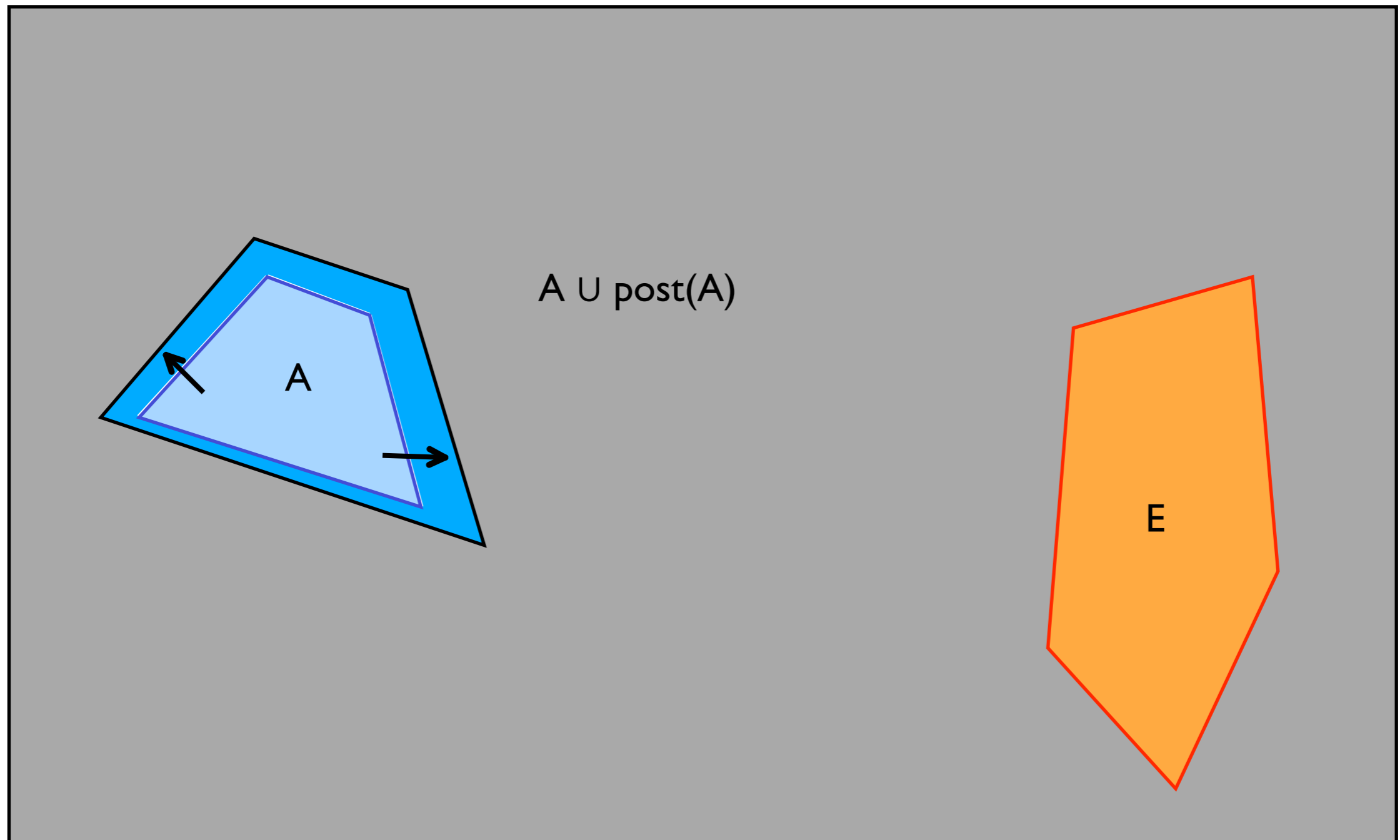
# The reachability problem



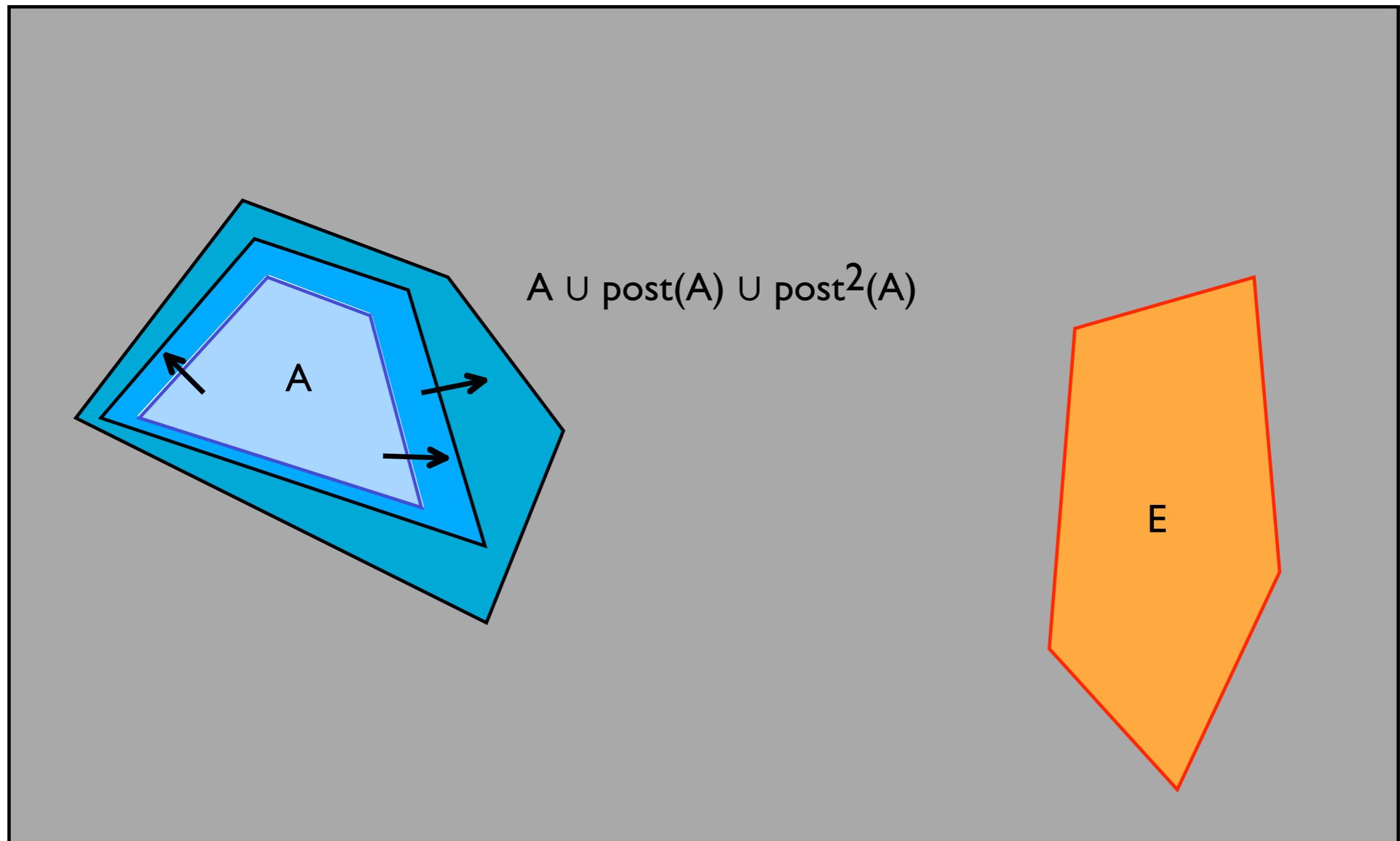
# Post operator



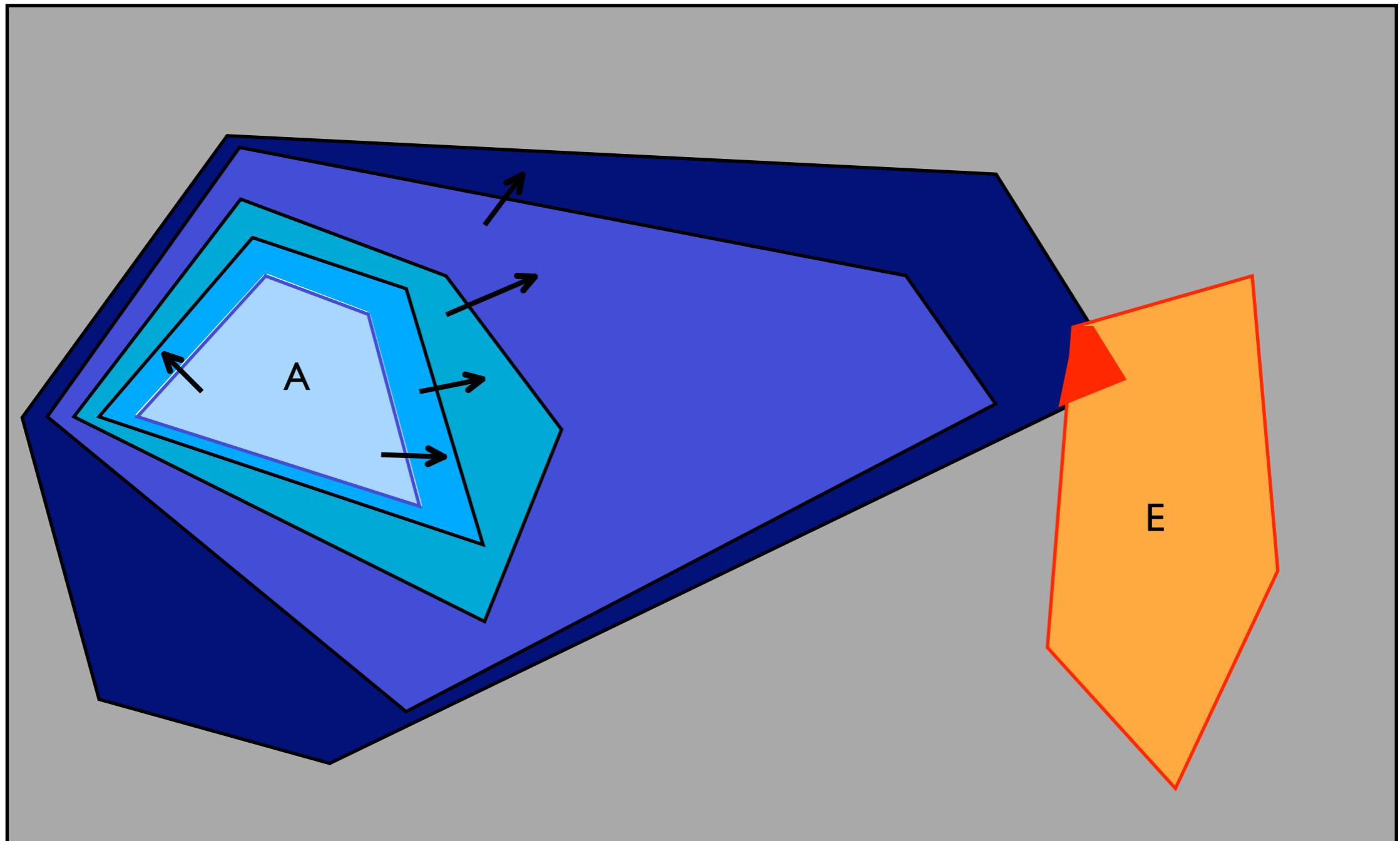
# Iteration of the Post operator



# Iteration of the Post operator



# Iteration of the Post operator



# Undecidability - Non representability

---

- Computing solutions of the fixed point equations (forward or the backward approach) is often **difficult**.

**Convergence** in a finite number of **approximation steps** is not guaranteed ...

- ... furthermore, even one step of computation may **not** be feasible, as we can **not** solve general **differential equations/inclusions** ...
- ... there are also representability issues: how to represent the set of successors of a region ? This set may not have a symbolic representation.
- Furthermore, even very restricted subclasses of hybrid automata have an **undecidable** reachability problem.

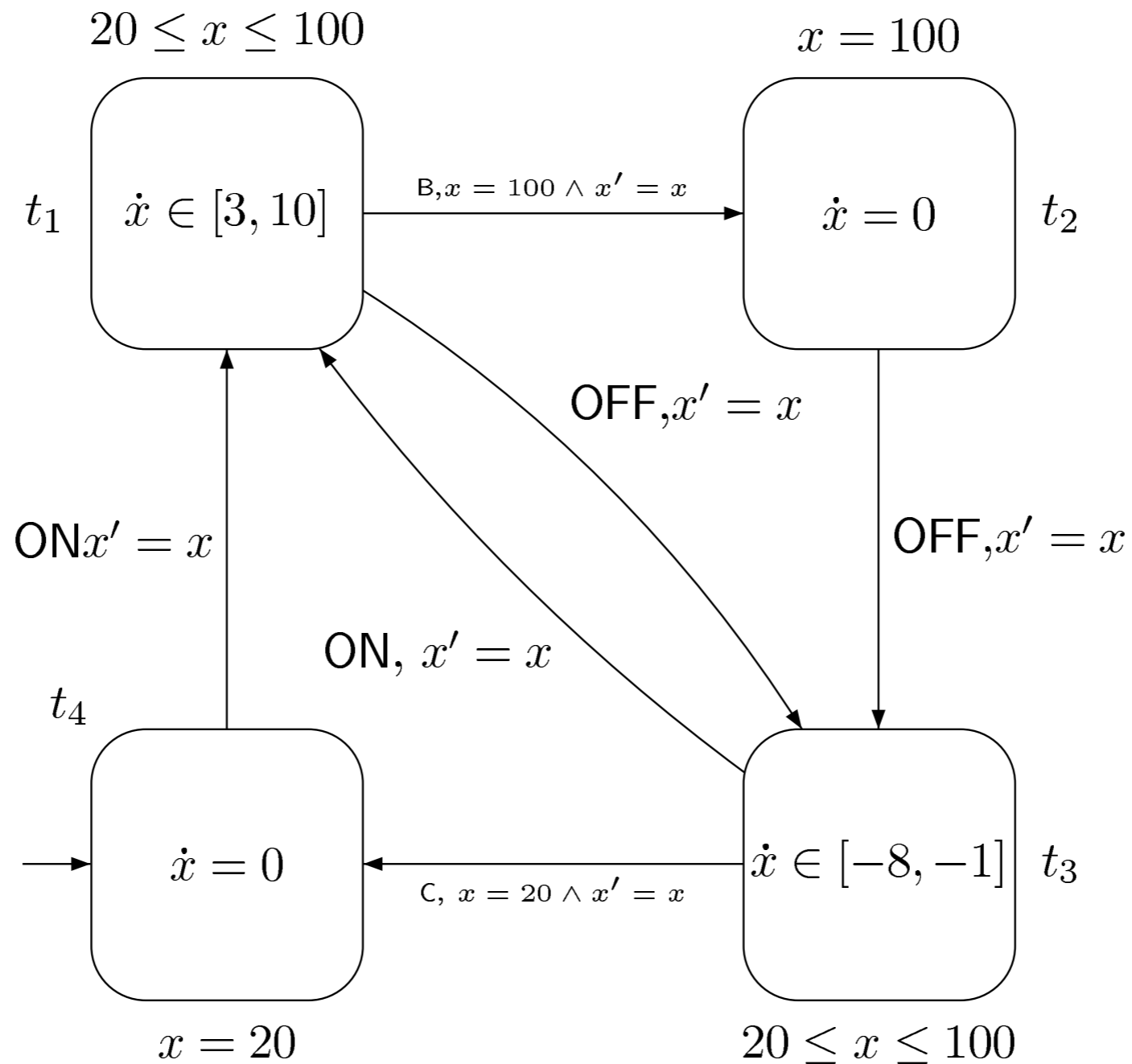
# Rectangular hybrid automata

# Rectangular Hybrid Automata

- **Rectangular automata** are a subclass of hybrid automata where dynamics are constrained by rectangular constraints and updates are restricted by rectangular updates;
- A **interval** is a convex non-empty subset of the positive real-numbers with rational bounds;
- $\text{Rect}(X) \ni \Phi_1, \Phi_2 := \perp \mid \top \mid x \in I \mid \Phi_1 \wedge \Phi_2$
- $\text{UpdateRect}(X) \ni \Phi_1, \Phi_2$   
 $:= \perp \mid \top \mid x \in I \mid x' \in I \mid x' = x \mid \Phi_1 \wedge \Phi_2$
- A rectangular HA is an HA where  $\text{Init}(\cdot)$  and  $\text{Inv}(\cdot)$  are constraints in  $\text{Rect}(X)$ ,  $\text{Jump}(\cdot)$  in  $\text{UpdateRect}(X)$ , and  $\text{Flow}(\cdot)$  in  $\text{Rect}(X')$ .



# Example of a rectangular automaton



# Semi-algorithms for rectangular hybrid automata

# Effective procedure for Post in RHA

---

- A **linear term** over  $X$  is a linear combination of the variables in  $X$  with integer coefficients.

ex :  $3x+2y-1$ .

- A **linear formula** over  $X$  is a boolean combination of inequalities between linear terms over  $X$ .

ex :  $3x+2y-1 \geq 0 \wedge y \geq 5$ .

- Given a **linear formula**  $\psi$ , we write  $\llbracket \psi \rrbracket$  for the set of valuations  $v$  such that  $v \models \psi$ .

# Effective procedure for Post in RHA

---

- If we allow quantifiers with linear formulas we obtain the **theory of reals** with addition  $T(\mathbb{R}, 0, 1, +, \leq)$ .

This theory allows for **quantifier elimination**.

ex : “ $\forall y \cdot y \geq 5 \rightarrow x+y \geq 7$ ” is equivalent to “ $x \geq 2$ ”.

- A **symbolic region** of  $H$  is a finite set

$$\{ (I, \psi_I) \mid I \in \text{Loc} \} \text{ where } \llbracket \psi_I \rrbracket \subseteq \llbracket \text{Inv}(I) \rrbracket.$$

# Effective procedure for Post in RHA

Given a location  $l \in \text{Loc}$  and a set of valuations  $V \subseteq [X \rightarrow \mathbb{R}]$  such that  $V \subseteq \text{Inv}(l)$ , the **forward time closure**, noted  $\langle V \rangle_l^\nearrow$  is the set of valuations of variables in  $X$  that are reachable from some valuation  $v \in V$  by **letting time pass**.

This set is defined as follows:

$\langle V \rangle_l^\nearrow$  is the set of valuation  $v' \in [X \rightarrow \mathbb{R}]$  such that

$$\exists v \in V \cdot \exists t \in \mathbb{R} \geq 0 \cdot \forall x \in X \cdot$$

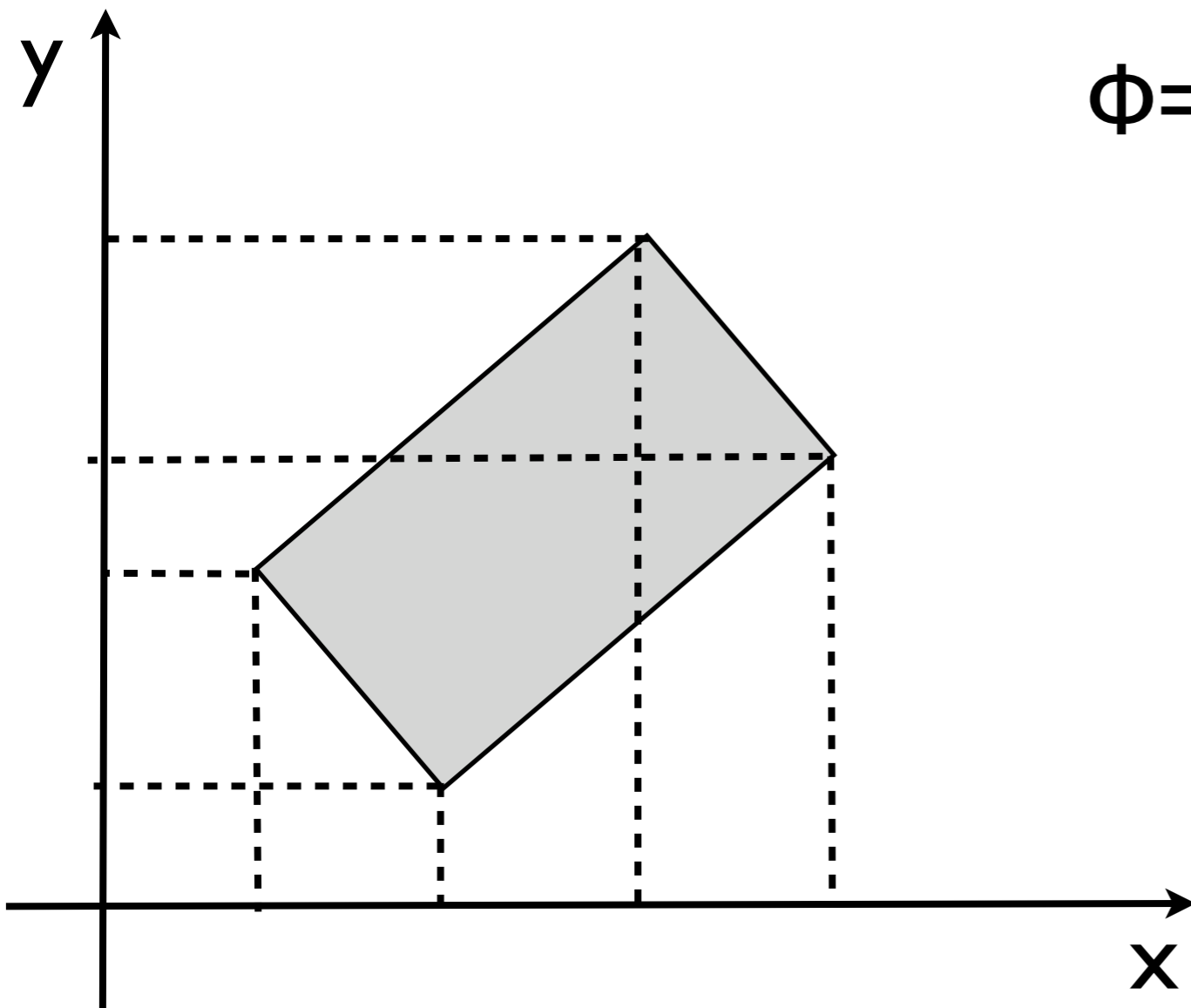
$$v(x) + t \times \mathbf{Inf}(\llbracket \text{Flow}(l) \rrbracket(x)) \leq v'(x) \leq v(x) + t \times \mathbf{Sup}(\llbracket \text{Flow}(l) \rrbracket(x))$$

and  $v'(x) \in \llbracket \text{Inv}(l) \rrbracket$ .

As quantifiers can be eliminated, the resulting formula is a boolean combination of linear constraints.

# An example of time elapsing

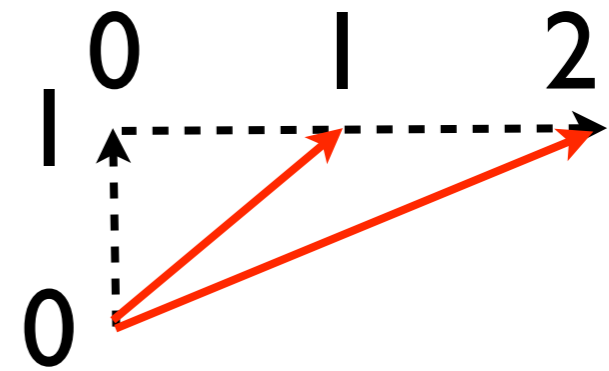
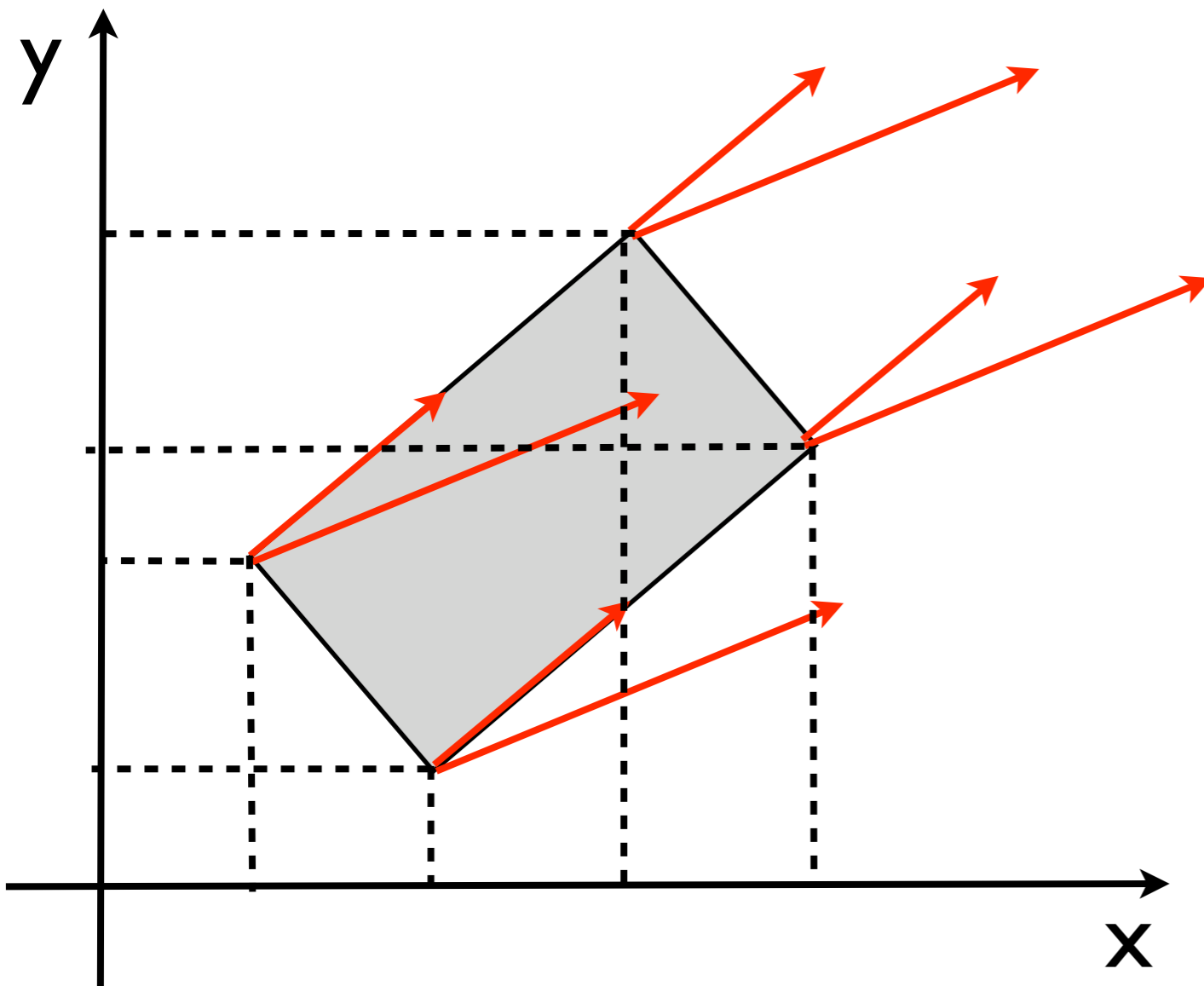
Assume  $x^*=[1,2]$  and  $y^*=1$



$$\Phi = \{ (x,y) \mid \begin{array}{l} x \in [1,4] \\ \wedge y \in [1,6] \\ \wedge y \geq -2x+5 \wedge \dots \end{array} \}$$

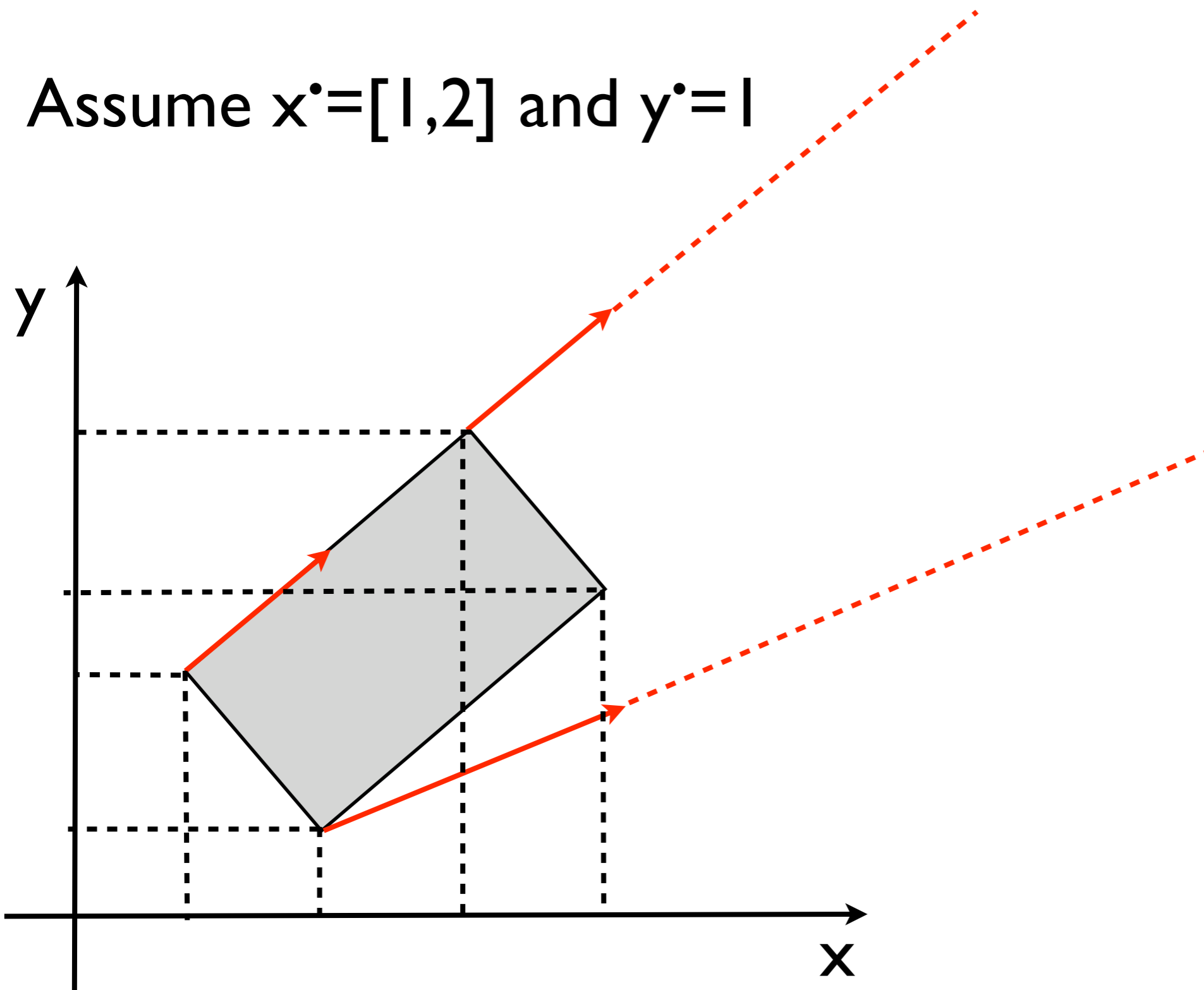
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Assume  $x^*=[1,2]$  and  $y^*=1$



# An example of time elapsing

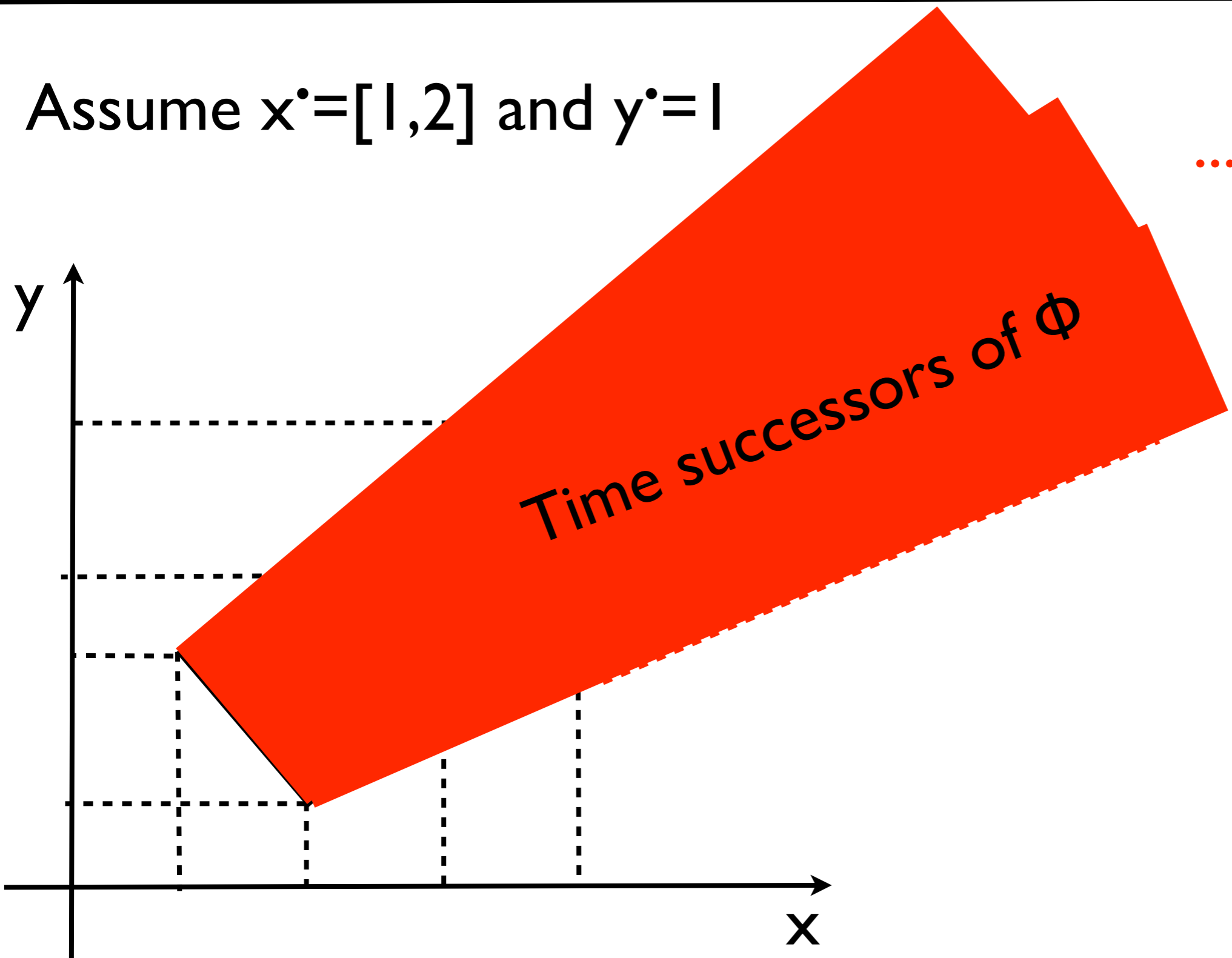
Assume  $x'=[1,2]$  and  $y'=1$





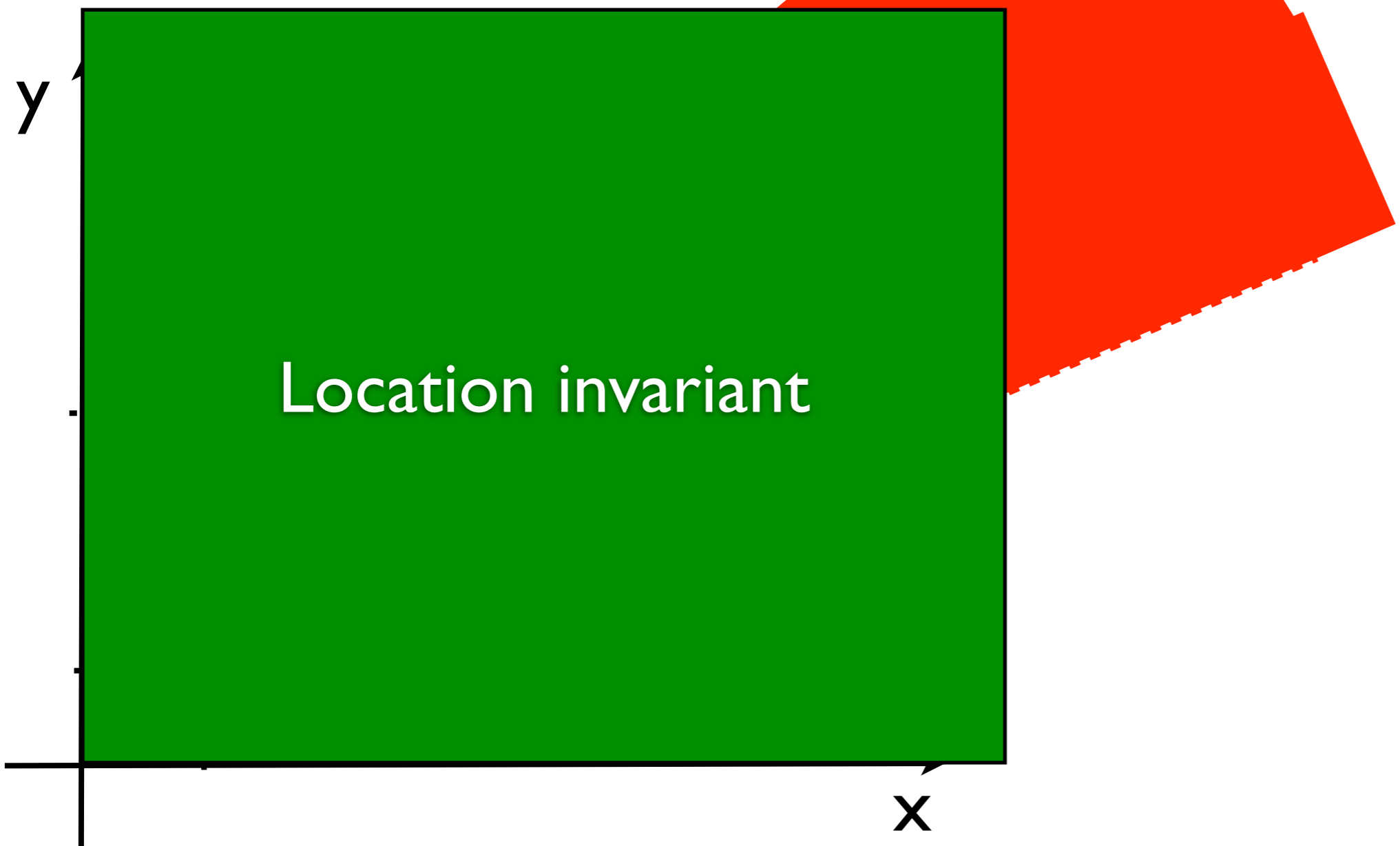
# An example of time elapsing

Assume  $x^*=[1,2]$  and  $y^*=1$



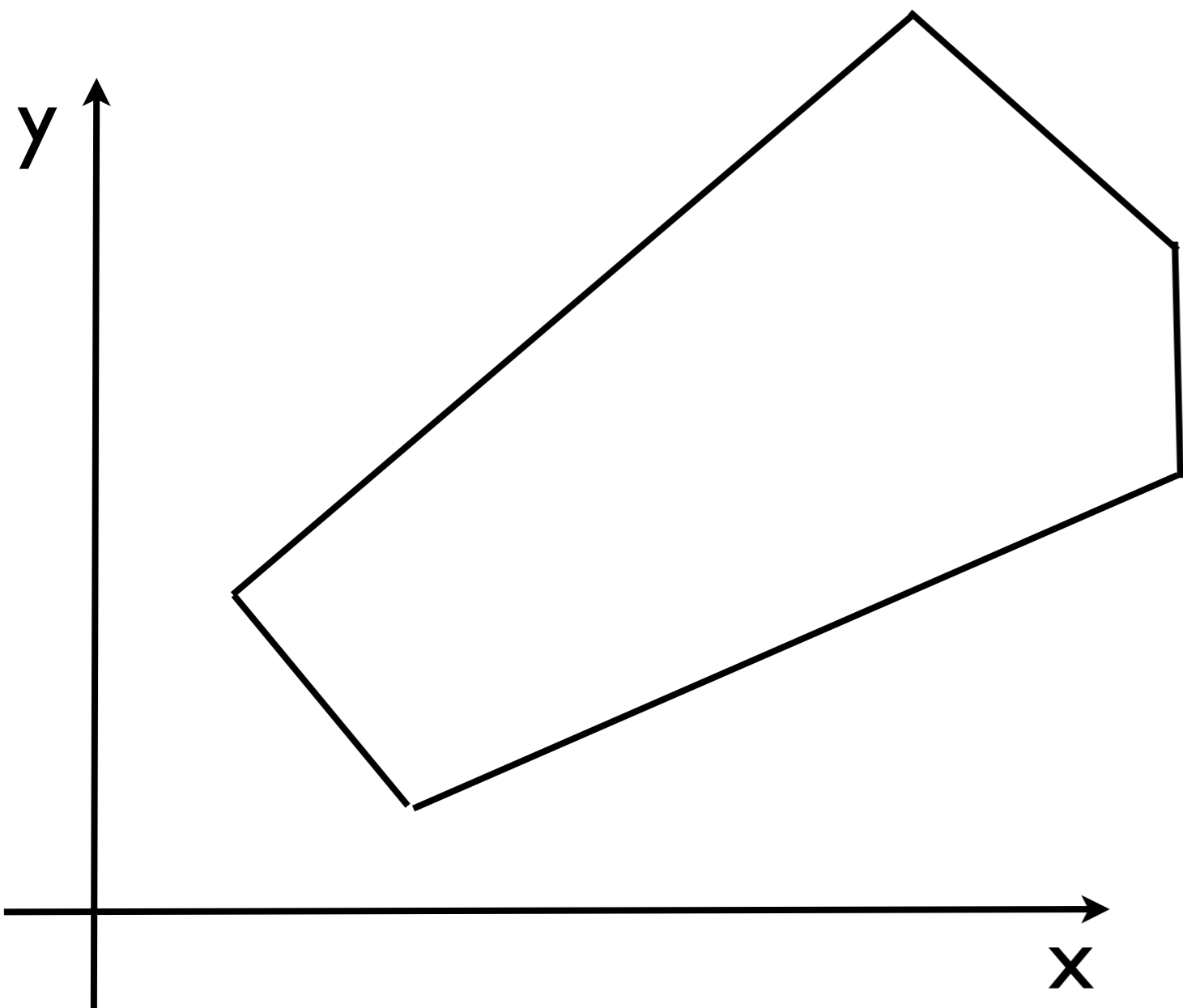
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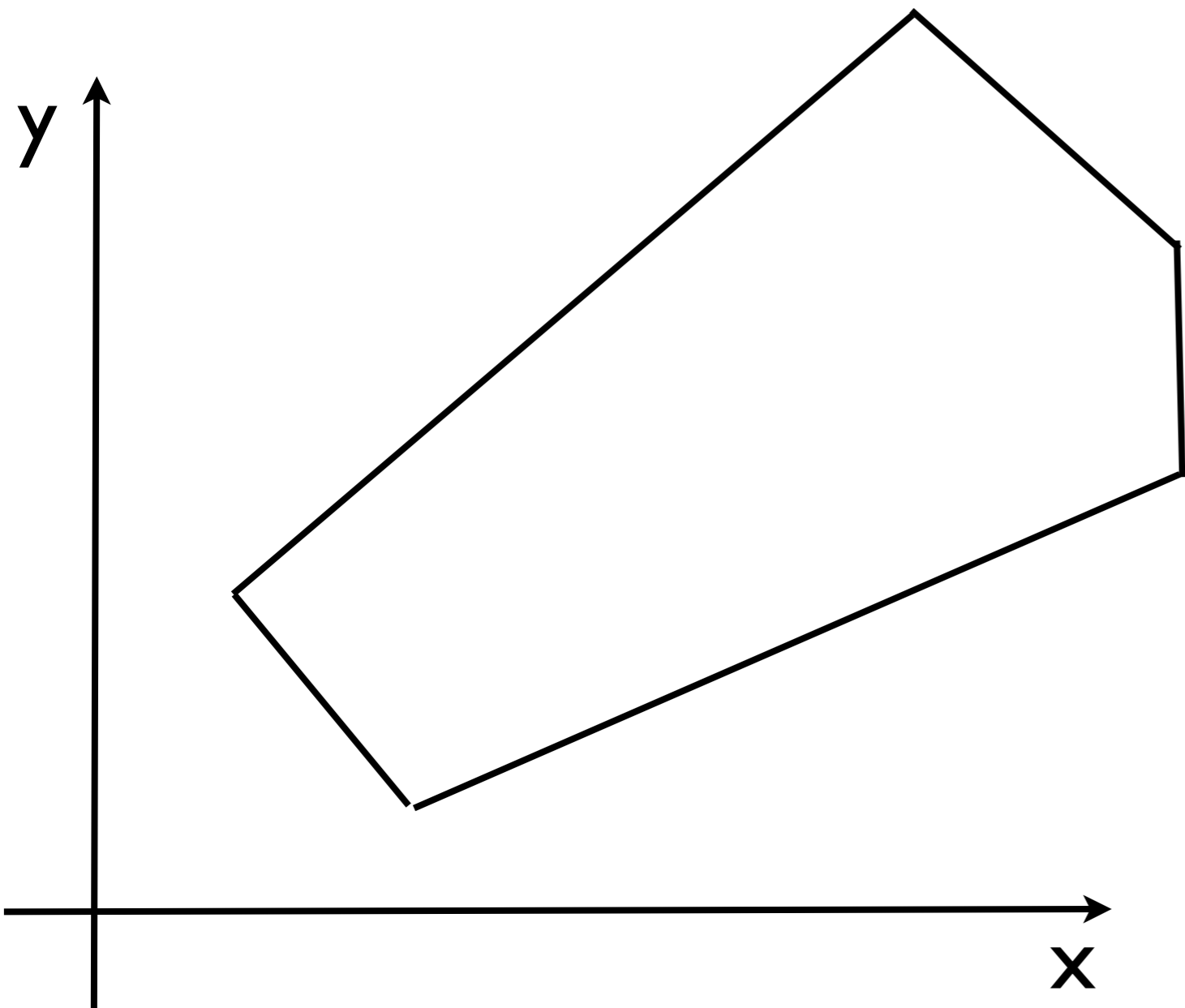


# An example of time elapsing

Assume  $x^*=[1,2]$  and  $y^*=1$

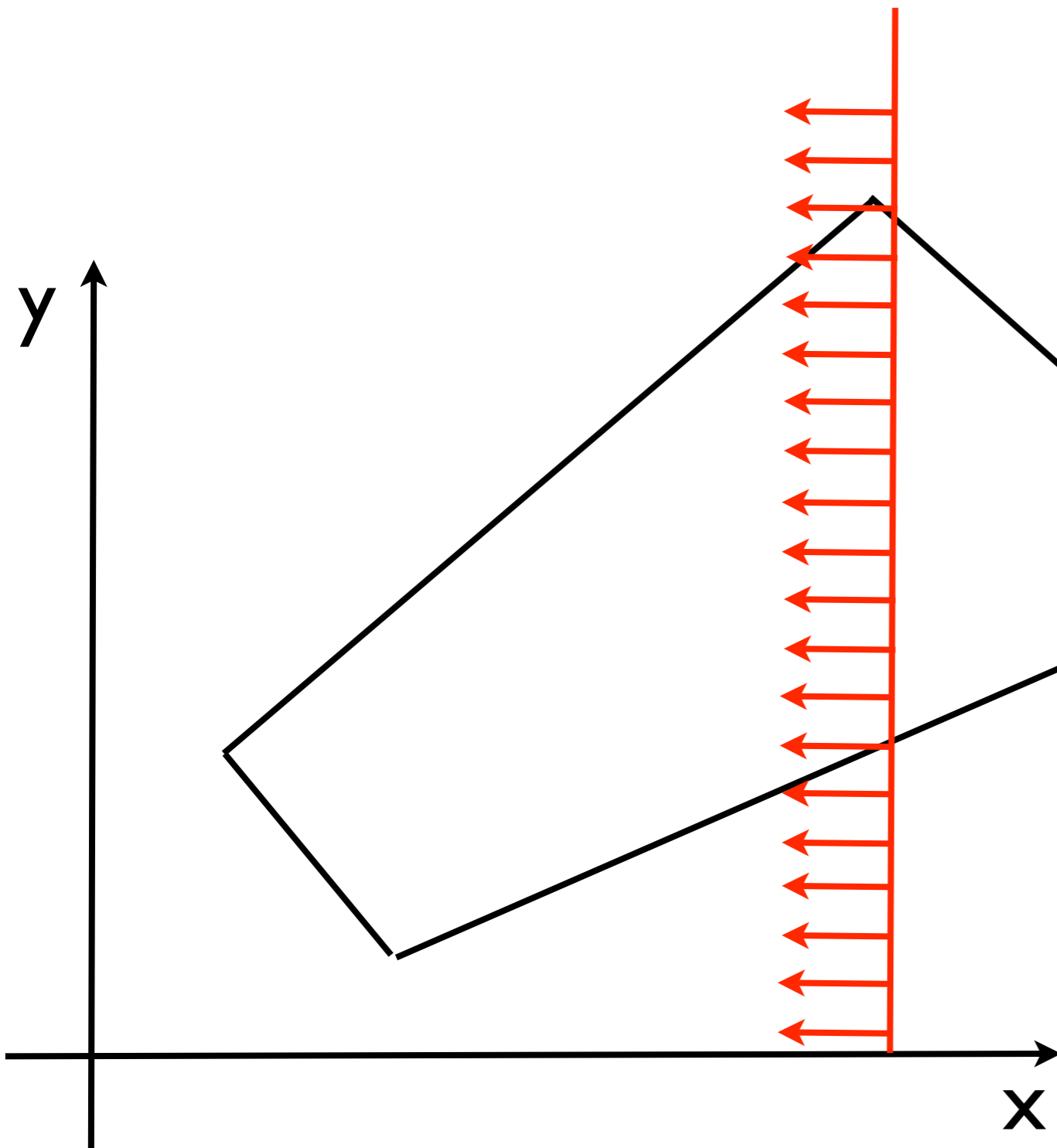


# An example of discrete step



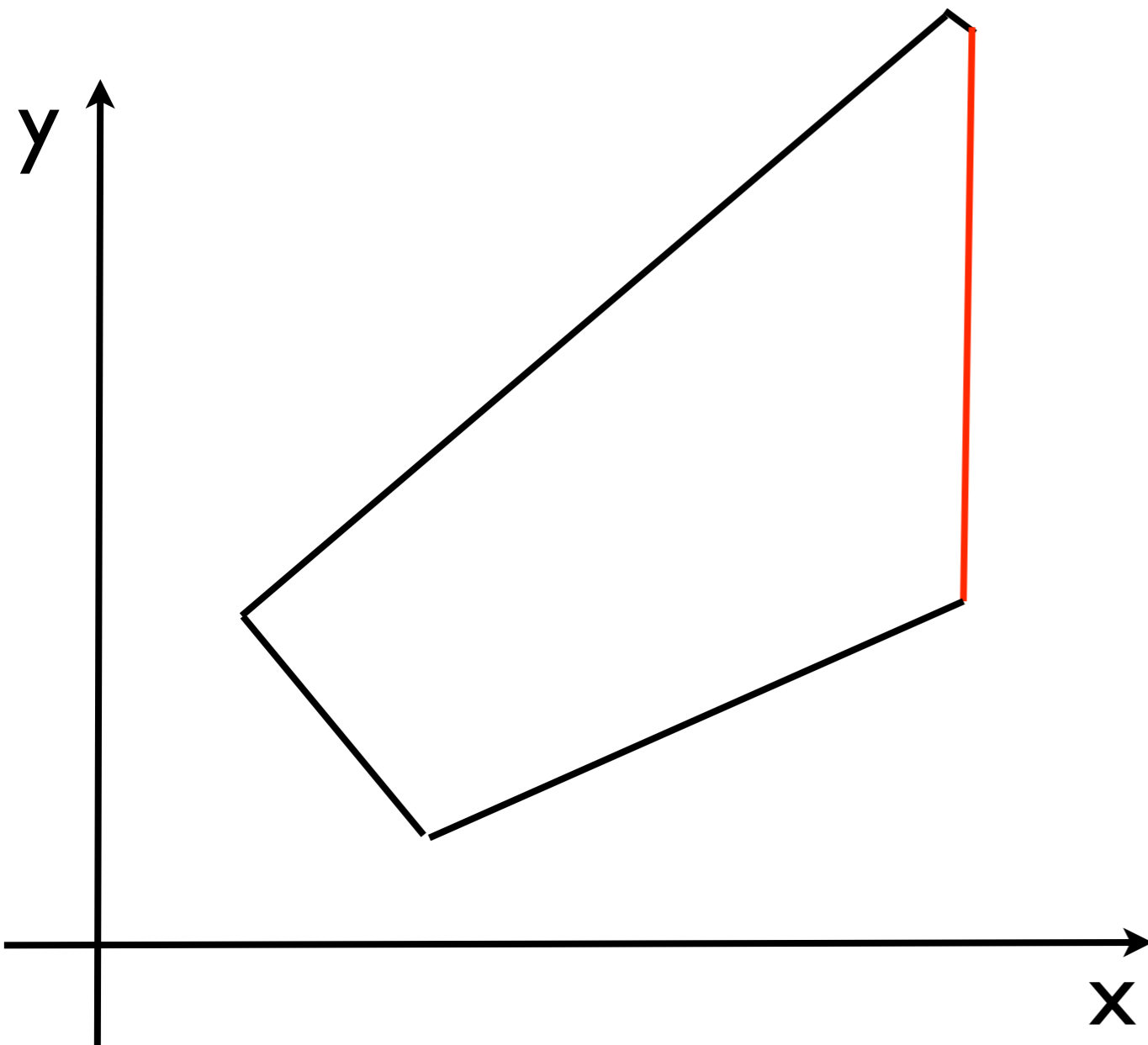
Assume a transition with guard  $x \leq 5$  and reset of  $y$  to zero.

# An example of discrete step



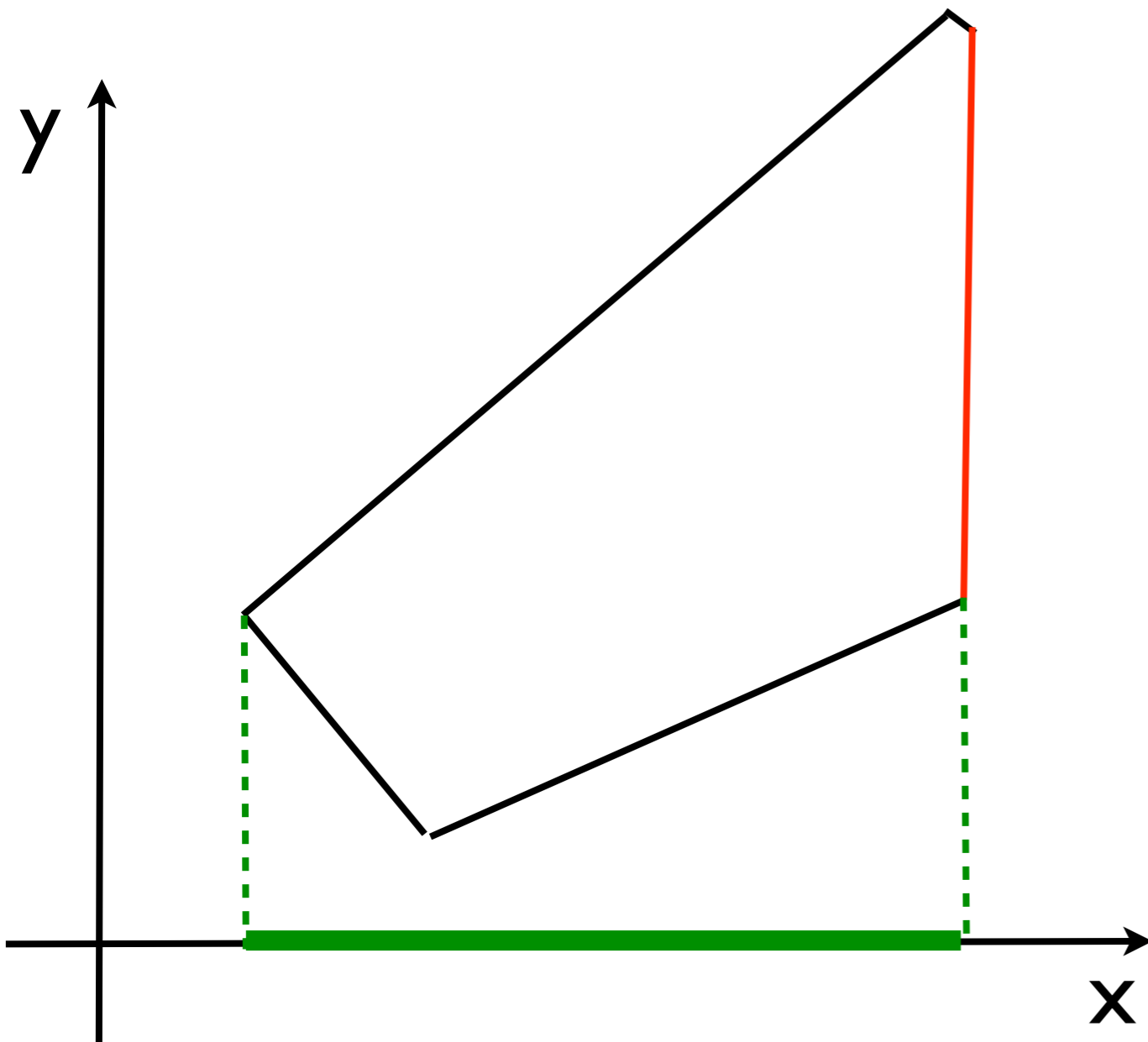
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# An example of discrete step



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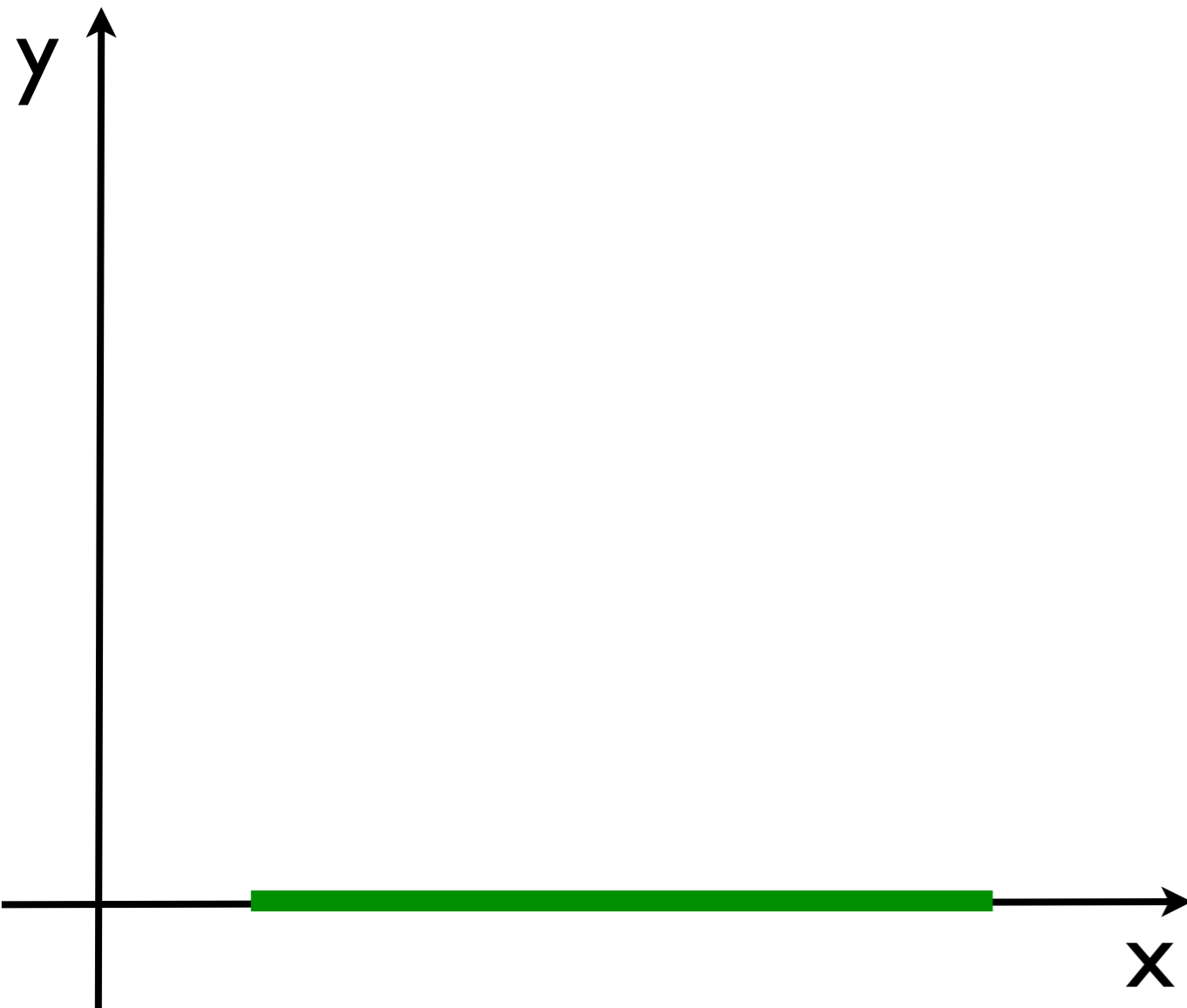
# An example of discrete step



Assume a transition  
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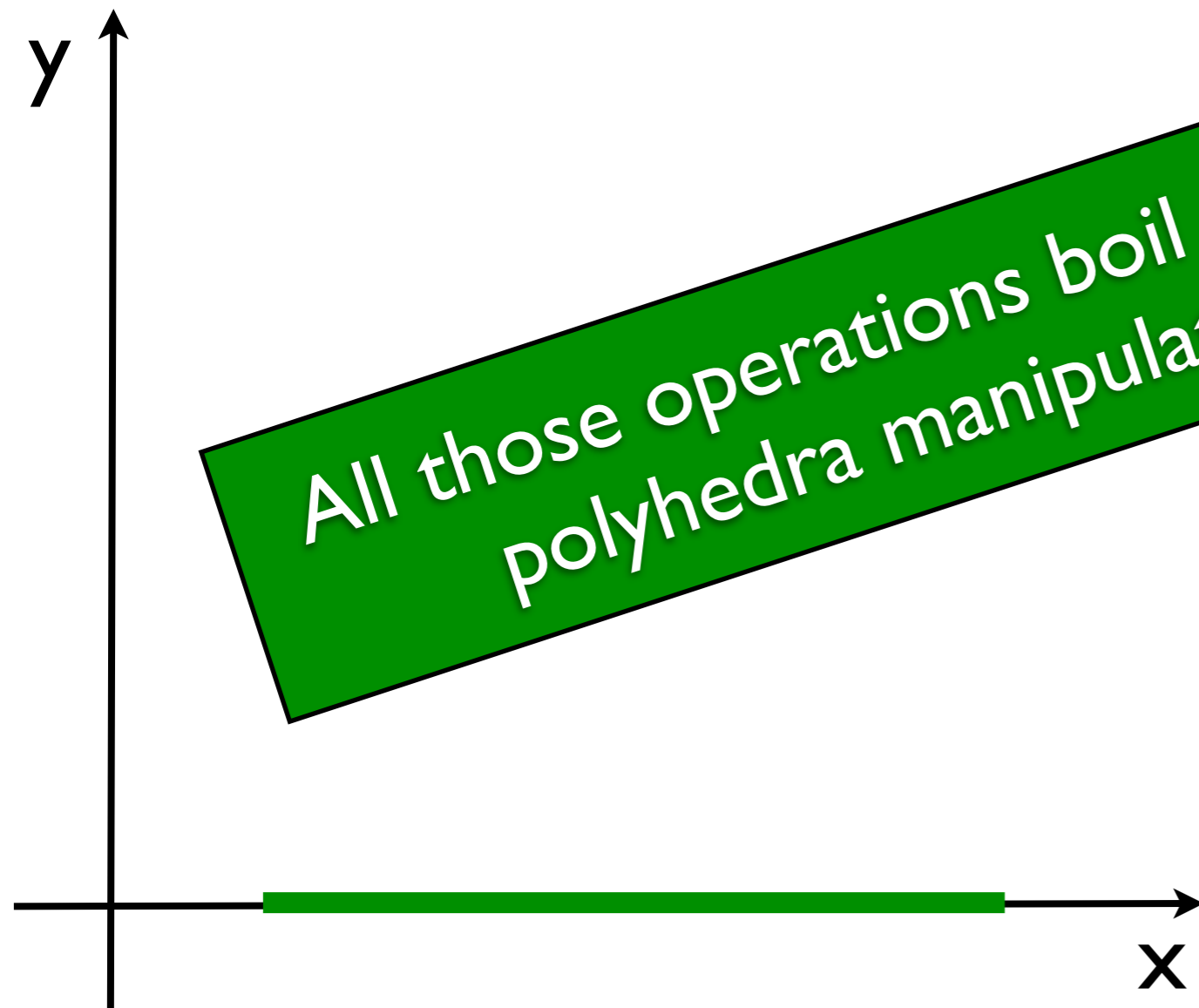
# An example of discrete step

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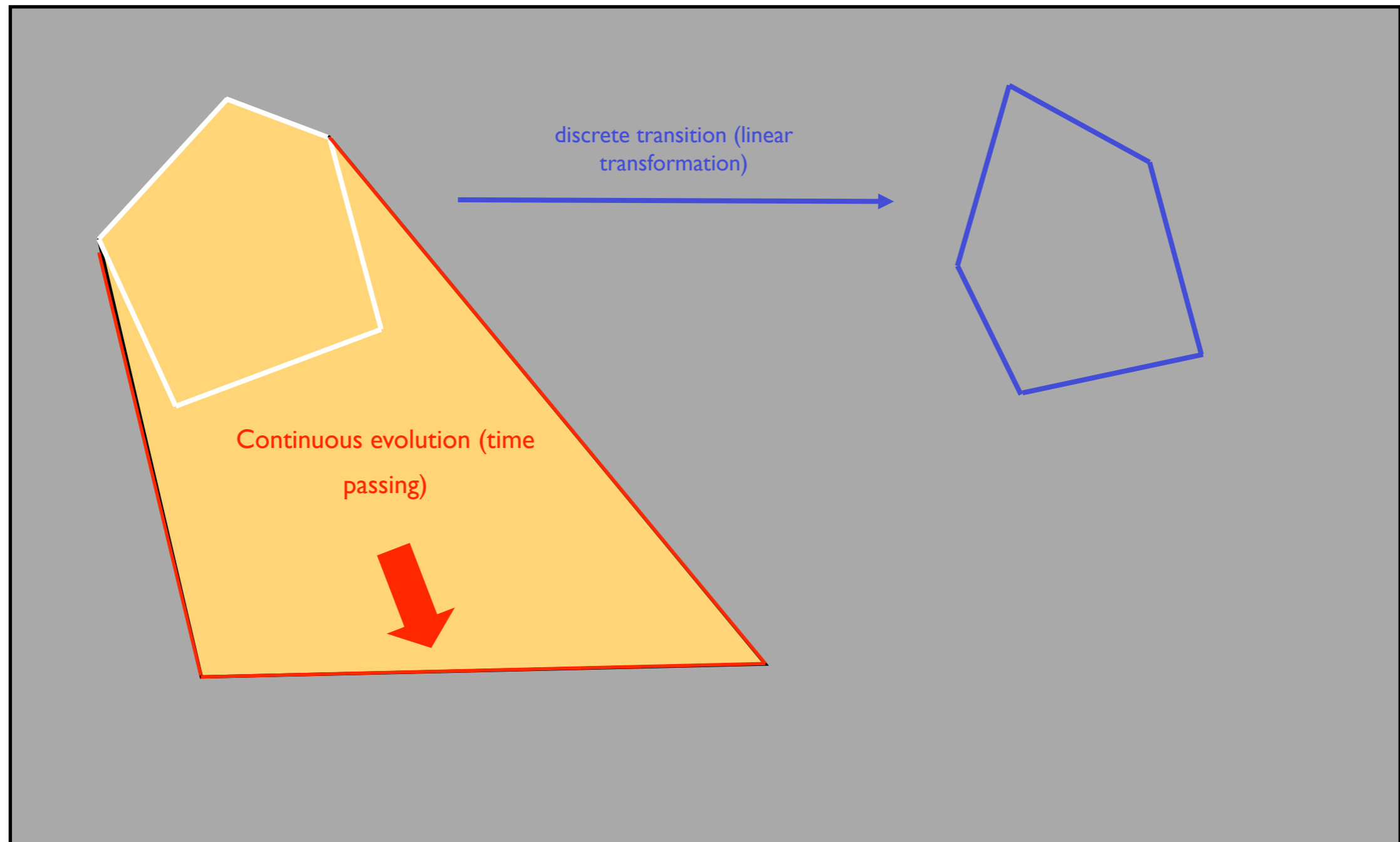


# An example of discrete step

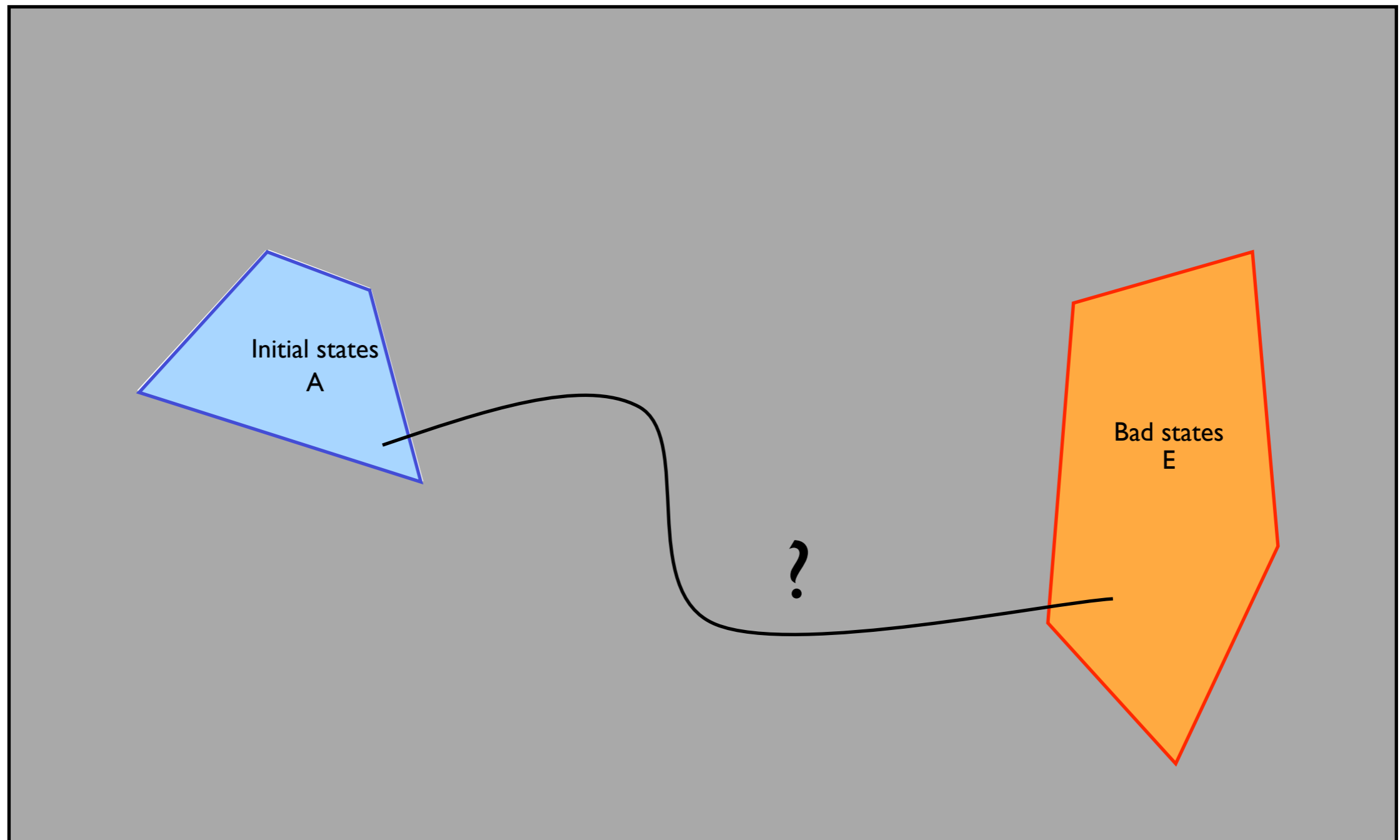


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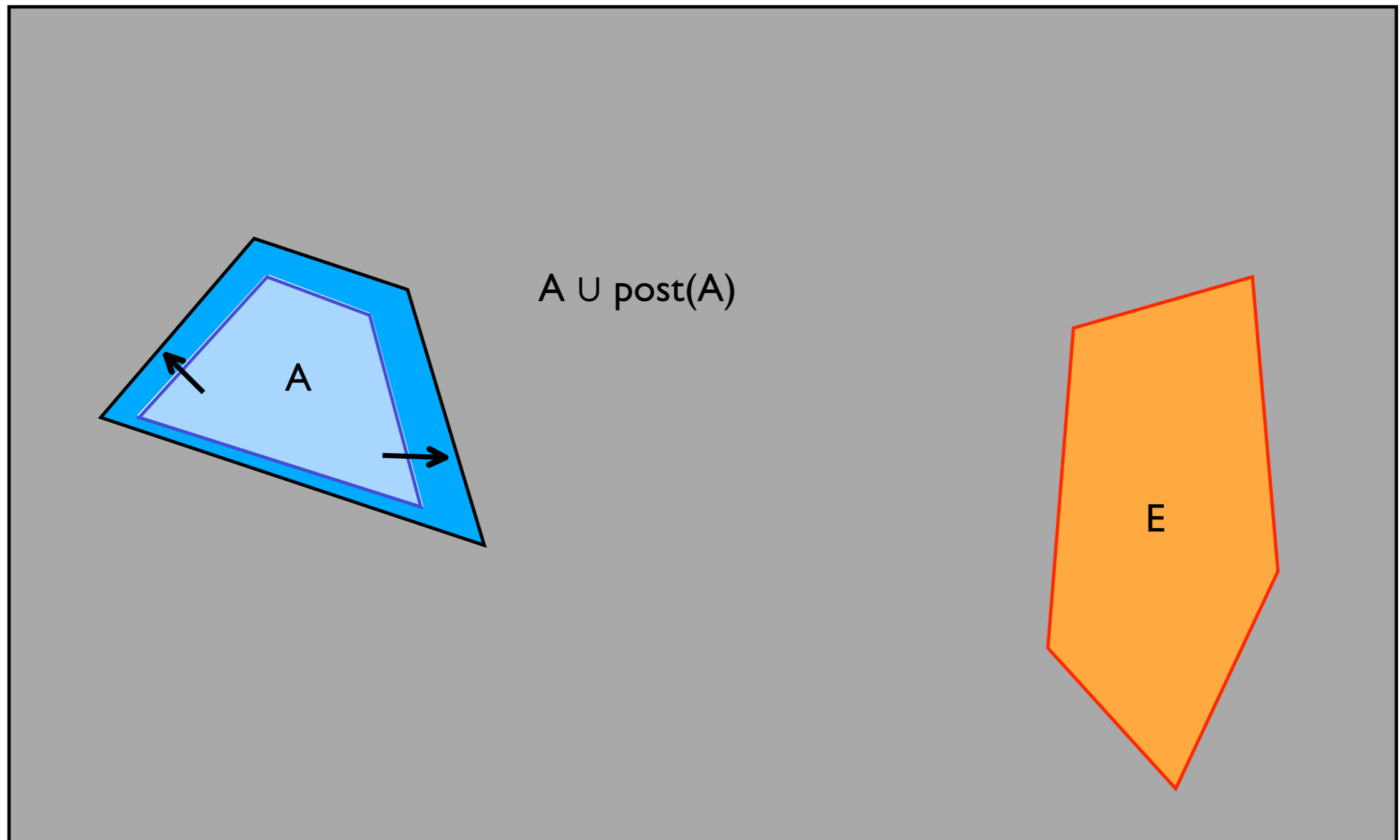
# Forward reachability analysis



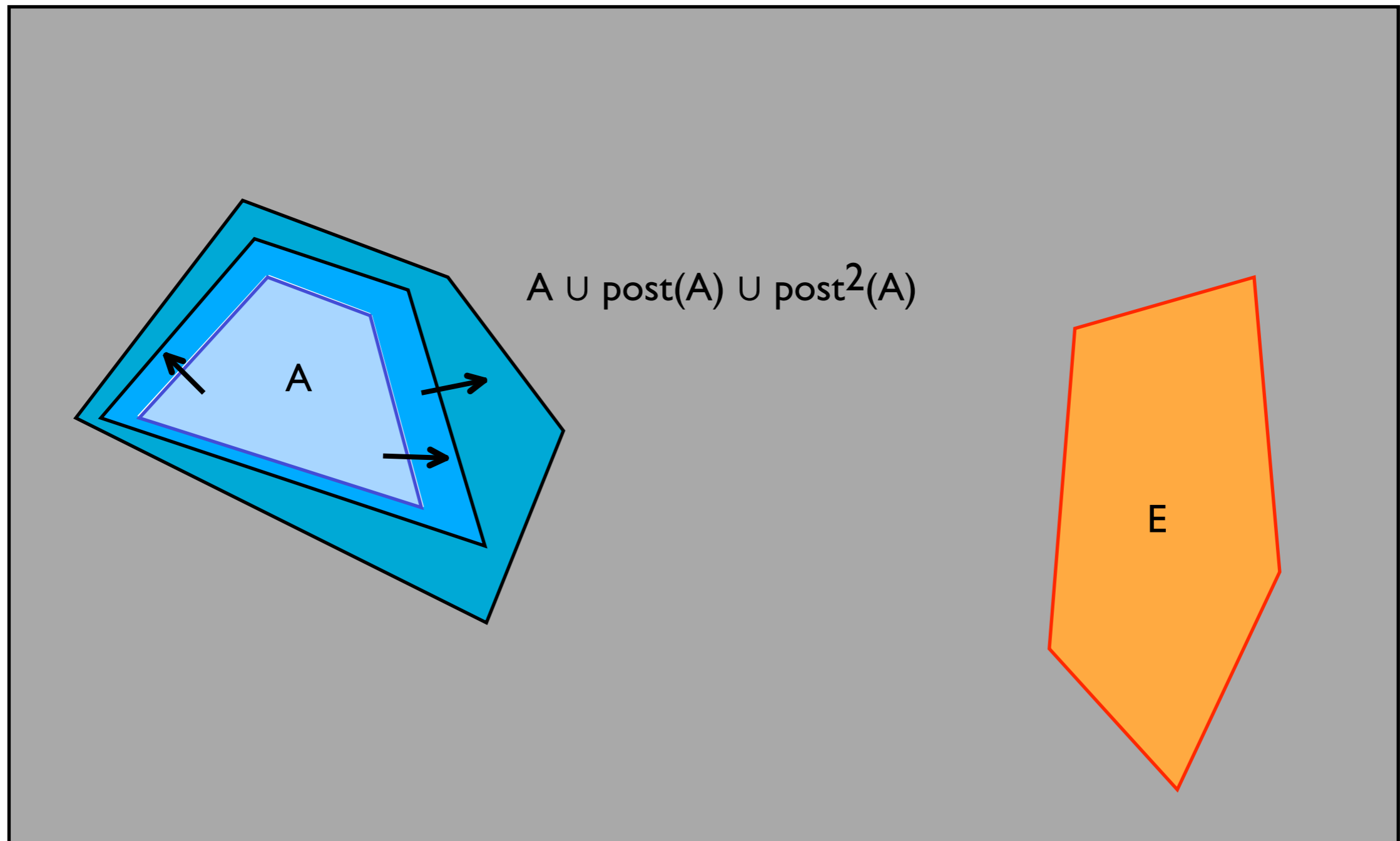
# Forward reachability analysis



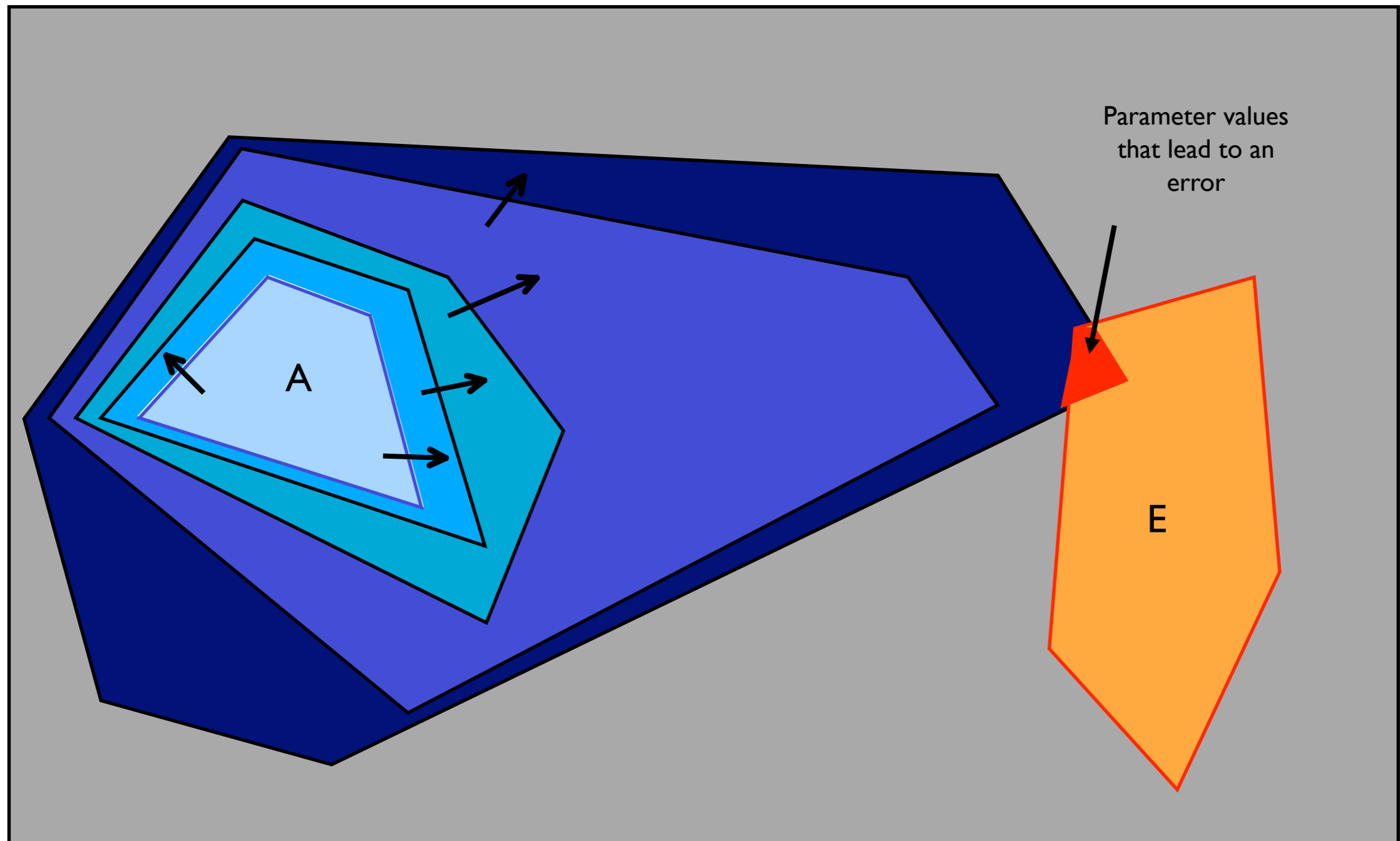
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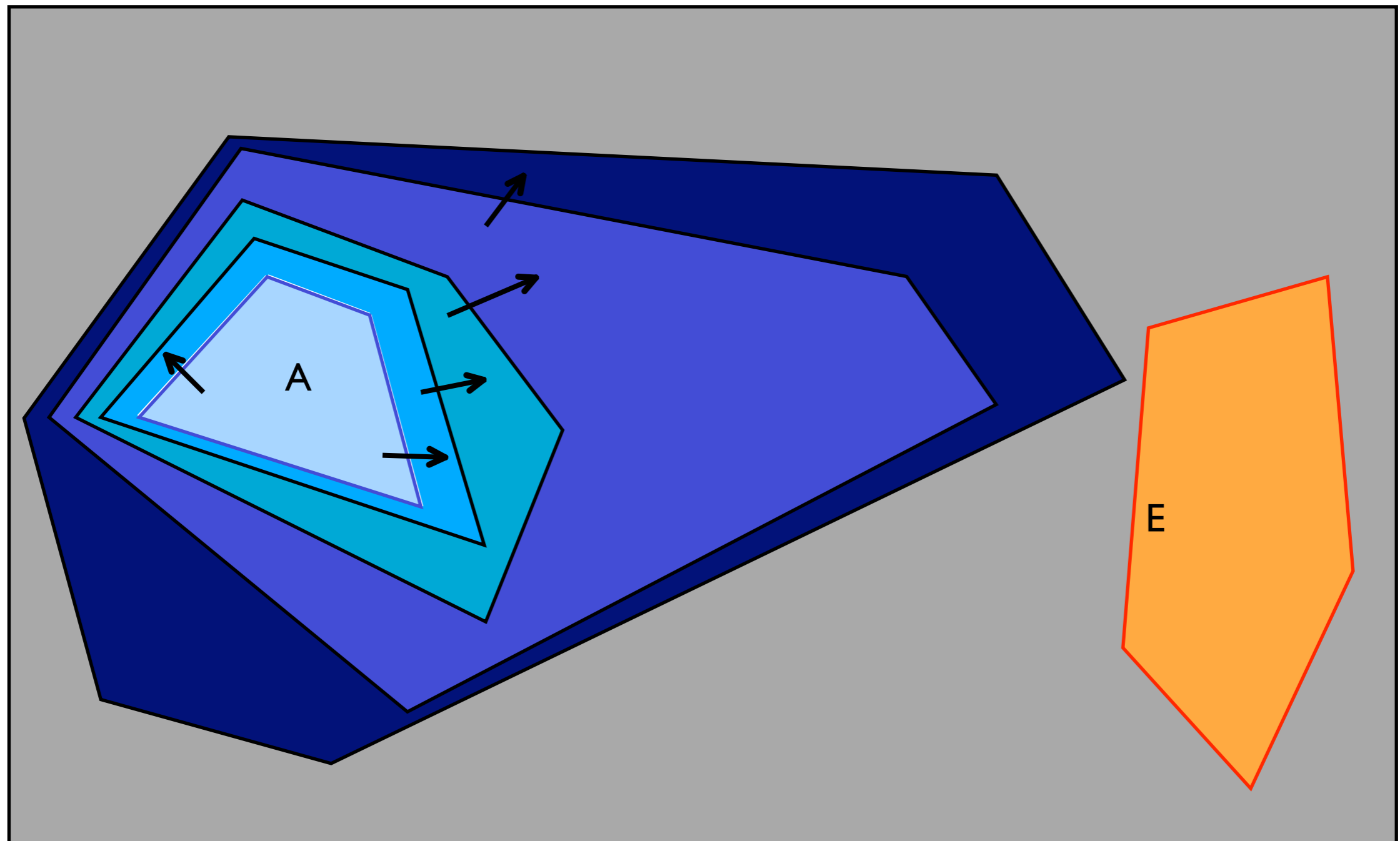
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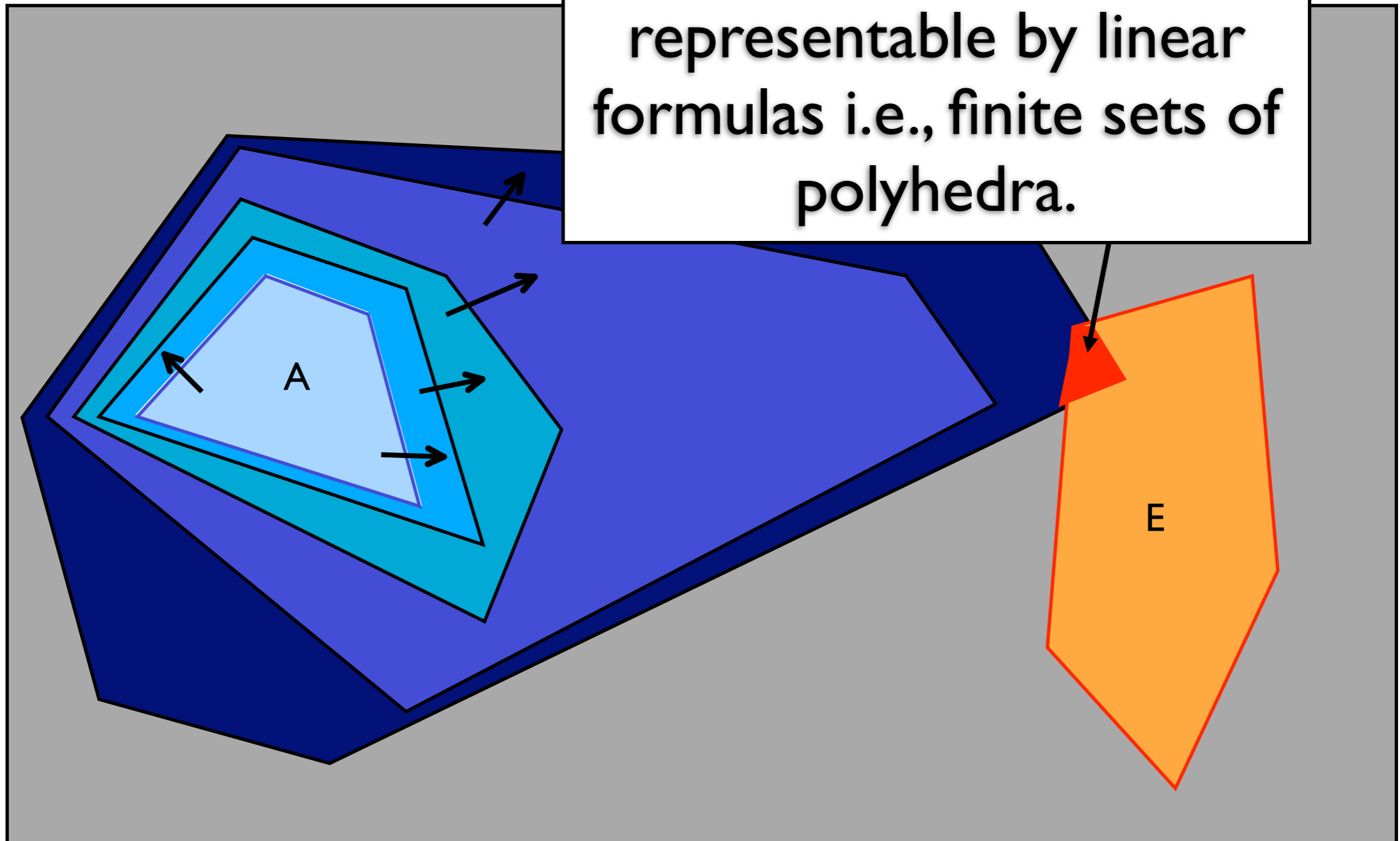


# Forward reachability analysis



# Forward reachability analysis

Here, all sets are representable by linear formulas i.e., finite sets of polyhedra.





# Undecidability

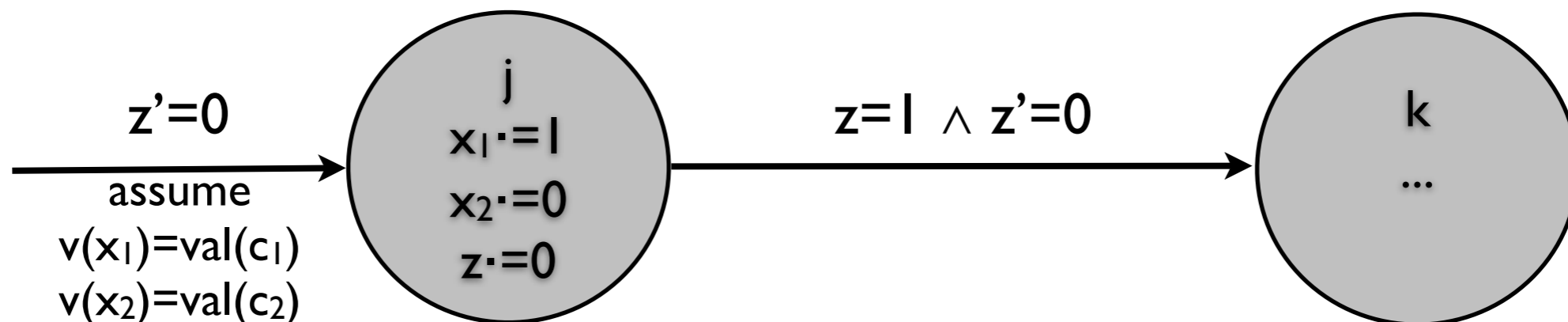
Nevertheless...

**Theorem.** *The reachability problem for rectangular hybrid automata is undecidable.*

*Proof (sketch).* By simulation of two counter machines for which the halting problem is undecidable.

To simulate a 2-CM  $M$ , we use a RHA with 3 continuous variables.

Let us consider the instruction  **$j: c_1 := c_1 + 1; \text{goto } k;$**



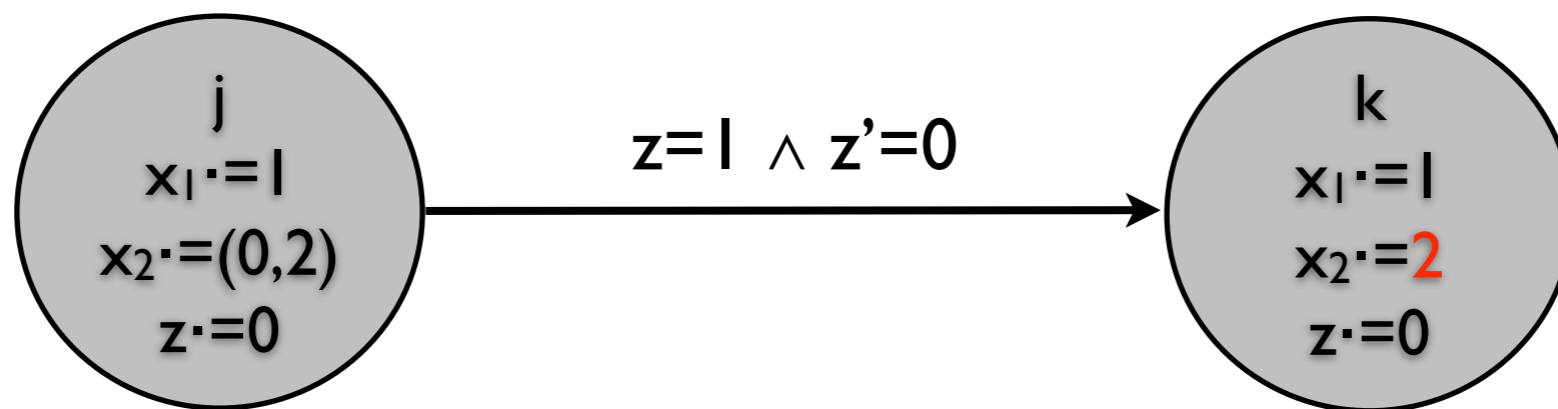
# Initialized RHA

---

- A RHA is **initialized** if for all discrete jumps  $(l_1, \sigma, l_2)$ , for all variables  $x \in X$ :
  - either the flow constraints on  $x$  in  $l_1$  and  $l_2$  are identical
  - or variable  $x$  is updated during the discrete jump from  $l_1$  to  $l_2$ .

# Initialized RHA

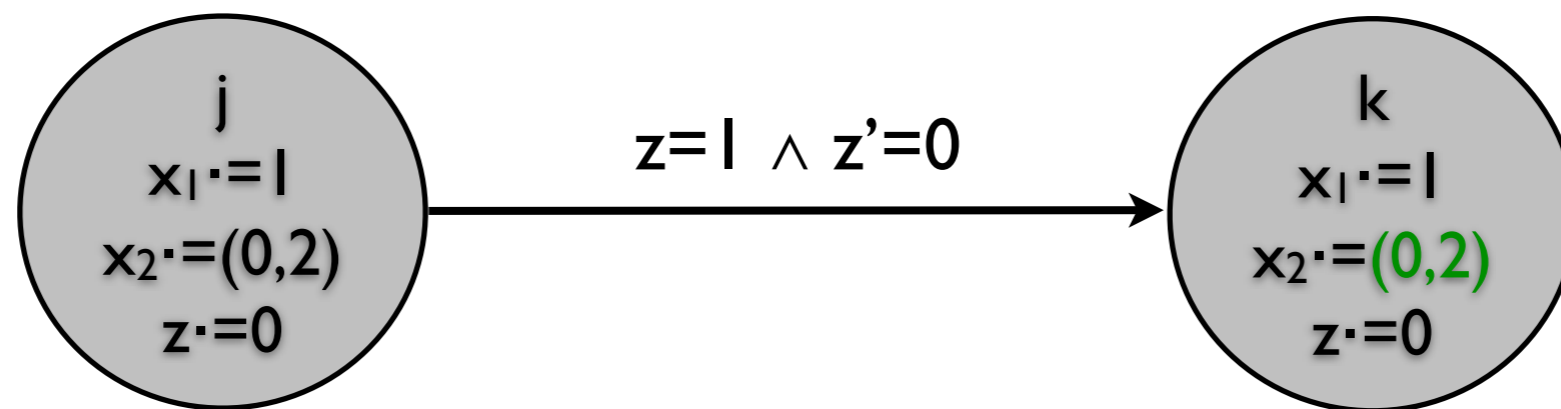
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is **not** initialized

# Initialized RHA

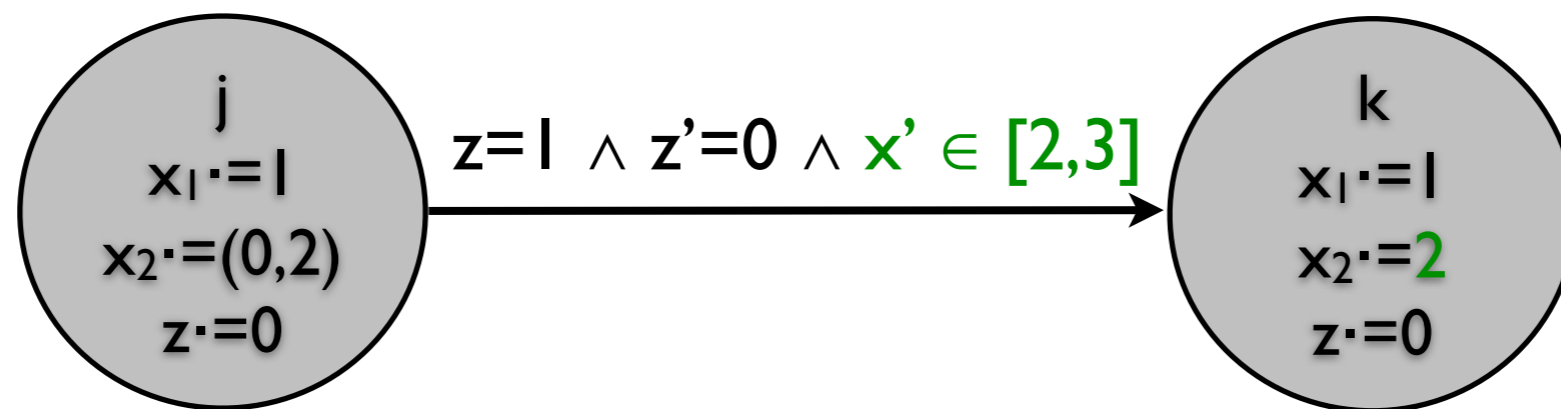
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is initialized

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**is initialized**

# Initialized RHA

---

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  - either the flow constraints on  $x$  in  $l_1$  and  $l_2$  are identical
  - or variable  $x$  is updated during the discrete jump from  $l_1$  to  $l_2$ .

**Theorem.** The reachability problem (and LTL model-checking problem) is **decidable** for the class of **initialized rectangular automata**.

Note that Initialized RHA generalizes timed automata.

# Approximating affine hybrid automata by rectangular hybrid automata

# Rectangular approximations

---

- **Approximate** complex dynamics with **rectangular dynamics** in a systematic way;
- ... this allow us to use **PhaVer** or **Hytech** for example.
- In practice, those approximations are often **precise enough** to infer important properties of the original HA.
- ... this is related to *abstract interpretation*.

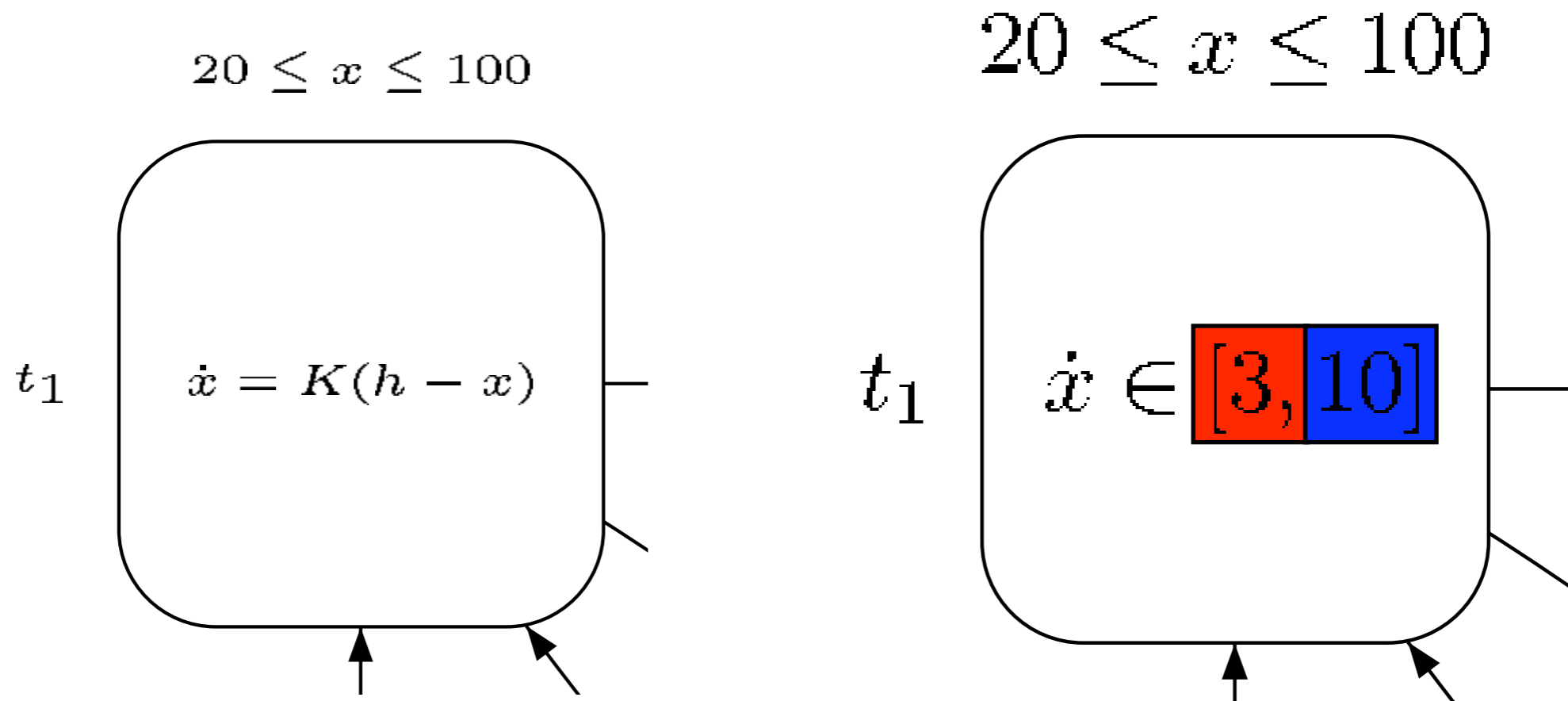


# Rectangular approximations

---

- For each control mode we **partition** the space into **rectangular regions**;
- Within each region, the **flow field** is **over-approximated** using **rectangular flows**.
- Those approximations can often be obtained automatically by computing **lower** and **upper bounds** on derivatives within **rectangular regions**.
- The approximations can be made **arbitrarily precise** by approximating over **suitably small regions** of the state space.

# An example

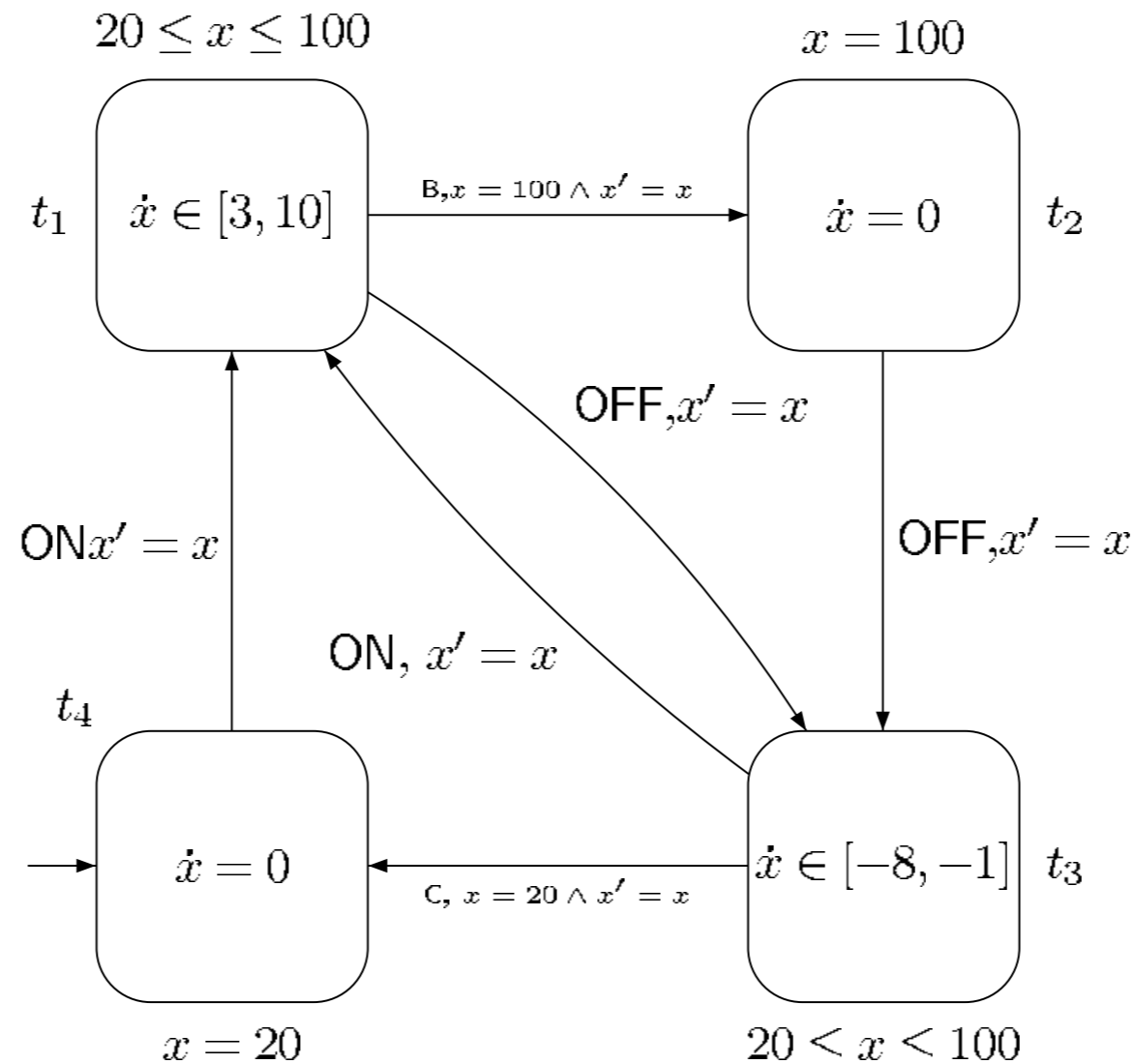


$$\text{Max}_{x \in [20, 100]} K(h-x) = K(h-20) = 0.075(150-20) = 9.75 \leq 10$$

$$\text{Min}_{x \in [20, 100]} K(h-x) = K(h-100) = 0.075(150-100) = 3.75 \geq 3$$

# An example

- Applying this computation for each location, we get the following **rectangular approximation** of the tank:



# Over-approximations and correctness

---

- Let us note **RectOver**(H) the rectangular overapproximation obtained using the previous method;
- **RectOver**(H) is a **over-approximation** of the original system in the following formal sense:

$$\mathbf{Path}_F(\llbracket H \rrbracket) \subseteq \mathbf{Path}_F(\llbracket \mathbf{RectOver}(H) \rrbracket)$$

- **Transfer of correctness** from overapproximations:

$$\begin{aligned} \text{if } \mathbf{Path}_F(\llbracket \mathbf{RectOver}(H) \rrbracket) \cap \mathbf{BadPaths} = \emptyset \\ \text{then } \mathbf{Path}_F(\llbracket H \rrbracket) \cap \mathbf{BadPaths} = \emptyset \end{aligned}$$

# Over-approximations and false negatives

- When over-approximating the behavior of a system, we face the possibility to get **false negatives** during verification;
- Indeed, the set of behaviors of the **over-approximation** is a **superset** of the behaviors of the original system...
- ...so if we have that

$$\text{Path}_F(\llbracket \text{RectOver}(\mathbf{H}) \rrbracket) \cap \text{BadPaths} \neq \emptyset$$

it is **not** necessarily the case that

$$\text{Path}_F(\llbracket \mathbf{H} \rrbracket) \cap \text{BadPaths} \neq \emptyset$$

# Candidate counter examples

- A path  $\lambda = s_0 \tau_0 s_1 \tau_1 \dots \tau_{n-1} s_n$  is an **candidate counter example** if
  - $\lambda \in \llbracket \text{OverRect}(H) \rrbracket \cap \text{BadPaths}$
- When facing a candidate counter example, we check if the counter example is realizable in the original model, so we ask:
  - $\lambda \in? \llbracket H \rrbracket$

This test is possible for larger class than rectangular automata, i.e. affine/polynomial hybrid automata.
- If  $\lambda \in \llbracket H \rrbracket$ , then we have found a **real** counter example i.e., the a Bad path in the original HA  $H$ .

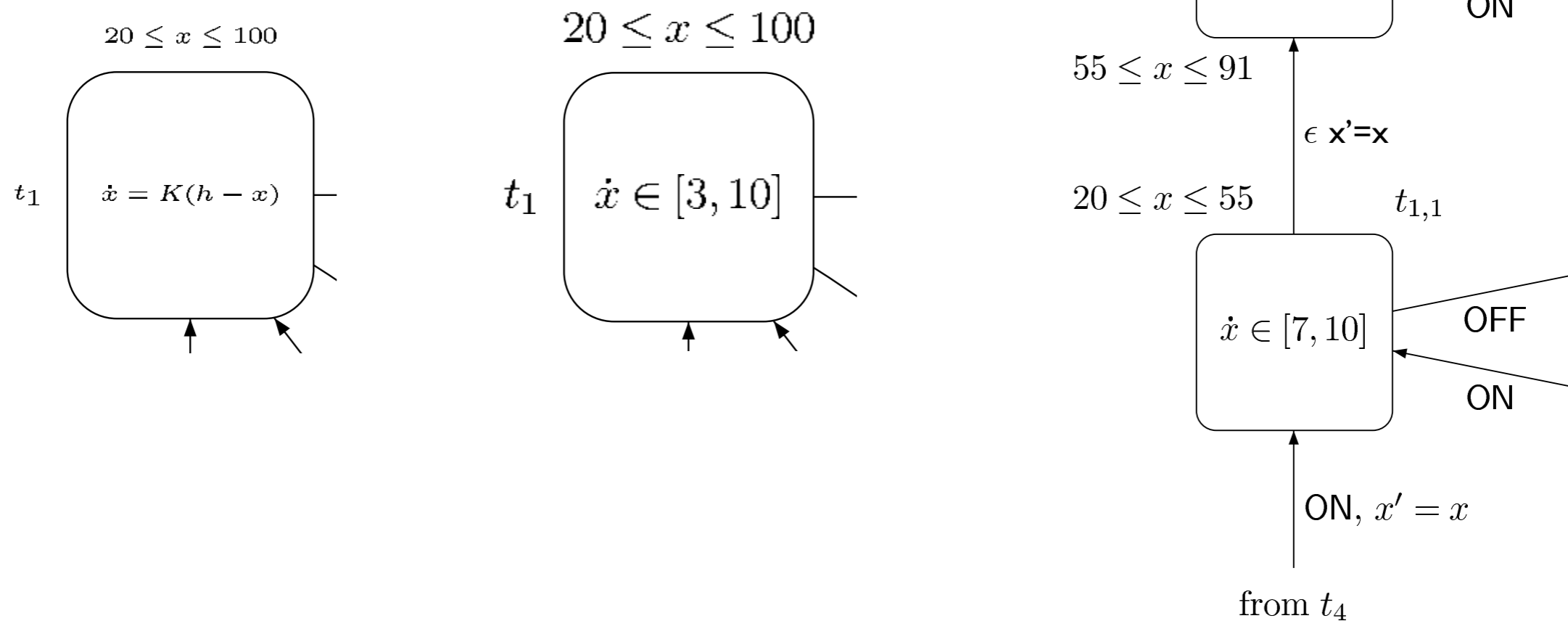
# Spurious counter-examples

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- If  $\lambda \notin \llbracket H \rrbracket$ , then  $\lambda$  is a **spurious counter example** i.e.:
  - $\lambda \in \llbracket \text{OverRect}(H) \rrbracket \cap \text{BadPaths}$
  - $\lambda \notin \llbracket H \rrbracket$
- In this case, we must **refine**  $\text{OverRect}(H)$  in order to eliminate the counter example.
- There is a large research effort in the CAV community on the so-called **counter-example based abstraction refinement**, and variants.

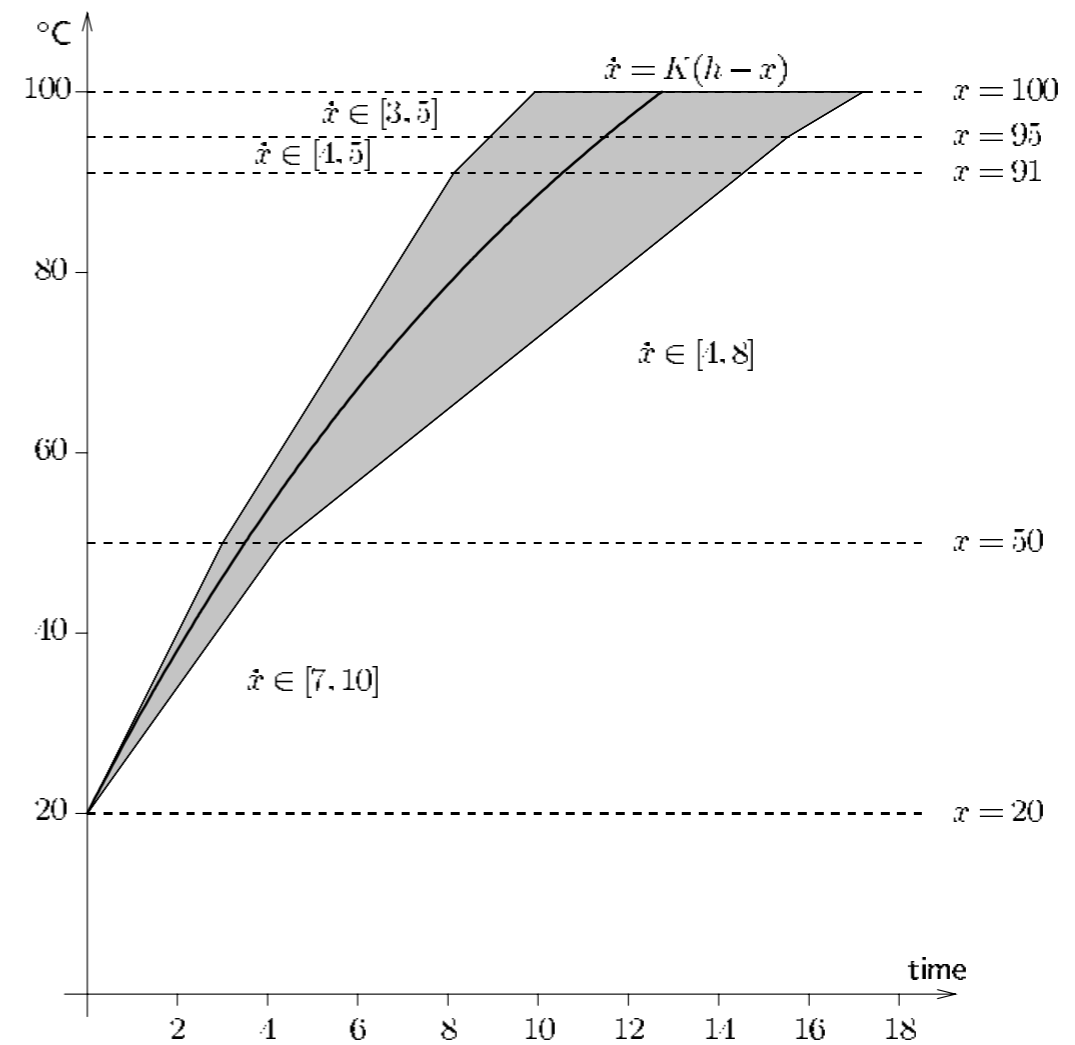
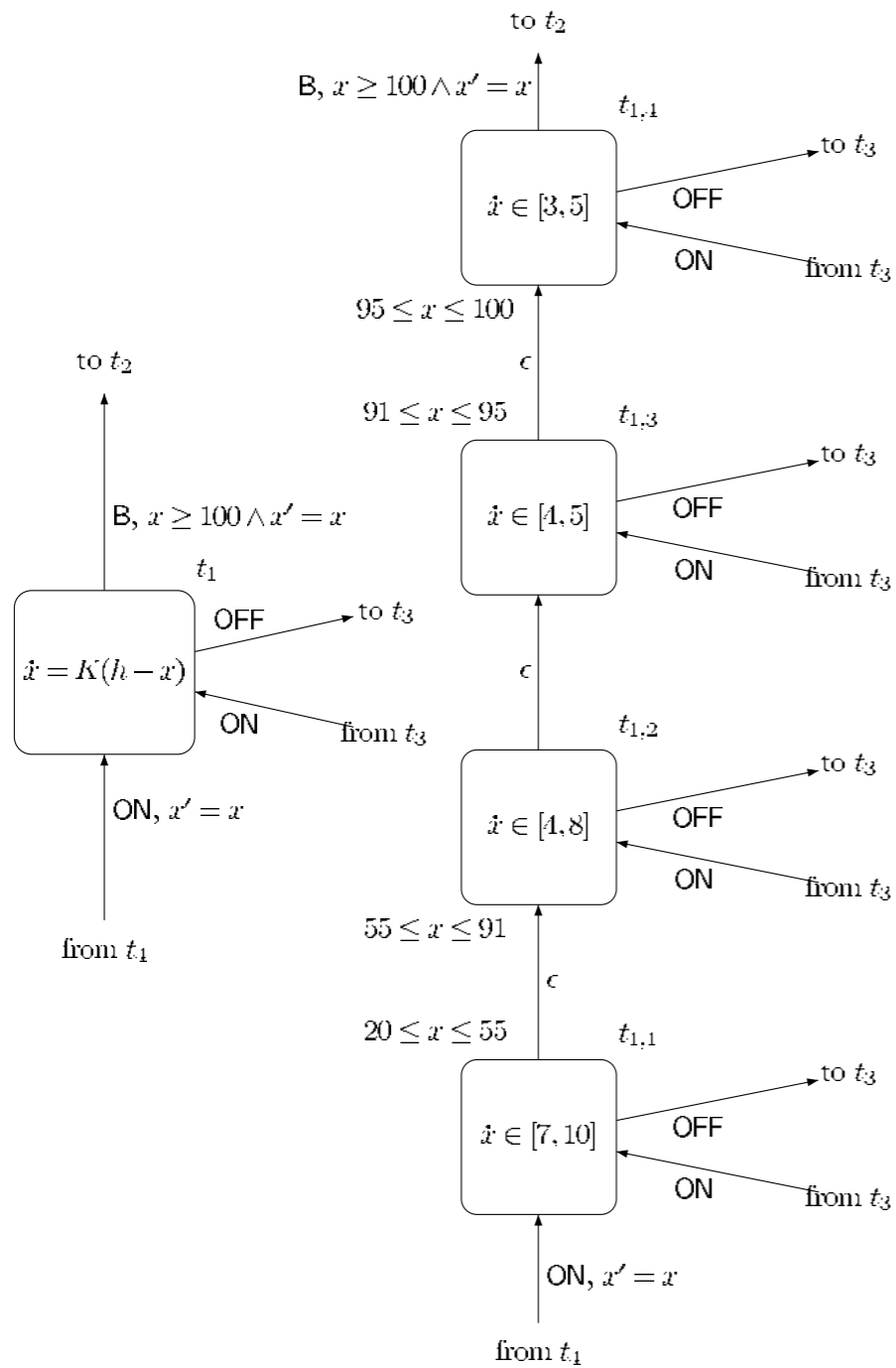
# Abstraction refinement

- In presence of **spurious counter examples**, we **refine** the rectangular approximation by **splitting** locations to decorate them with smaller rectangular regions.

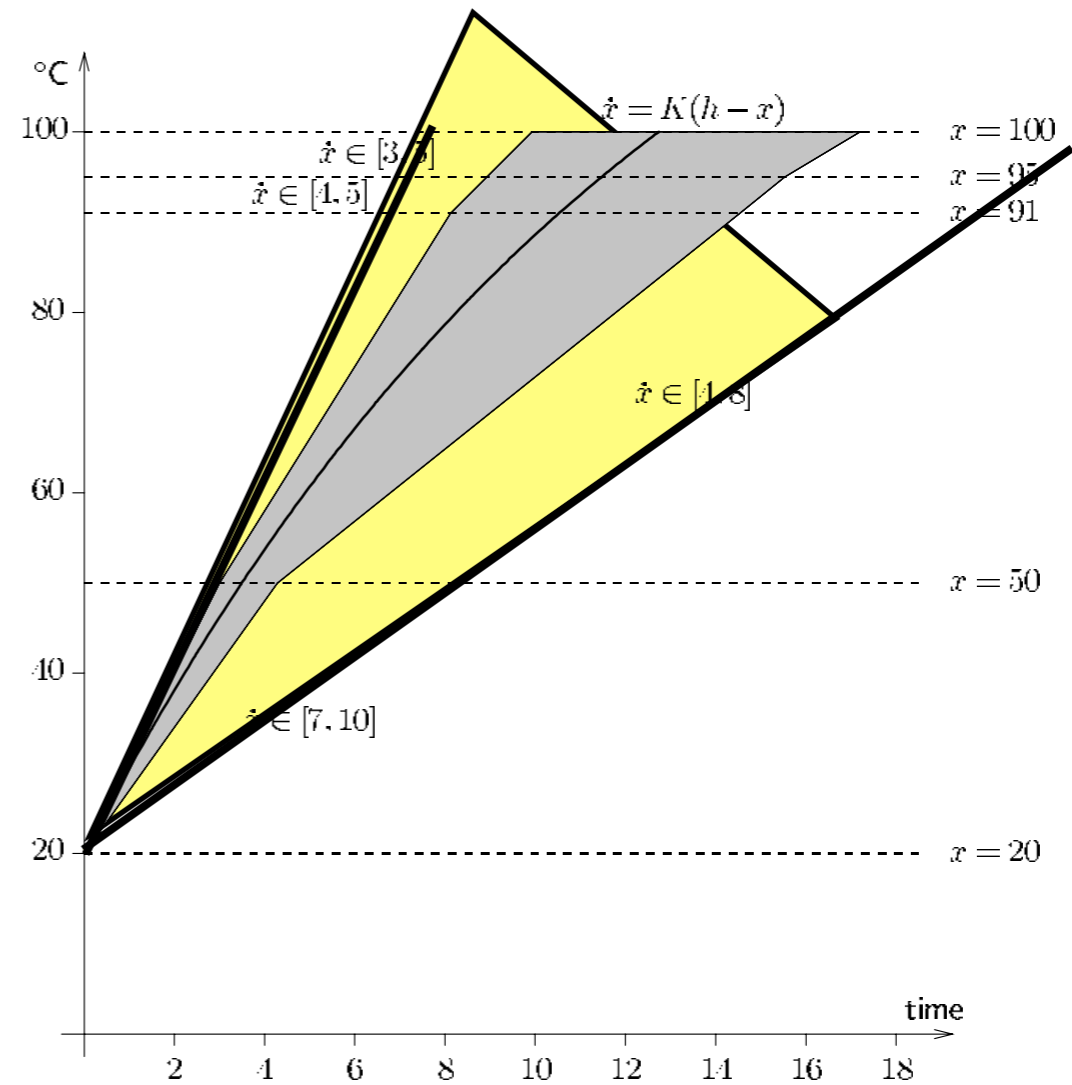
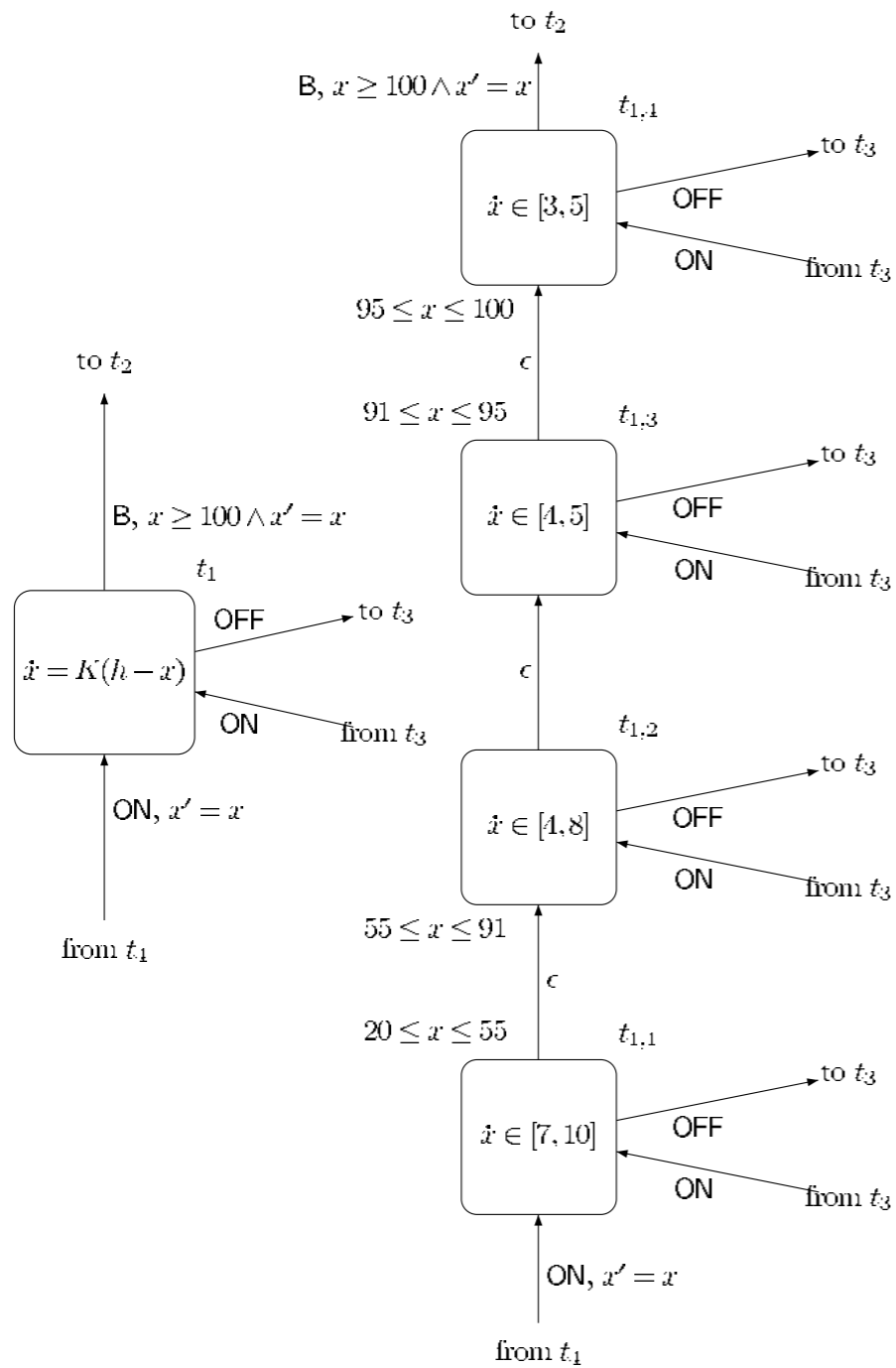




# Example



# Example



# Conclusion

# Conclusion

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- We have defined the **syntax** and **semantics** of hybrid automata ...
- ... shown how to use them **to model compositionally** a hybrid system ...
- ... shown how to formalize **safety** requirements using **monitors** ...
- ... recalled the main ingredients for **safety** and **reachability** analysis ...
- ... introduced the subclasses of **rectangular hybrid automata** and initialized **RHA** ...
- ... shown how to **over-approximate** complex hybrid automata using RHA.

# Bibliography

See written notes !