

# CS:4980

# Foundations of Embedded Systems

## Hybrid Systems

### Part I

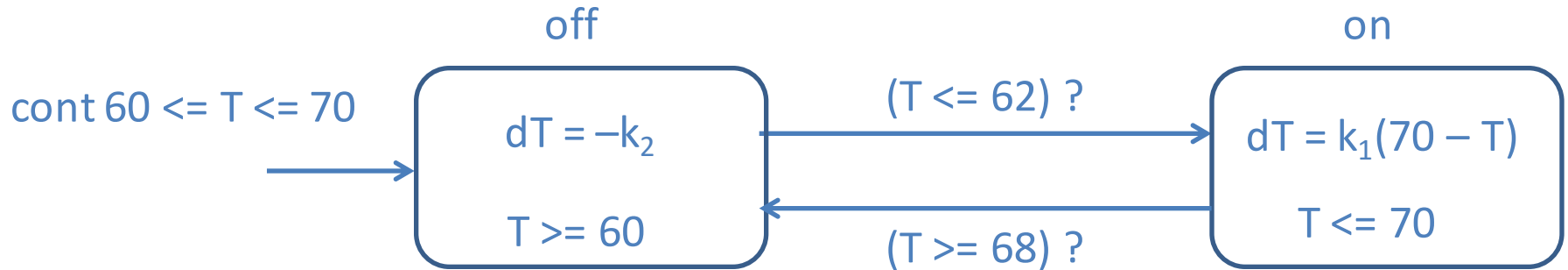
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# Models of Reactive Computation

- **Continuous-time model** for dynamical system
  - Synchronous, where time evolves continuously
  - Execution of system: Solution to algebraic / differential equations
  
- **Timed model**
  - Like asynchronous for communication of information
  - Clocks evolve continuously, and constraints on delays allow synchronous/global coordination
  
- **Hybrid systems**
  - Generalization of timed processes
  - During timed transitions, evolution of state/output variables specified using differential equations as in dynamical systems

# Self-Regulating Switching Thermostat



State machine with two modes: **on** and **off**

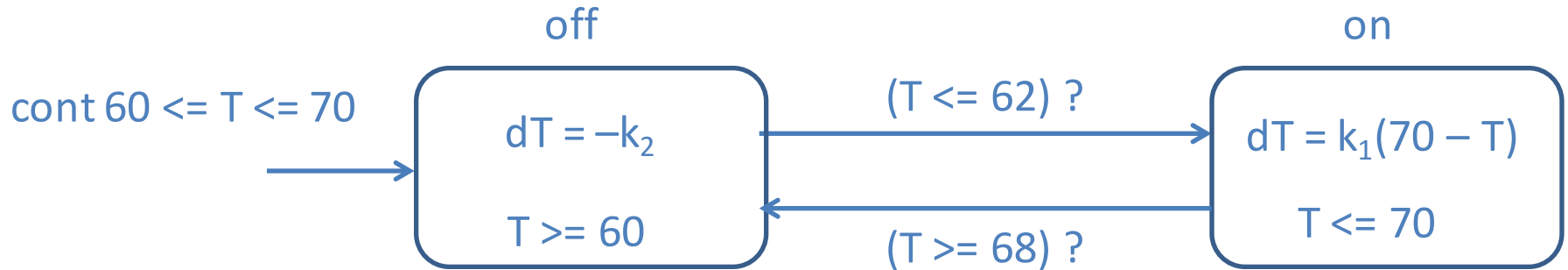
State variable  $T$  of type **cont** (continuous), to model temperature

$T$  can be tested and updated during mode-switches

$T$  changes continuously during timed transitions given by differential equations

Invariants (as in timed model) constrain how long can a timed transition be

# Executions of Thermostat



Initial state = (off,  $T_0$ ) with  $T_0$  in the interval  $[60, 70]$

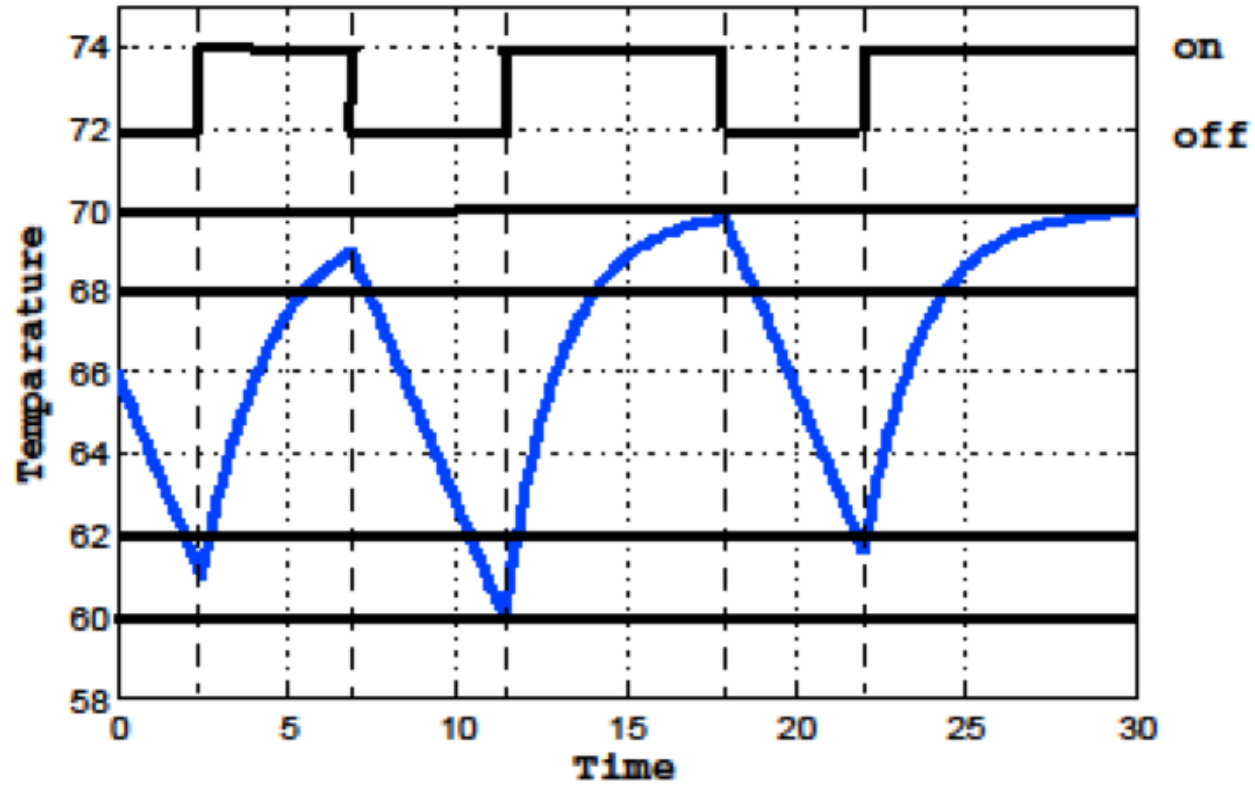
During a timed transition,  $T$  decreases continuously:  $T(t) = T_0 - k_2 t$

Mode-switch to **on** enabled when  $T \leq 62$ , and must happen before  $T$  reaches 60

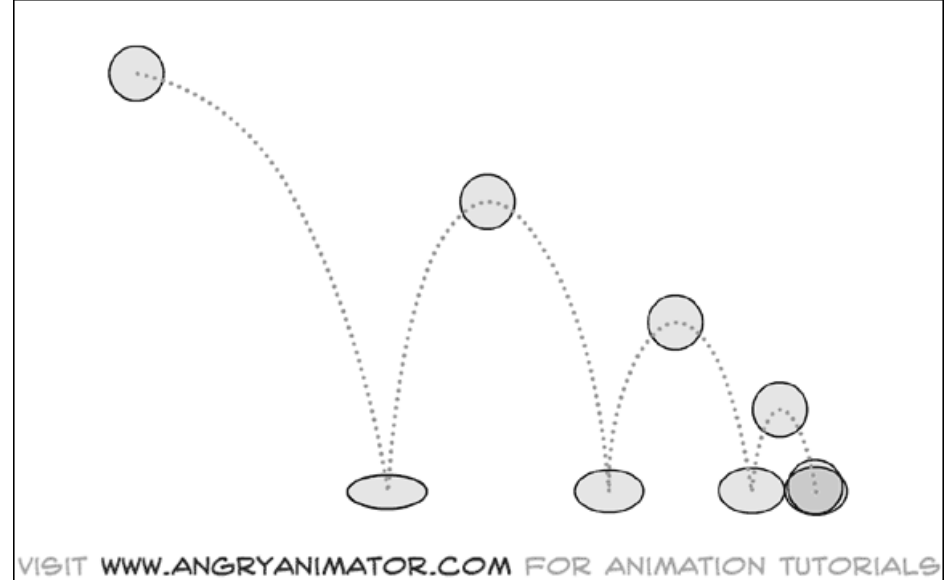
As time elapses in mode **on**,  $T$  increases according to  $T(t) = 70 - (70 - T^*) e^{-k_1(t-t^*)}$   
 $t^*$ ,  $T^*$  : time and temperature upon entry to mode **on**

Mode-switch to **off** enabled when  $T \geq 68$ , and must happen before  $T$  reaches 70

# Simulation Plot of an Execution

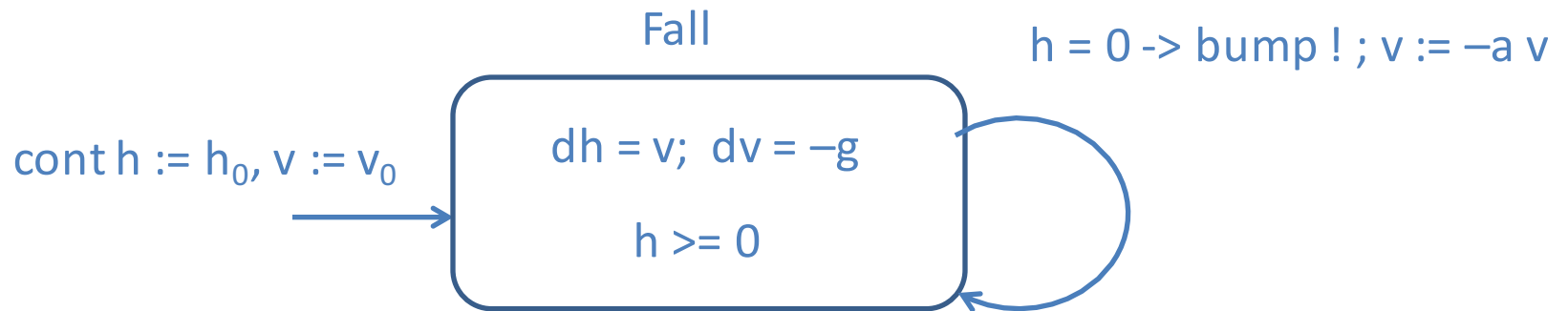


# Modeling a Bouncing Ball



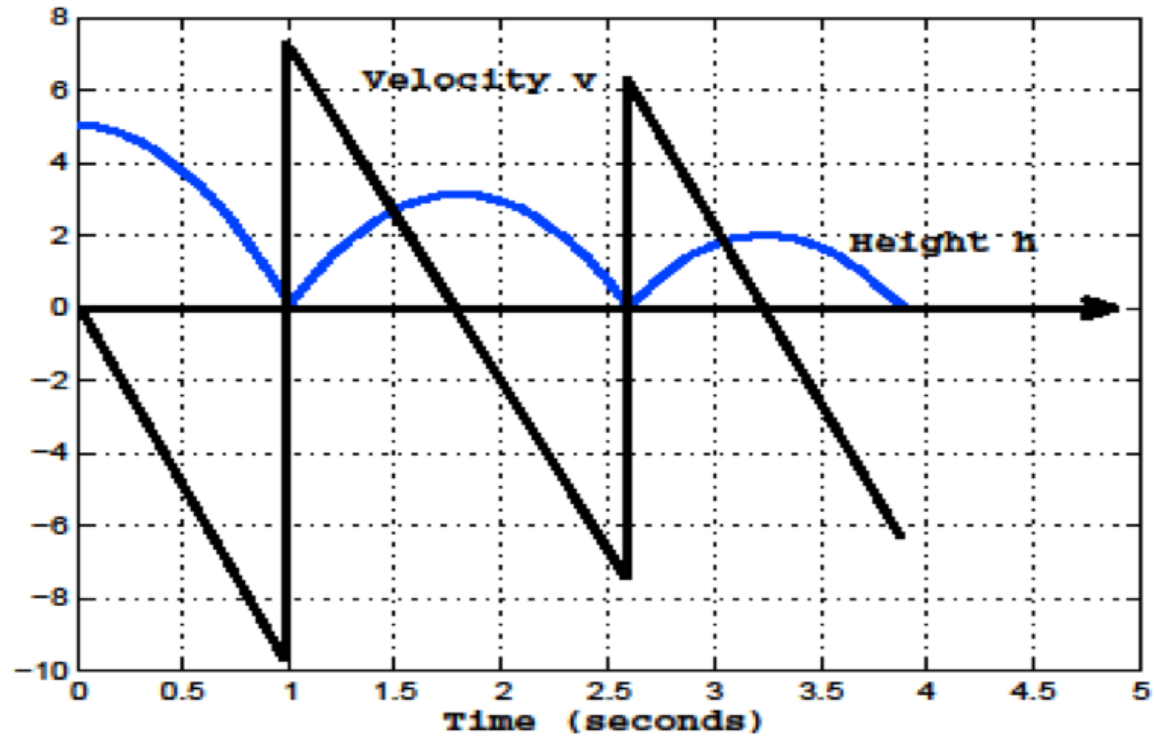
- ❑ Ball dropped from an initial height  $h_0$  with an initial velocity  $v_0$
- ❑ Velocity changes according to the differential equation  $dv/dt = -g$
- ❑ When the ball hits the ground, that is, when height  $h = 0$ , velocity changes discretely:  $v := -a v$ , where  $0 < a < 1$  is *dampening* constant
- ❑ Modeled as a hybrid system: mix of discrete and continuous behaviors!

# Hybrid Process for Bouncing Ball



# Execution of the Bouncing Ball Process

$$h_0 = 5$$
$$v_0 = 0$$





# Definition of Hybrid Process: Syntax

A *hybrid process*  $HP$  consists of

1. An asynchronous process  $P$ , with continuous ( $I_c$ ) and discrete ( $I_d$ ) input variables  $I$ , continuous ( $S_c$ ) and discrete ( $S_d$ ) state variables  $S$ , and continuous ( $O_c$ ) and discrete ( $O_d$ ) output variables  $O$
2. A *continuous-time invariant*  $CI$ , a Boolean expression over  $S_c$
3. For every continuous output variable  $y$ , a Lipschitz-continuous real-valued expression  $h_y(S_c, I_c)$  defining  $y$
4. For every continuous state variable  $x$ , a Lipschitz-continuous real-valued expression  $f_x(S_c, I_c)$  defining the rate of change of  $x$
5. Input, output, internal and *timed* actions

# Definition of Hybrid Process: Semantics

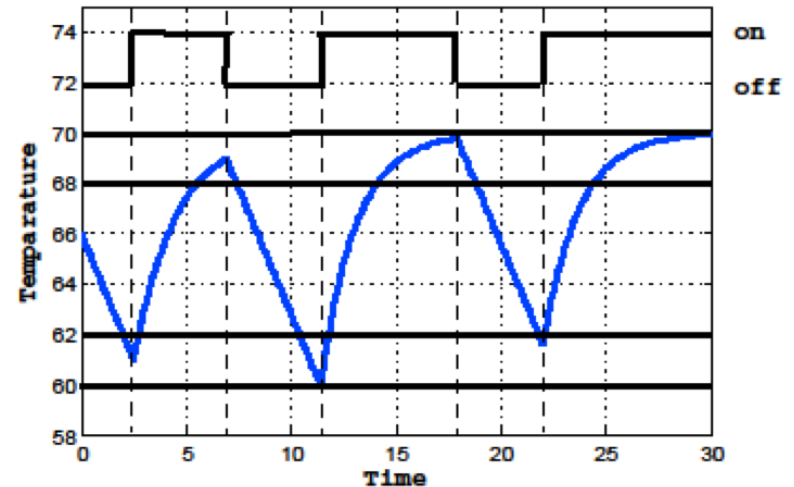
- Inputs, outputs, states, initial states, internal actions, input actions, output actions: defined exactly the same as the asynchronous model
- Timed actions: Given a state  $s$  and real-valued time  $\delta > 0$  and a continuous input signal  $I(t)$  giving values for  $I_c$  over time interval  $[0, \delta]$ , the corresponding state signal  $S(t)$  and output signal  $O(t)$  over  $[0, \delta]$  is uniquely defined so that
  1. The initial state  $S(0)$  equals  $s$
  2. For each output variable  $y$  in  $O_c$ ,  $O_y(t) = h_y(S(t), I(t))$
  3. For each state variable  $x$  in  $O_c$ ,  $dS_x(t)/dt = f_x(S(t), I(t))$
  4. At all times  $t$  in  $[0, \delta]$ ,  $S(t)$  satisfies the invariant  $CI$

**Note:** At all times  $t$  in  $[0, \delta]$ , discrete state variables stay unchanged

# Executions of Hybrid Processes

Starting from an initial state, execute either

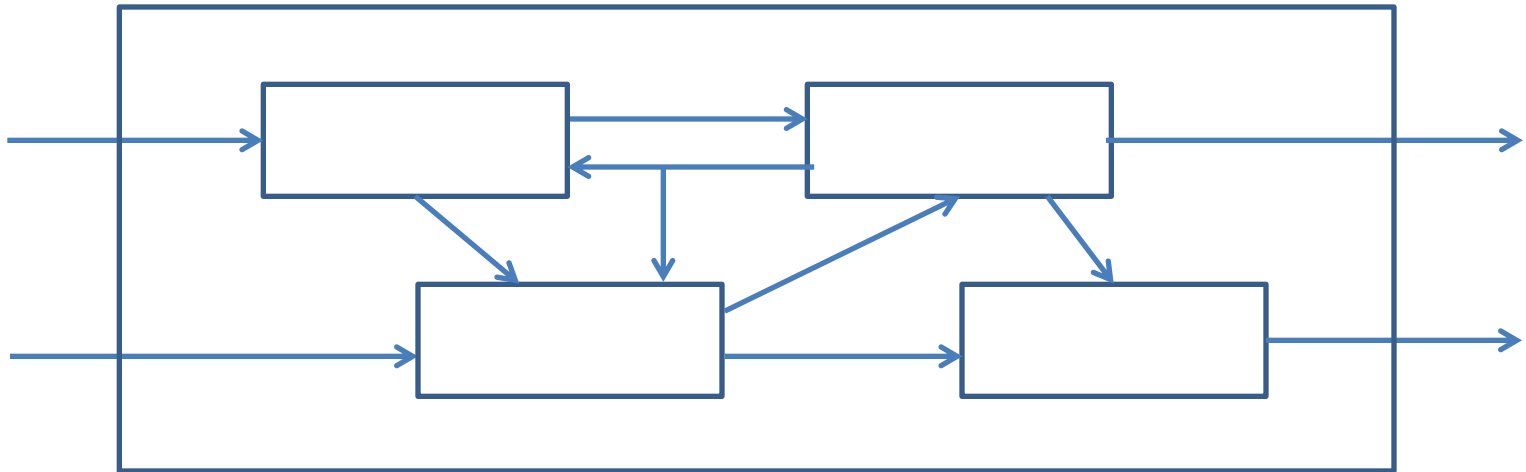
- a discrete, instantaneous step (input, or output or internal action) or
- a timed step of some duration  $\delta > 0$  (need to solve system of ODEs)



(off, 66) -2.5-> (off, 61) -> (on, 61) -3.7-> (on, 69.02) -> (off, 69.02) -4.4->  
(off, 60.22) -> (on, 60.22) -7.6-> (on, 69.9) -> (off, 69.9) -4.1-> (off, 61.7) ->  
(on, 61.7) ...

Concepts based on transition systems such as reachable states, safety and liveness requirements, all apply to hybrid systems

# Block Diagrams

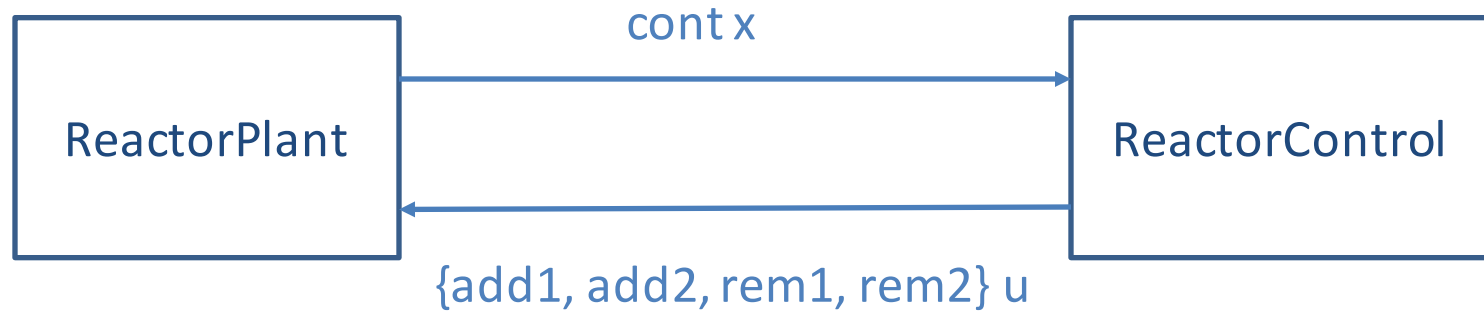


- ❑ Component processes can now be hybrid processes
  - Need to define **instantiation**, **composition**, **output hiding**
  
- ❑ Channels connecting processes of two types
  1. Sender/receiver communication during discrete steps:  
as in the asynchronous model
  2. Continuously evolving signals during timed steps:  
as in the model of continuous-time dynamical systems

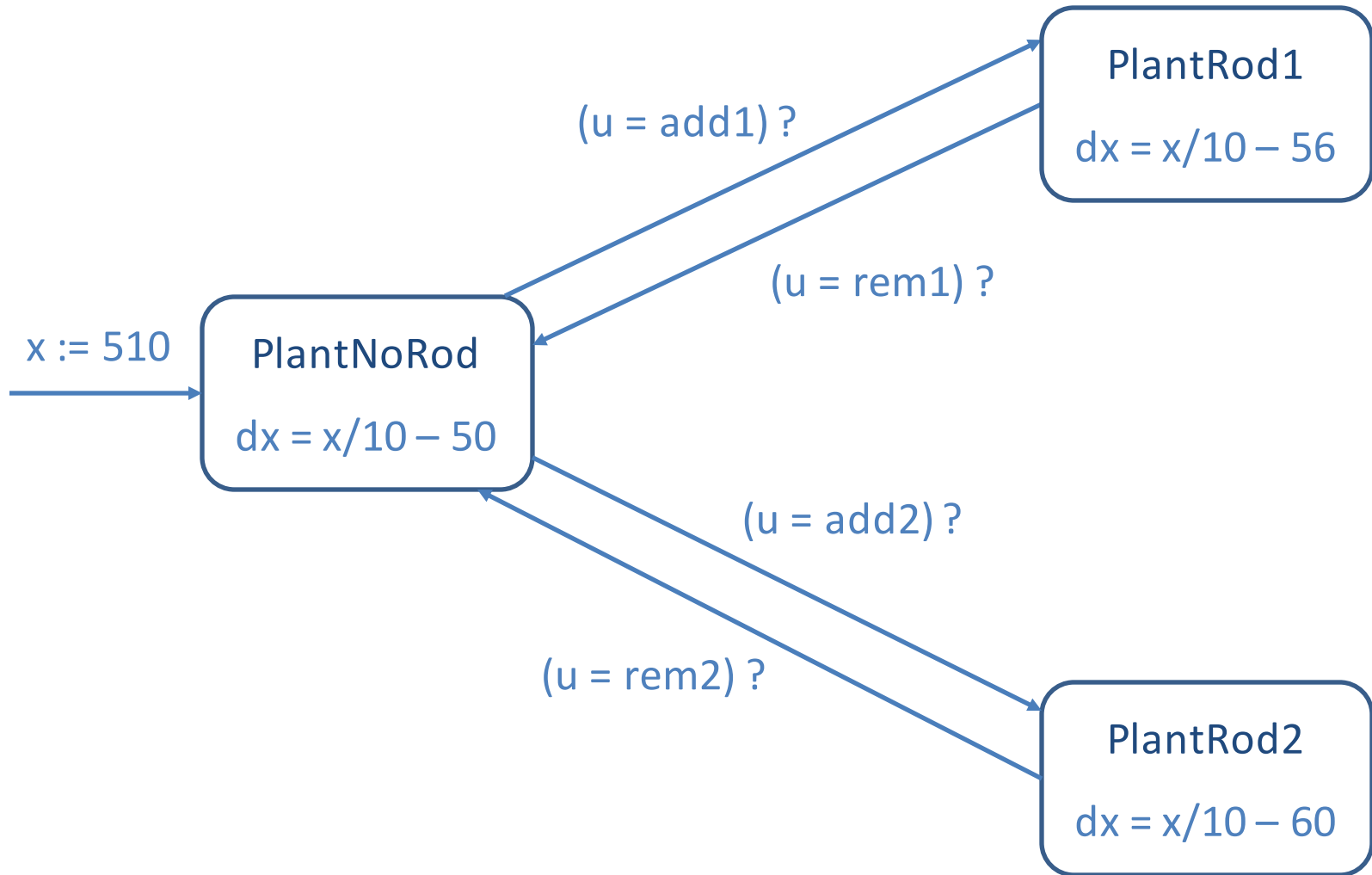
# Composition of Hybrid Processes

- ❑ Instantiation, variable renaming and output hiding:
  - Defined as usual
  
- ❑ Composition:
  - Compose discrete parts together as in the asynchronous model
  - Compose continuous parts of internal actions together as in dynamical systems
  - Generate continuous-time invariants of merged action a conjunction of original ones
  
- ❑ Compatibility of two hybrid processes:
  - State variables are disjoint and output variables are disjoint
  - No cyclic await dependencies among shared input/output variables

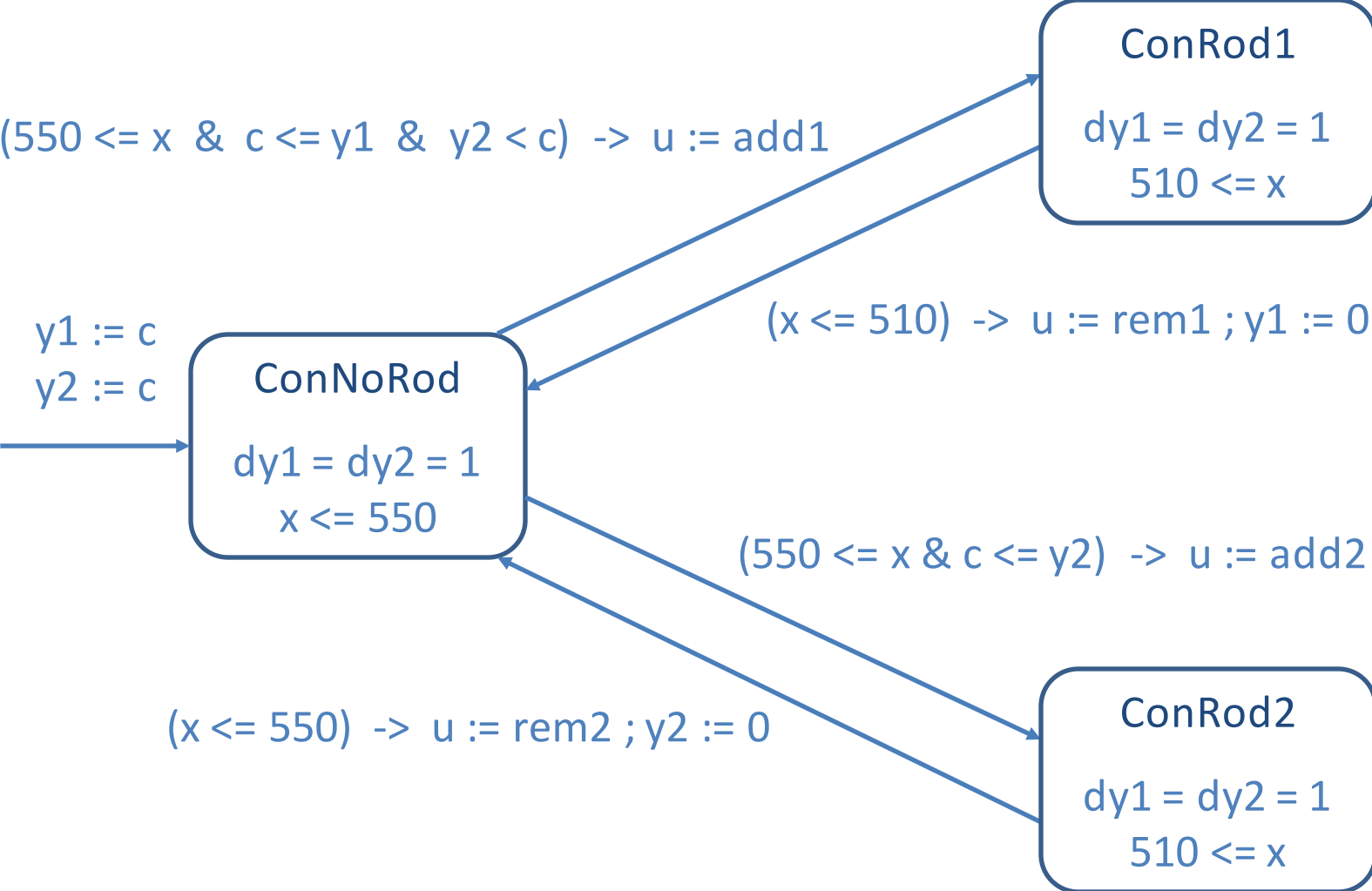
# Nuclear Reactor Example



# Reactor Plant



# Reactor Controller

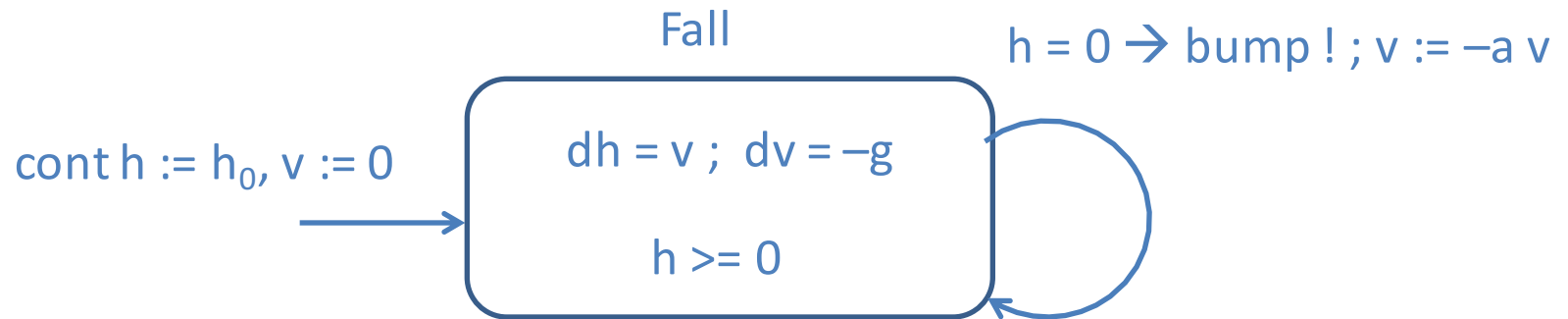




# Summary of the Model

- ❑ Generalizes timed model
  - Variables evolving continuously during a timed action can have complex dynamics, clocks being a very special case
- ❑ Generalizes continuous-time dynamical systems
  - Discontinuous changes to system state now can be modeled
- ❑ Generalizes asynchronous model
  - Distributed/multi-agent systems can be modeled
- ❑ Suitable for modeling of cyber-physical systems (in full generality)
- ❑ Existing commercial tool support: Modelica, Stateflow/Simulink
- ❑ Challenge for analysis
  - Even if dynamics in individual modes is linear, due to discrete changes it is not possible to obtain closed-form solutions, or general theorems about stability

# Analysis of Bouncing Ball Model



Change in height during first bounce:

$$h(t) = h_0 - gt^2/2$$

Time at which first bump occurs:

$$t_1 = \text{Sqrtr}(2 h_0 / g)$$

Velocity just before first bump occurs:

$$-\text{Sqrt}(2 g h_0) = -v_1$$

Velocity just after first bump :

$$v_2 = a v_1$$

Evolution of height during second bounce:

$$h(t) = v_2 t - gt^2/2$$

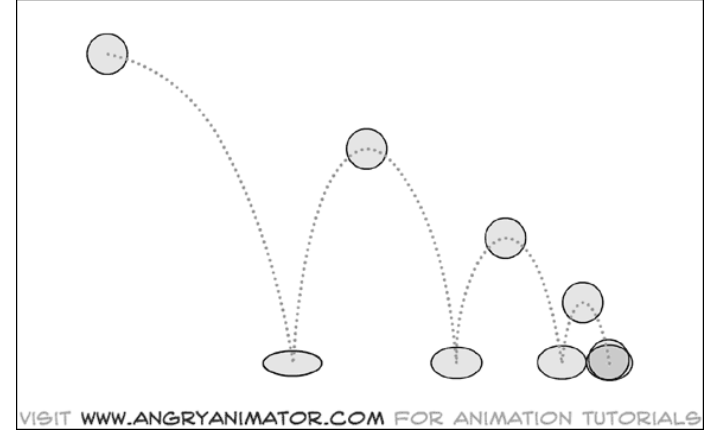
Time between first and second bump:

$$t_2 = 2 v_2 / g$$

Velocity just before second bump occurs:

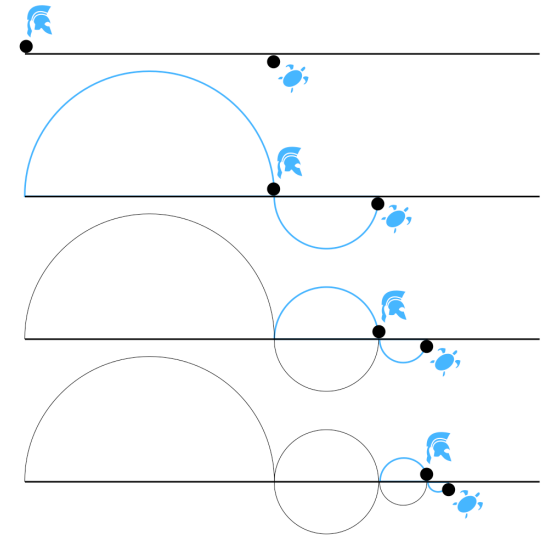
$$-v_2 \text{ and after } 2^{\text{nd}} \text{ bump } v_3 = a v_2$$

# Modeling a Bouncing Ball



- ❑ Velocity after  $k$  bumps:  $a^k v_1$
- ❑ Duration between  $k^{\text{th}}$  and following bump:  $a^k v_1 / g$
- ❑ Sum of durations between successive bumps converges to  $v_1 (1 + a) / (1 - a)$
- ❑ Infinitely many discrete actions in finite time: **Zeno behavior!**

# Zeno's Paradox



- ❑ Described by Greek philosopher Zeno in context of a race between Achilles and a tortoise
- ❑ Tortoise has a head start over Achilles, but is much slower
- ❑ In each discrete round, suppose Achilles is  $d$  meters behind at the beginning of the round
- ❑ During the round, Achilles runs  $d$  meters, but by then, tortoise has moved a little bit further
- ❑ At the beginning of the next round, Achilles is still behind, by a distance of  $a d$  meters, with  $0 < a < 1$
- ❑ By induction, if we repeat this for infinitely many rounds, Achilles will never catch up!
- ❑ If the sum of durations between successive discrete actions converges to a constant  $K$ , then an execution with infinitely many discrete actions describes behavior only up to time  $K$  (and does not tell us the state of the system at time  $K$  and beyond)

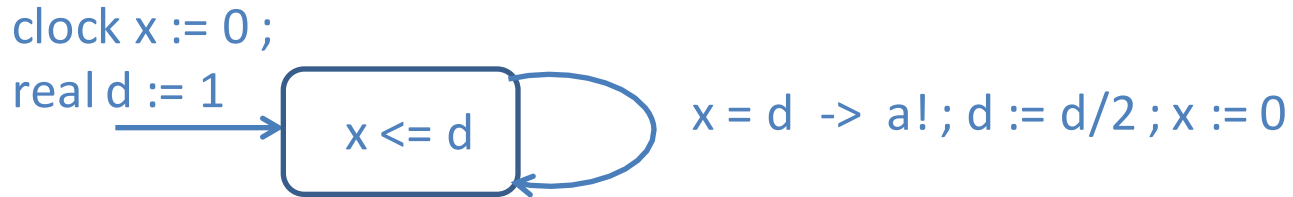
# Formalization

- An infinite execution of a hybrid process **HP** is of the form  $s_0 -t_1-\> s_1 -t_2-\> s_2 -t_3-\> s_3 \dots$ , where  $t_i$  is the duration of  $i^{\text{th}}$  step
  - Input/output/internal actions are instantaneous (duration 0)
  
- An **infinite execution** is called
  - *Zeno* if the infinite sum of all the durations is bounded above by a constant, and
  - *non-Zeno* if the sum diverges
  
- A **state**  $s$  of the process **HP** is called
  - *Zeno* if every execution starting in state  $s$  is Zeno
  - *Non-Zeno* if there is some non-Zeno execution starting in  $s$

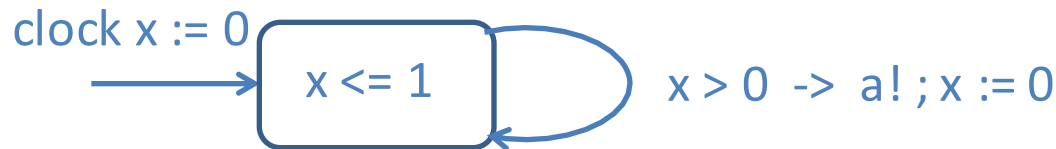
# Formalization

- ❑ A hybrid process **HP** is called *non-Zeno* if every reachable state of **HP** is non-Zeno
  - At every point during an execution it is possible for time to diverge
  
- ❑ Zeno system: Could end up in a state from which duration between successive steps must get smaller and smaller
  
- ❑ Examples
  - Thermostat: non-Zeno
  - Bouncing ball: Zeno

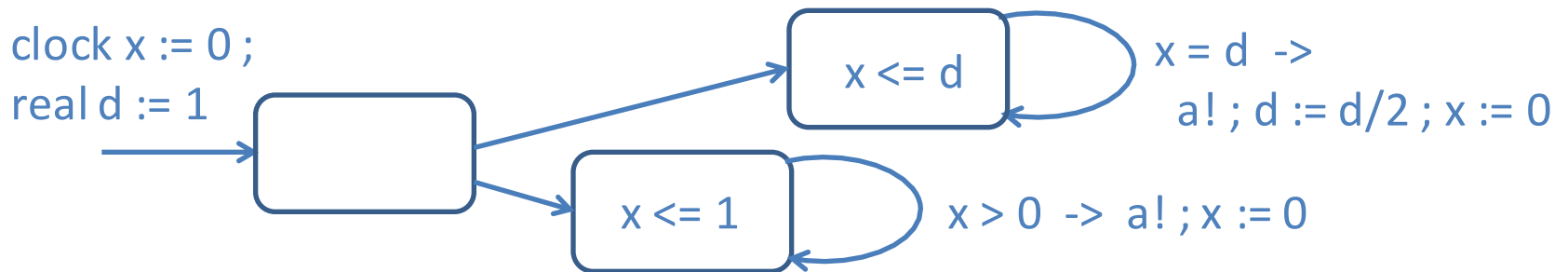
# Zeno vs Non-Zeno



Zeno! Every possible execution is Zeno



Non-Zeno! Some executions are Zeno and some are non-Zeno



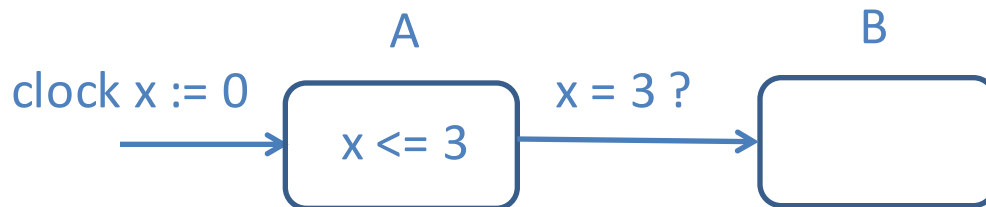
Zeno! System may end up in a state from which only Zeno executions are possible

# Zeno Processes and Reachability

❑ How does existence of Zeno processes influence analysis?

❑ Recall:

- A state  $s$  of a system  $H$  is *reachable* if there exists a finite execution starting in an initial state and ending in state  $s$
- A property  $P$  is *invariant* for  $H$  all reachable states satisfy  $P$



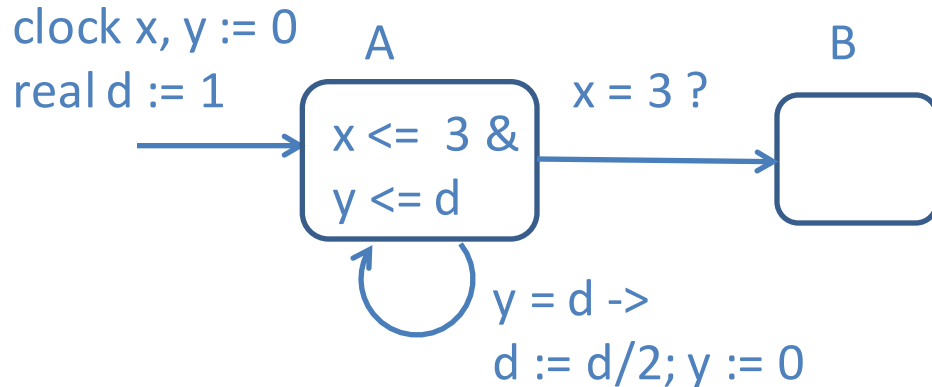
Is mode B reachable?



# Zeno Processes and Reachability

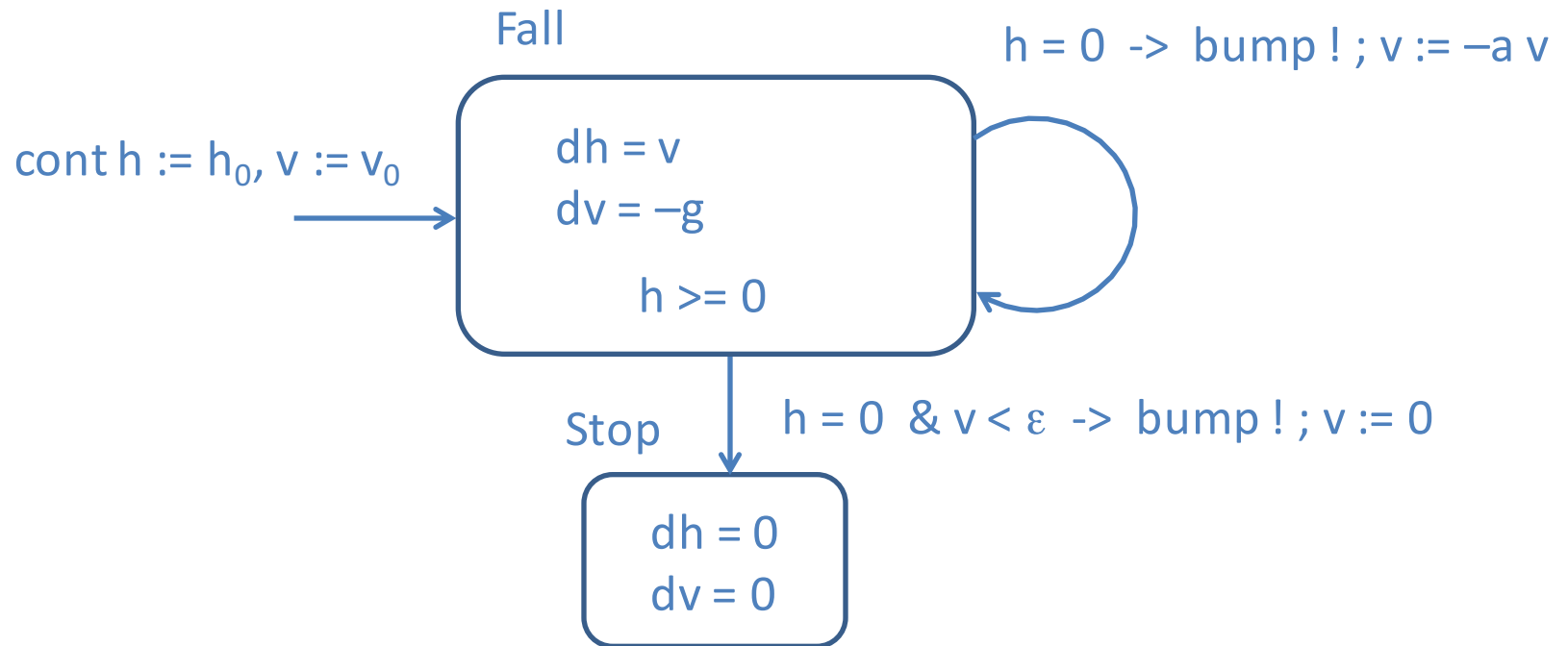


Is mode **B** reachable ?



Presence of a Zeno process in the system can stop time from advancing, and make states of other processes unreachable !

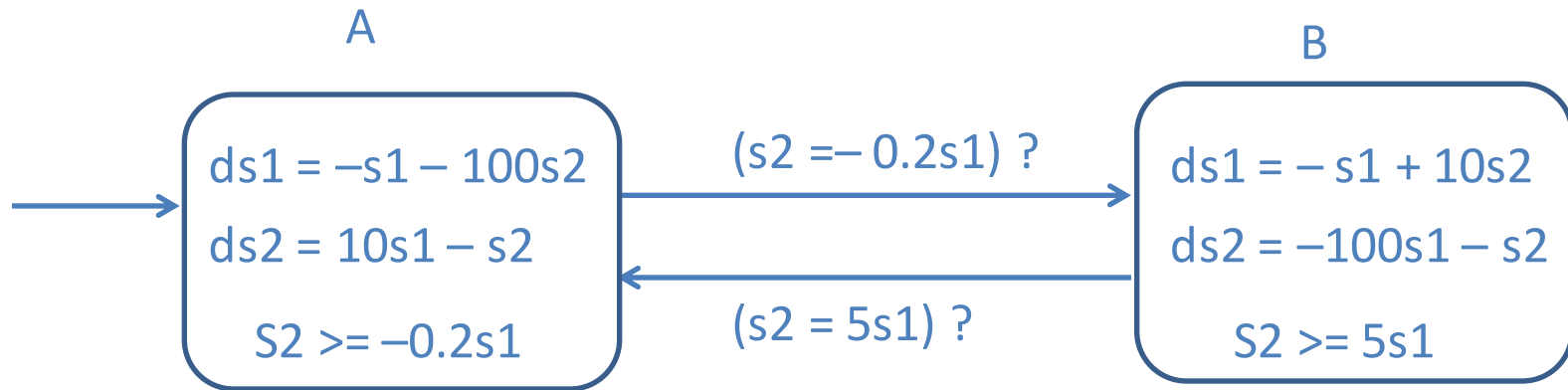
# Making Bouncing Ball Non-Zeno



If velocity is too small, stop modeling dynamics accurately

In this model, there is a lower bound on duration between successive bumps

# Stability of Hybrid Systems

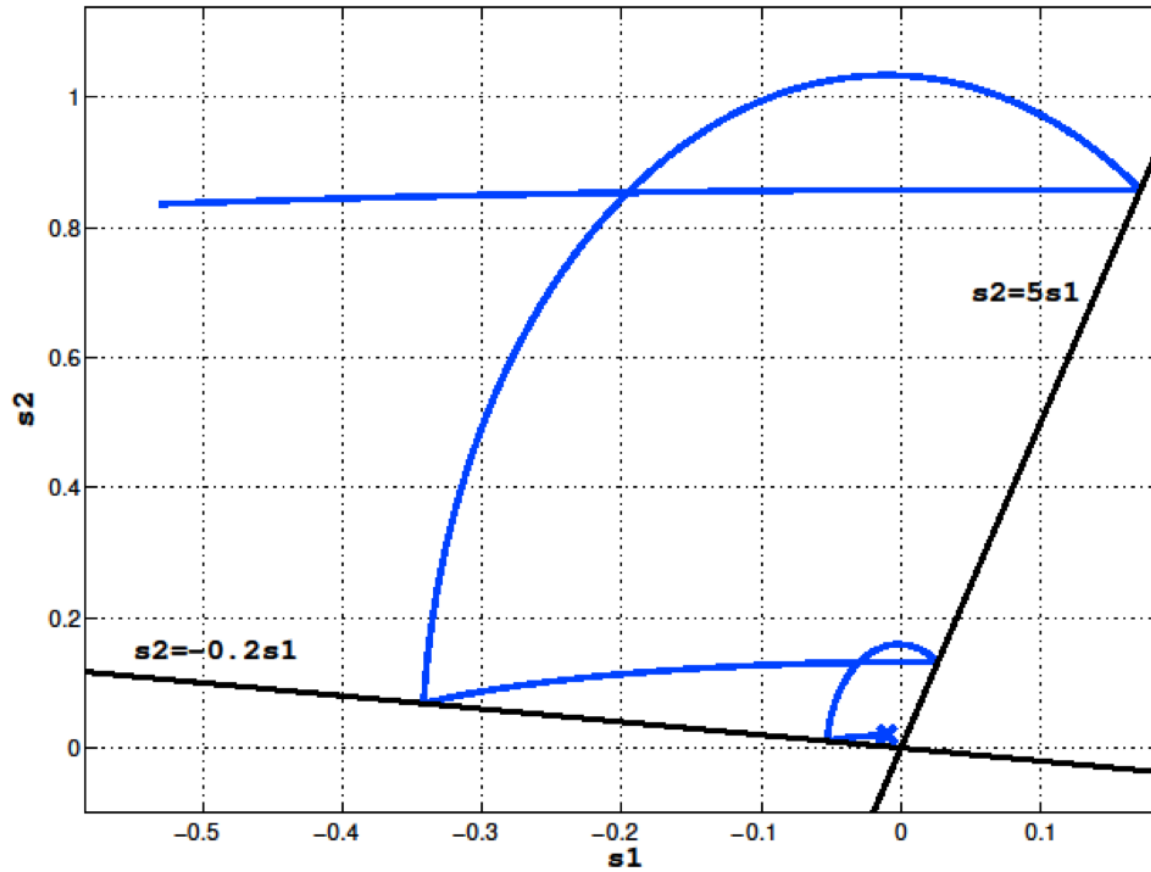


Is the dynamics in mode **A** stable?

Is the dynamics in mode **B** stable?

Each mode has stable dynamics, but switching causes instability!

# Stability of Hybrid Systems



# Credits

Notes based on Chapter 9 of

## **Principles of Cyber-Physical Systems**

by Rajeev Alur

MIT Press, 2015