



# U. PORTO

**FEUP** FACULDADE DE ENGENHARIA  
UNIVERSIDADE DO PORTO





# StateFlow Hands-On Tutorial

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# Session Outline

- Simulink and Stateflow
- Numerical Simulation of ODEs
  - Initial Value Problem (Hands-on)
  - ODEs with resets (Hands-on)
- Finite State Machines
  - FSMs in Stateflow (Hands-on)
- Discrete Event Systems
  - DESs in Stateflow (Hands-on)
- Hybrid Automata
  - Hybrid Systems in Stateflow (Hands-on)

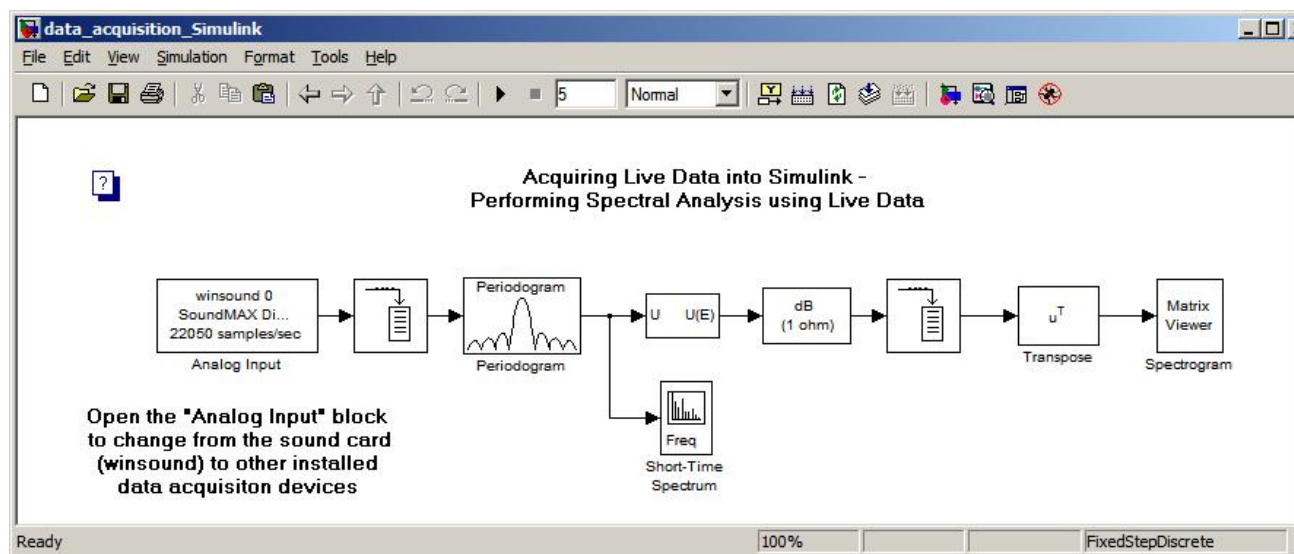


1.

# Simulink and Stateflow

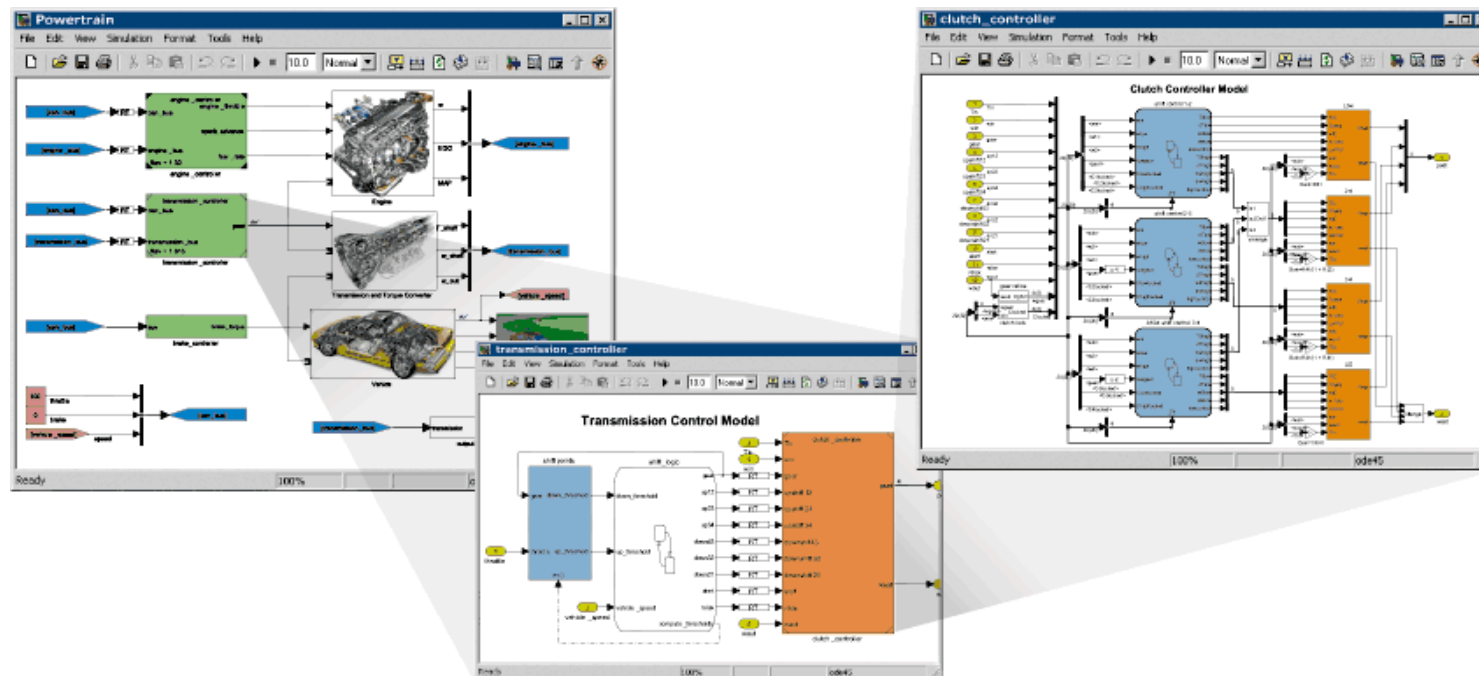
# Simulink

- Can be used to model and simulate dynamical systems in a comprehensive and graphical way
- Models are described as block diagrams (boxes with inputs/outputs)



# Simulink (2)

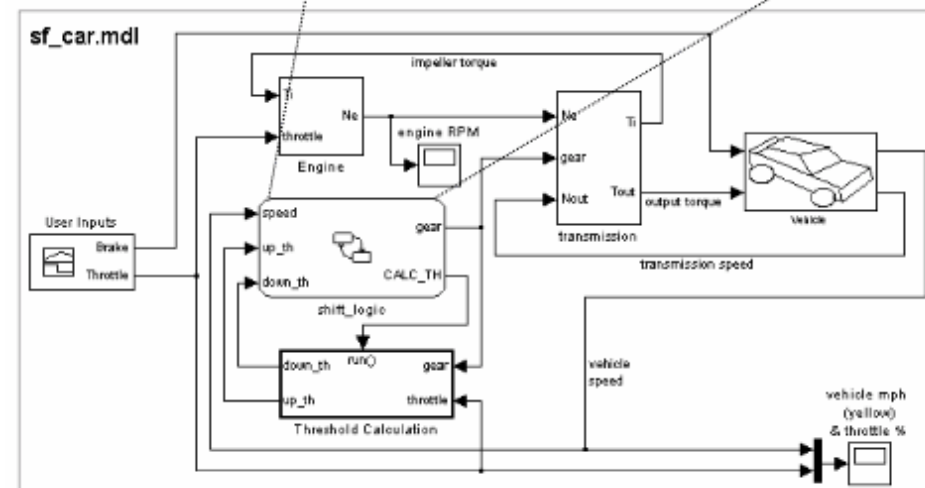
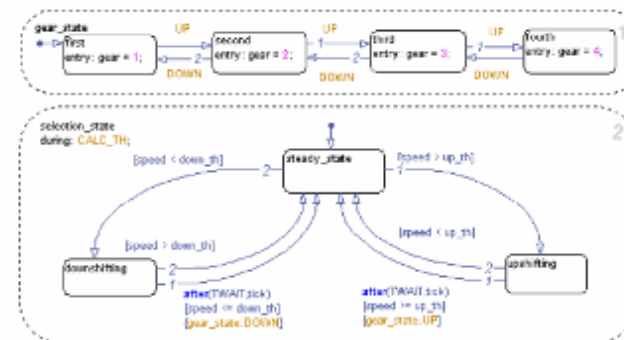
- Models are composed hierarchically allowing:
  - Modeling of complex systems in a modular and organized way
  - Different detail perspectives over the same model at design and simulation time





# Simulink and Stateflow

- Simulink includes several built-in block types (Model Library)
- Additionally, extensions to this library can be created by users and companies (toolboxes)
- Stateflow is one such toolbox
- Stateflow can be used to model the behaviour of FSMs





2.

# Numerical Simulation of ODEs





# The Initial Value Problem

Initial value problem (IVP)  $\equiv \dot{x} = f(x) \quad x(0) = x_0$

Definition: A signal  $x : [0, T] \rightarrow \mathbb{R}^n$  is a *solution* to the IVP if

$$x(t) = x_0 + \int_0^t f(x(\tau)) d\tau \quad \forall t \in [0, T]$$

**Example:**

$$\dot{x} = -x + 1$$

$$x(0) = 2$$

$$x(t) ?$$

[Hespanha, J. P. 05]

# ODE Numerical Simulation - Euler method

*Euler method* (first order method):

1st partition interval into  $N$  subintervals of length  $h := T/N$

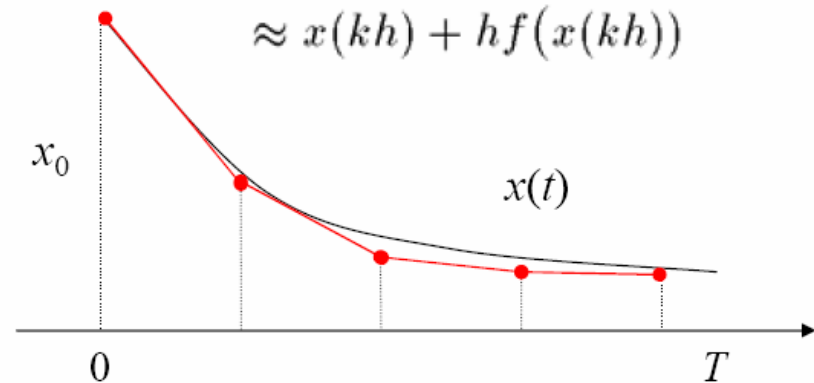
$$[kh, (k+1)h] \quad k \in \{0, 1, \dots, N-1\}$$

2nd assume derivative of  $x$  constant on each subinterval

$$x((k+1)h) = x(kh) + \int_{kh}^{(k+1)h} f(x(\tau)) d\tau$$

$$\approx x(kh) + hf(x(kh))$$

on each subinterval  $x$   
is assumed linear



[Hespanha, J. P. 05]

# ODE Simulation - Runge-Kutta method

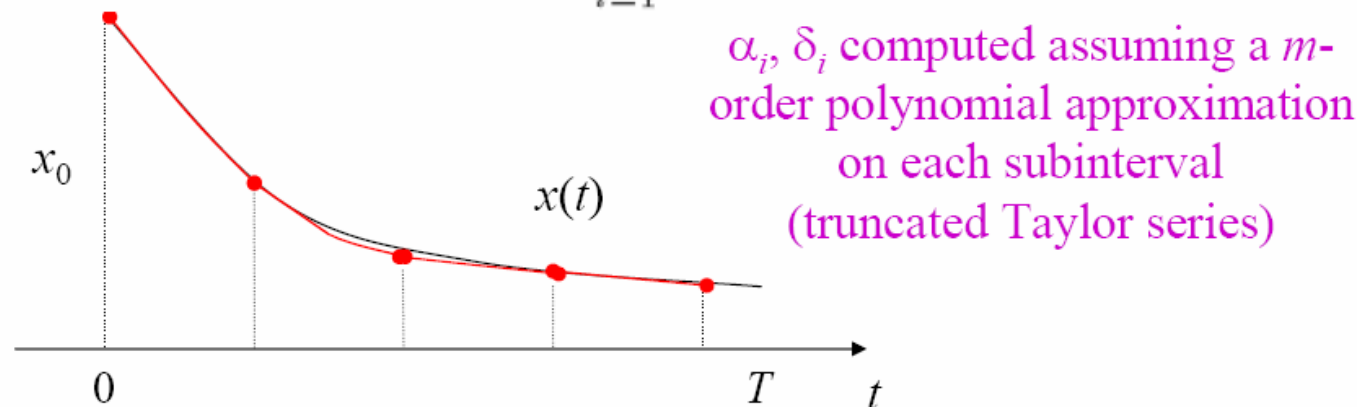
**Runge-Kutta methods** ( $m$ -order method):

1st partition interval into  $N$  subintervals of length  $h := T/N$

$$[kh, (k + 1)h] \quad k \in \{0, 1, \dots, N - 1\}$$

2nd assume derivative of  $x$  constant on each subinterval

$$x((k + 1)h) \approx x(kh) + h \sum_{i=1}^m \alpha_i f(x(kh) + \delta_i)$$



[Hespanha, J. P. 05]

# ODE Simulation – Variable-step methods

*Variable-step methods* (e.g., Euler):

Pick tolerance  $\varepsilon$  and define  $t_0 := 0$

$$\begin{aligned} x(t_{k+1}) &= x(t_k) + \int_{t_k}^{t_{k+1}} f(x(\tau))d\tau \\ &\approx x(t_k) + (t_{k+1} - t_k)f(x(t_k)) \end{aligned}$$

choose  $t_{k+1}$  sufficiently close to  $t_k$  so that

$$\|f(x(t_k)) - f(x(t_{k+1}))\| \leq \varepsilon$$

Simulation can be both *fast* and *accurate*:

1. when  $f$  is “flat” one can advance time fast,
2. when  $f$  is “steep” one advances time slowly (to retain accuracy)

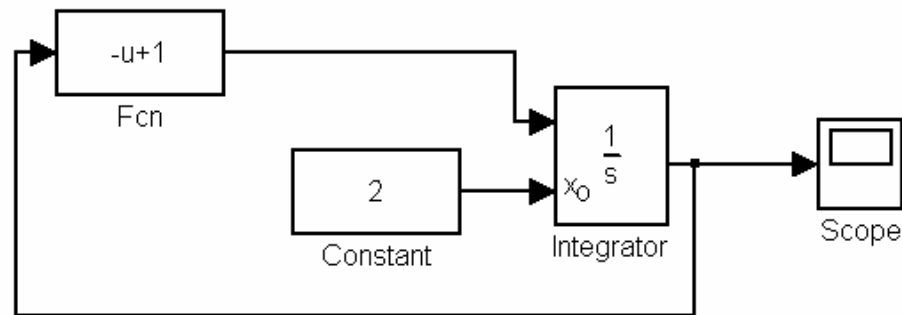
[Hespanha, J. P. 05]

# Solving the IVP in Simulink

- Simulink has an inbuilt ODE solver (Integrator)
  - Different integration methods (including variable step)

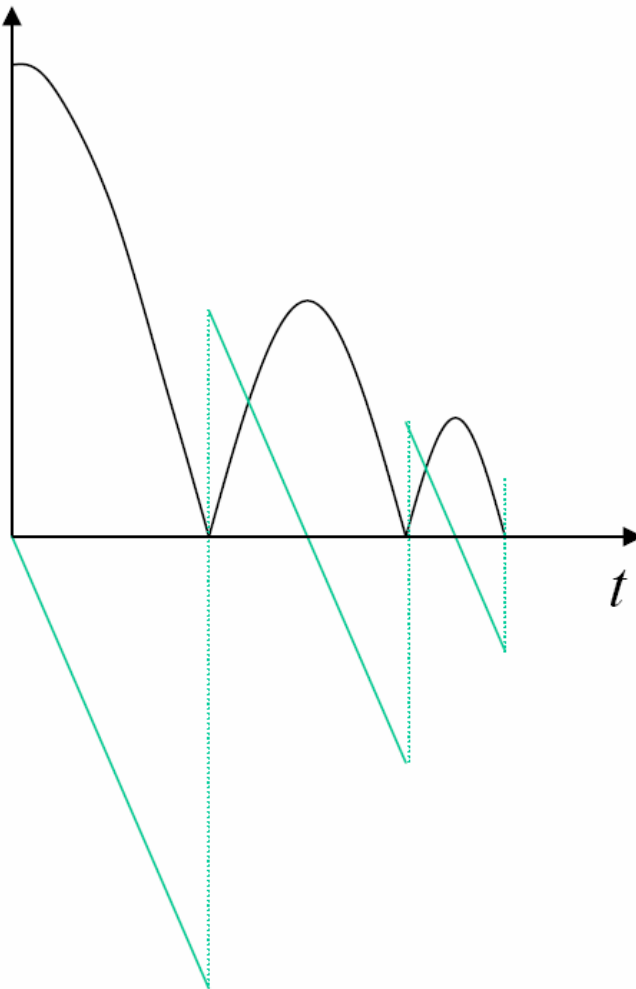
- Example:

$$\dot{x} = -x + 1 \quad x(0) = 2$$



(Integrator toolbox accepts initial value)

# ODEs with resets



$x_1 \leq 0 \ \& \ x_2 < 0 \ ?$

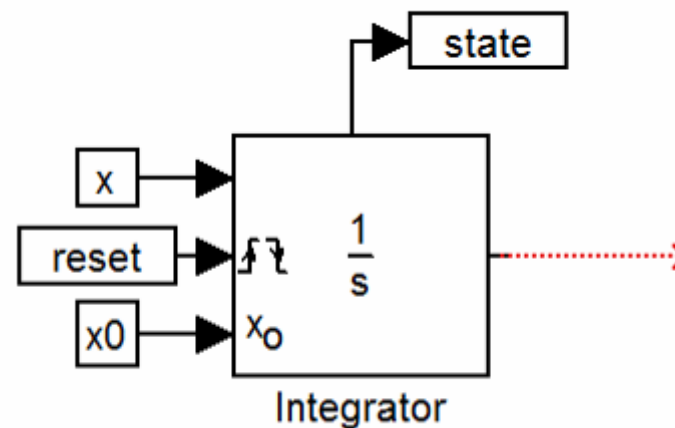
$$\begin{aligned} \dot{x}_1 &= x_2 \\ \dot{x}_2 &= -g \end{aligned}$$

$x_2 := -c x_2^-$

- $x_1$ : speed
- $x_2$ : acceleration
- $g$ : gravity force
- $c$ : ball elasticity constant

# Integrator Block in Simulink

- Integrator block accepts a reset port
- Whenever a reset is triggered, its new value will be taken from the initial value ( $x_0$ ) port
- State port holds previous value of  $x$
- State can be used to determine if the integrator needs to be reset ( $x^-$ )





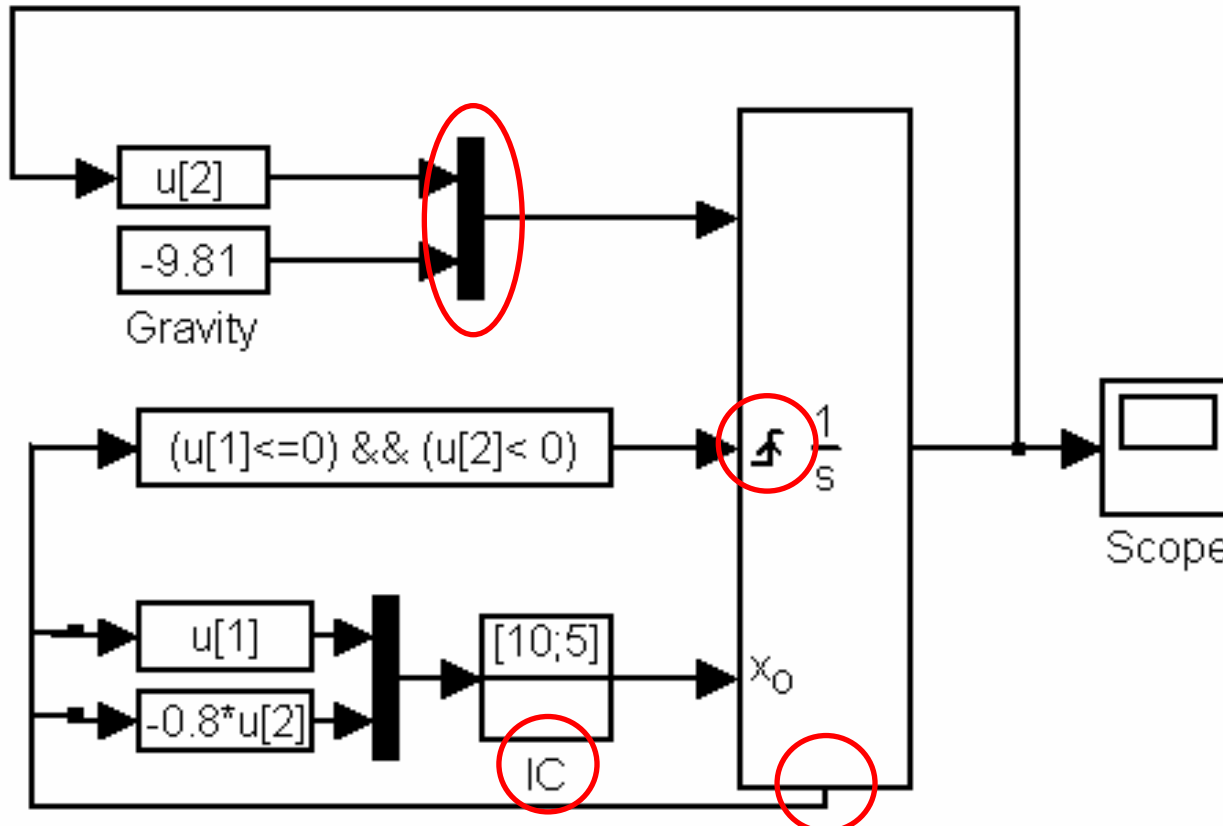
# ODEs with resets in Simulink

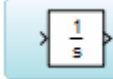

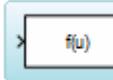
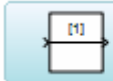
$$x_1 \leq 0 \ \& \ x_2 < 0 ?$$

$$\dot{x}_1 = x_2$$

$$\dot{x}_2 = -g$$

$$x_2 := -c x_2^-$$

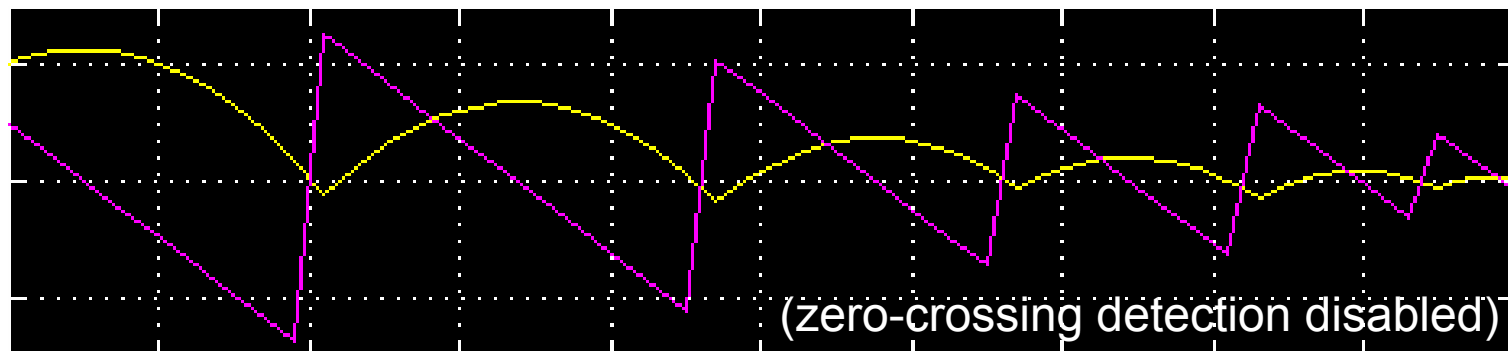
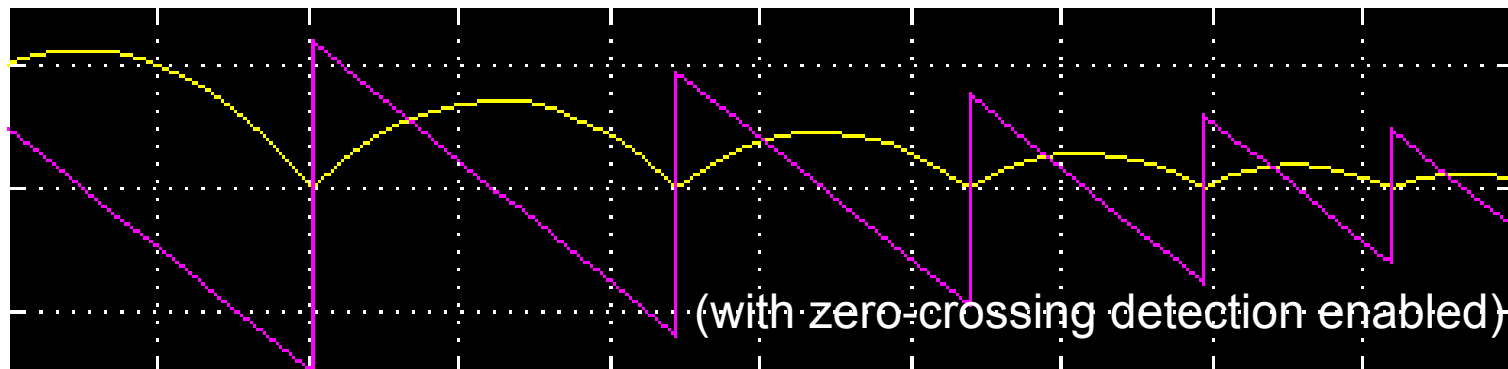


-  Integrator
-  Scope
-  Fcn
-  IC
-  Mux



## ODEs with resets in Simulink (3)

- Simulink ODE solver detects zero-crossing behaviour
- When a reset is detected, the solver goes “back in time” to determine where the reset occurred



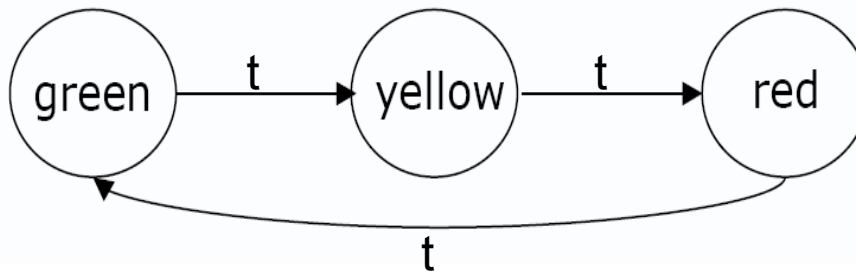


3.

# Finite State Machines

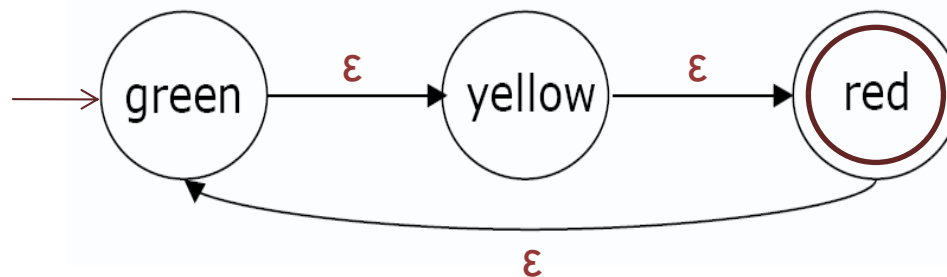
# Finite State Machines (FSMs)

- Model of systems whose behavior can be modeled as a set of states and transitions between states. These systems are sometimes called reactive systems.
- Finite number of states
- Systems modeled by FSMs:
  - Pattern recognition
  - ATMs
  - Computational processes
  - Human intelligence?



# Mathematical Model of FSMs

- A FSM is a quintuple  $(\Sigma, S, s_0, \delta, F)$ , where:
  - $\Sigma$  is an input alphabet (finite set of symbols)
  - $S$  is a finite, non-empty, set of states
  - $s_0$  is the initial state, where  $s_0 \in S$
  - $\delta$  is a state-transition function:  $\delta: S \times \Sigma \rightarrow S$
  - $F$  is a finite, (possibly empty) set of final states



$$\Sigma = [\varepsilon]$$

$$S = [\text{green}, \text{yellow}, \text{red}]$$

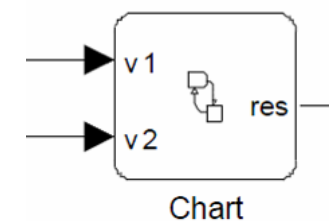
$$s_0 = \text{green}$$

$$\delta = [\text{green}/\varepsilon \rightarrow \text{yellow}, \text{yellow}/\varepsilon \rightarrow \text{red}, \text{red}/\varepsilon \rightarrow \text{green}]$$

$$F = [\text{red}]$$

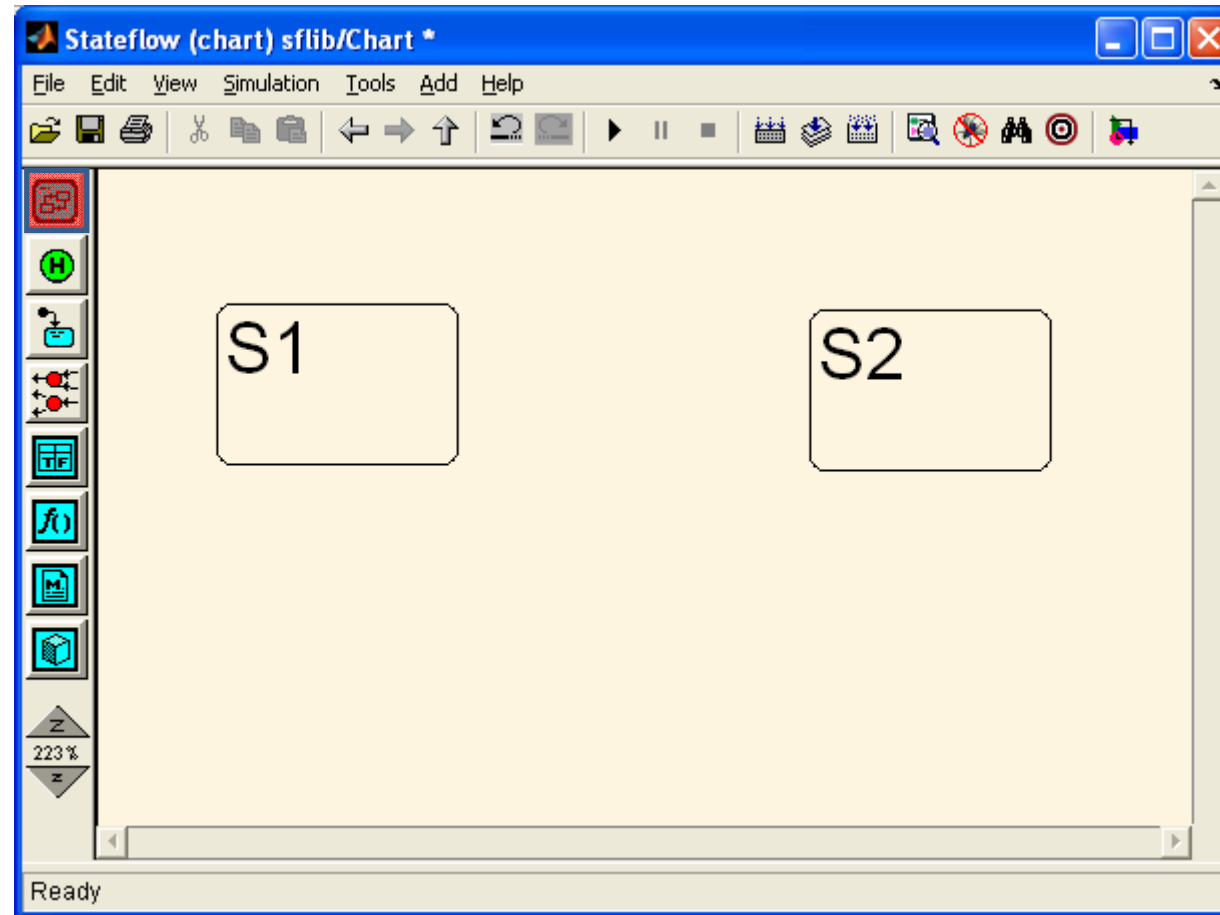
## Simulation of FSMs - StateFlow

- Simulink block (toolbox) for modeling Finite State Machines
- Stateflow charts receive inputs from Simulink and provide outputs (signals, events)
- Simulation advances with time
- Hybrid state machine model that combines the semantics of Mealy and Moore charts with the extended Stateflow chart semantics.



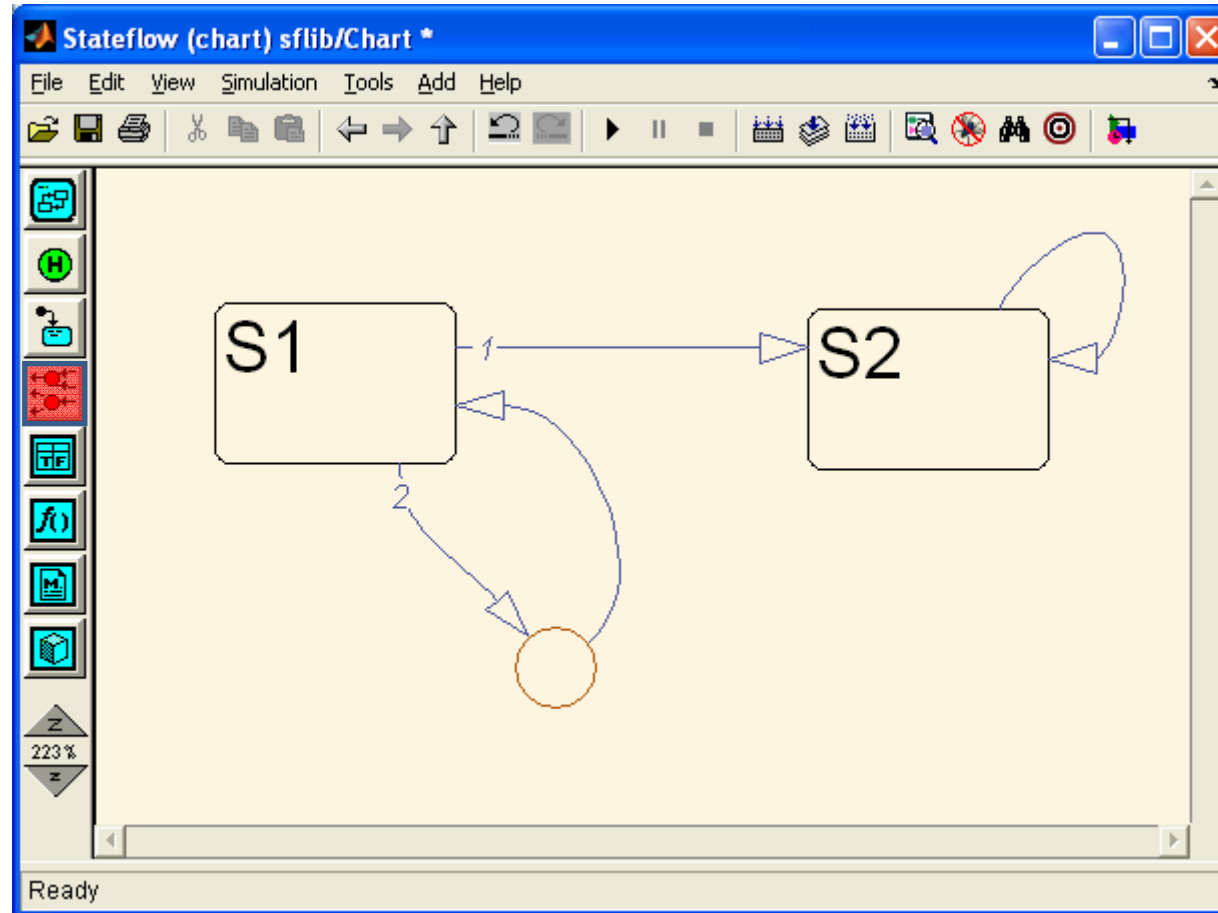


# StateFlow – States



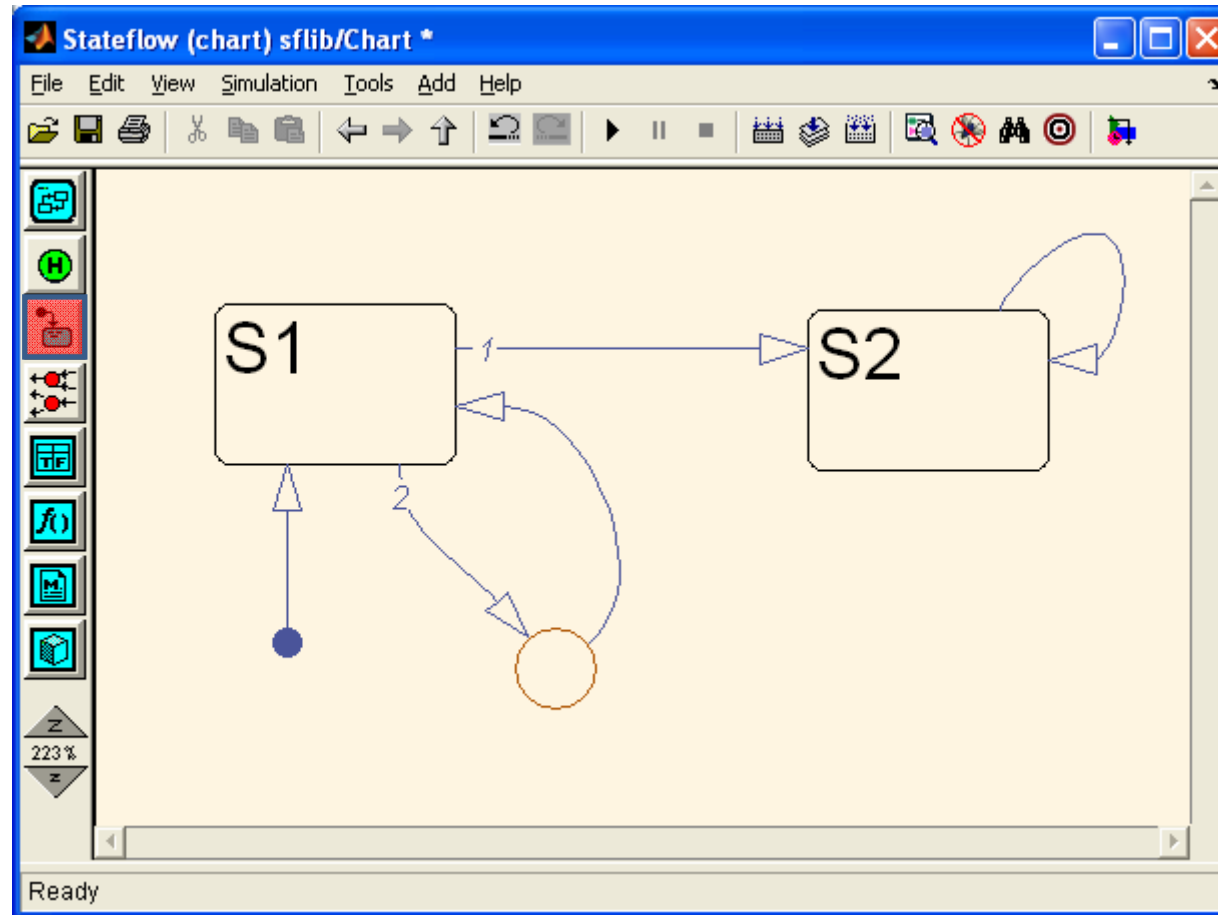


# StateFlow – Transitions





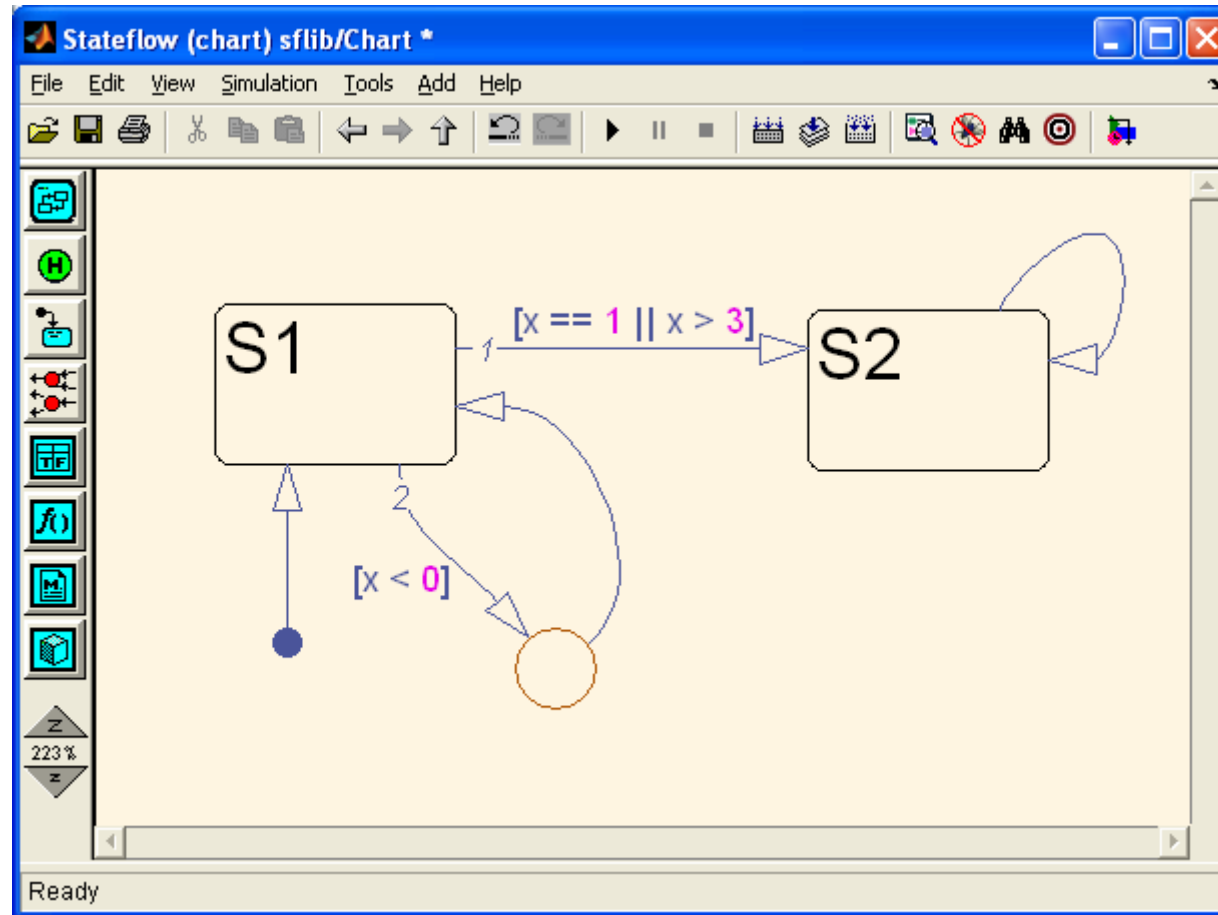
# StateFlow – Initial State



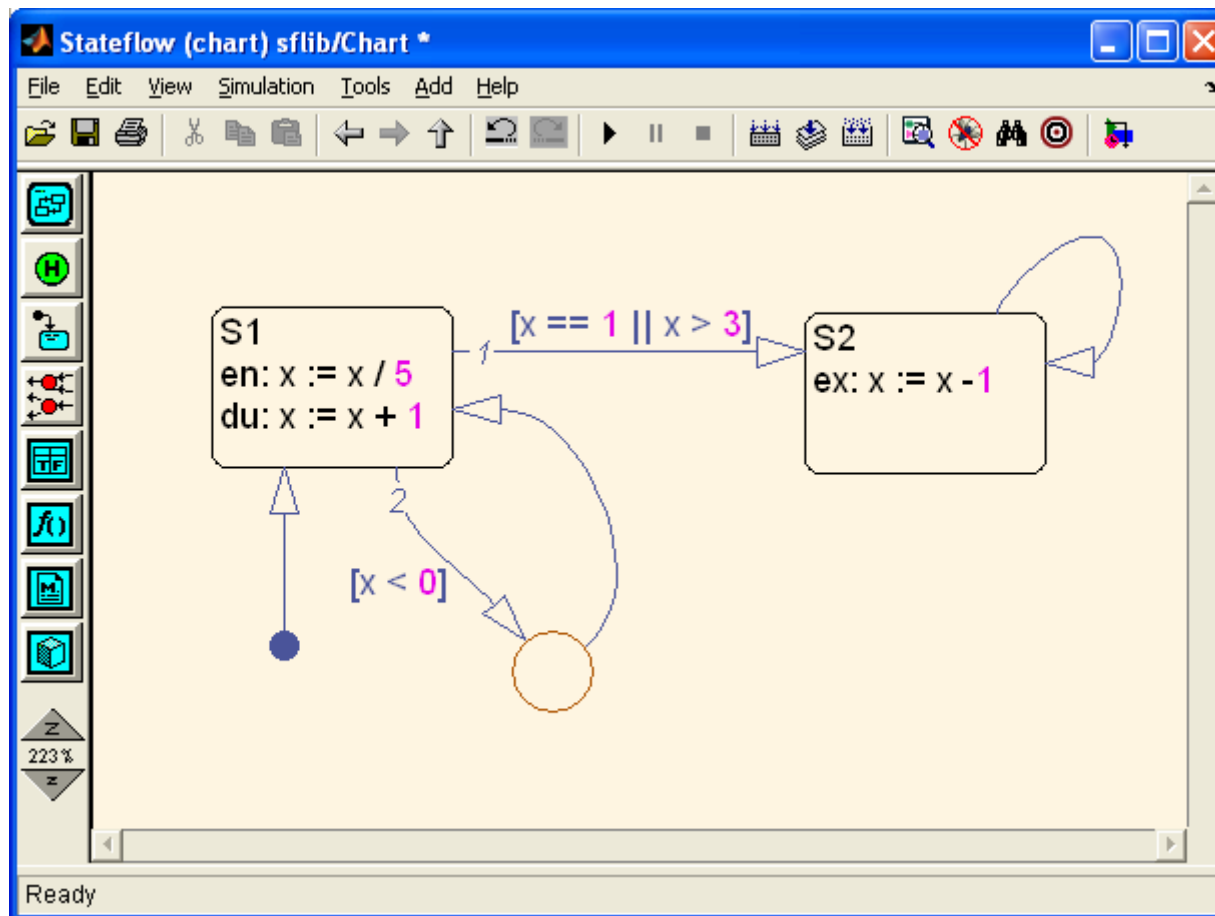




# StateFlow – Transition Conditions



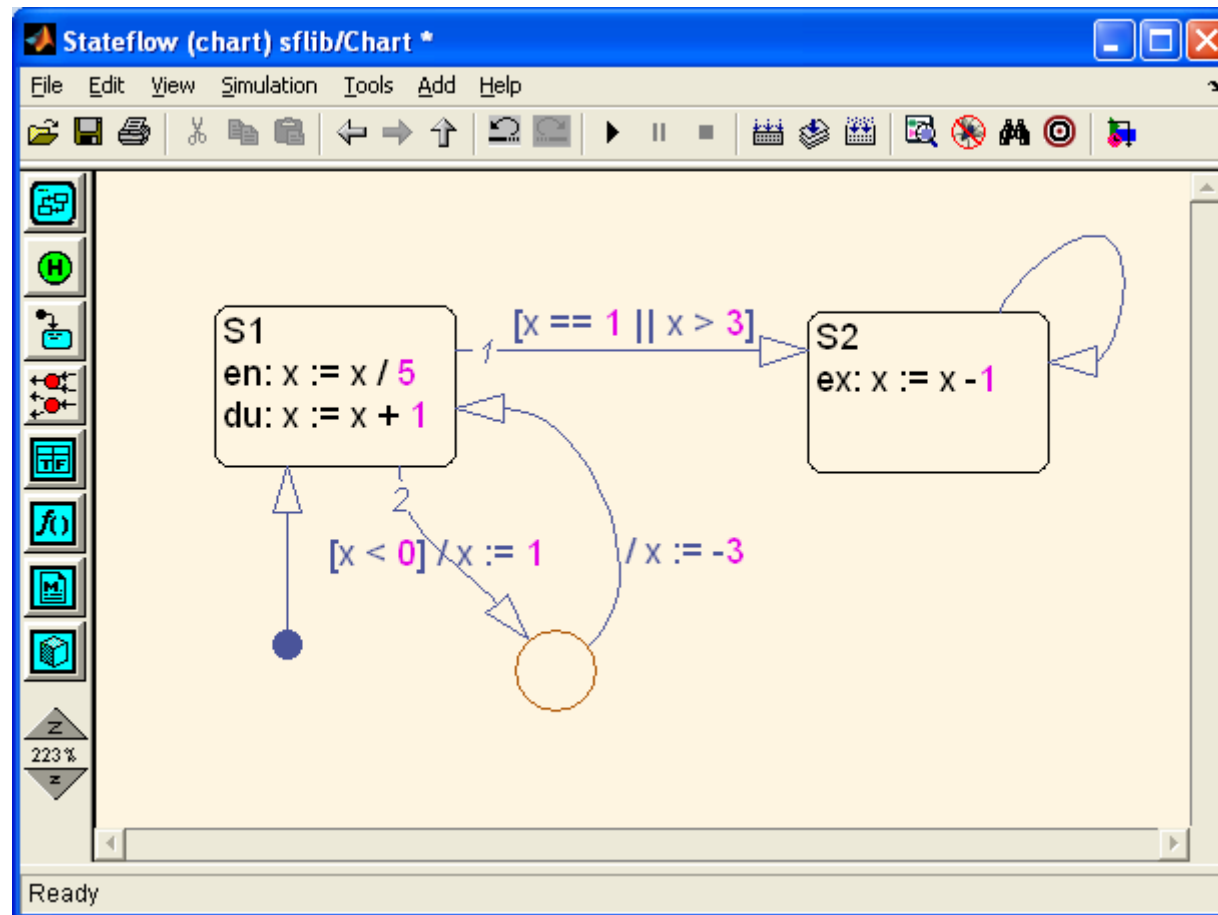
# StateFlow – State Actions



**entry:** Quando entra no estado, **during:** enquanto está no estado, **exit:** quando sai do estado

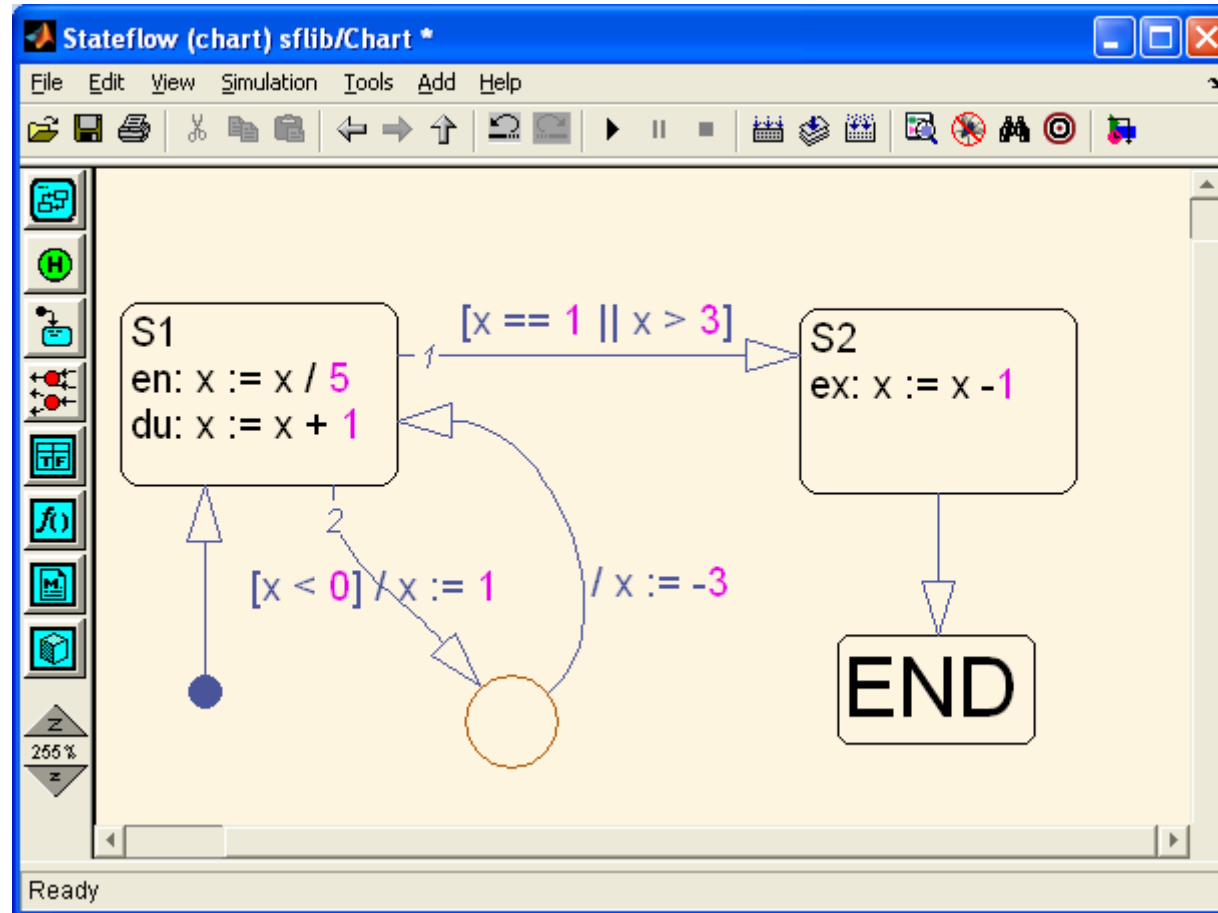


# StateFlow – Transition Actions



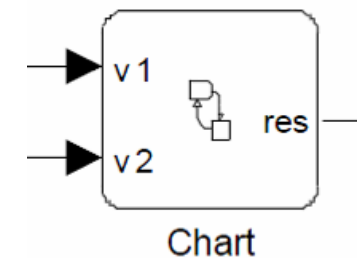


# StateFlow – Final States



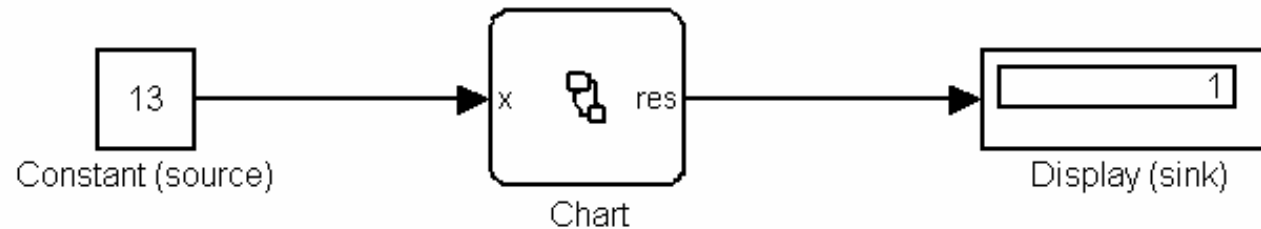
# Stateflow integration with Simulink

- User defines variables to be used inside Stateflow chart
- Variable types are important!
- Variables may be:
  - Inputs from Simulink
  - Outputs to Simulink
  - Local, Constant, ...
- To define variables use Model Explorer (Ctrl-R)



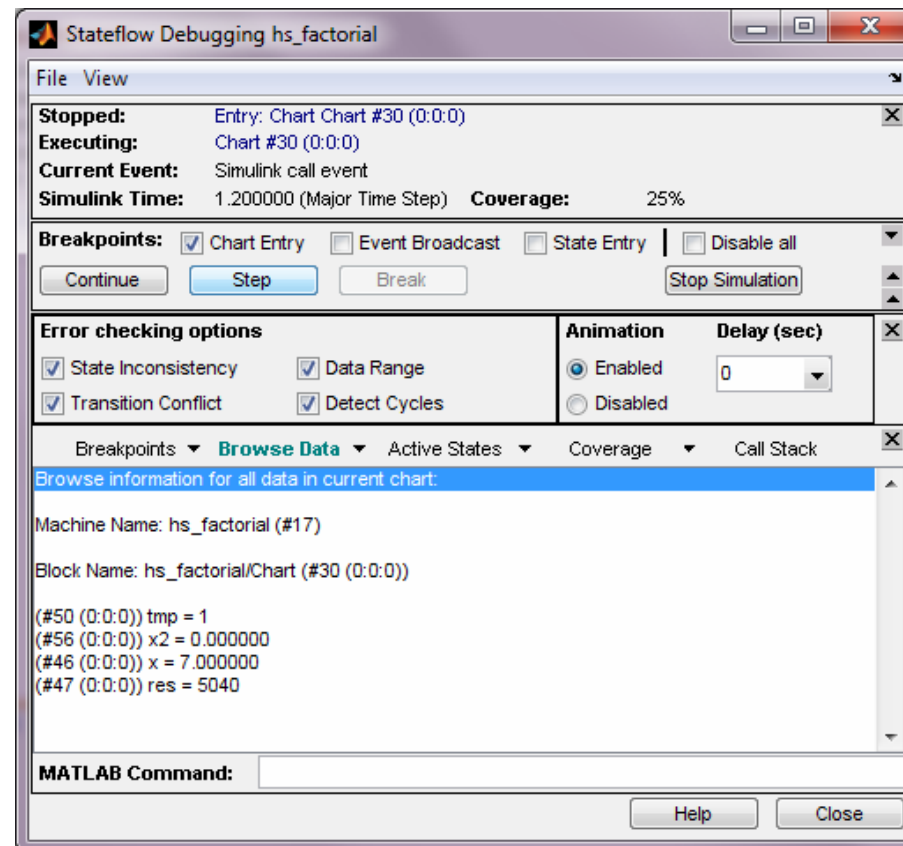
# Simulink/Stateflow Hands-on

- Create a stateflow chart that calculates the factorial of a number (*uint32*), given as input



# Stateflow Debugger

- Use “step” to execute the FSM step-by-step
- Use “browse data” to monitor variable changes





4.

# Discrete Event Systems

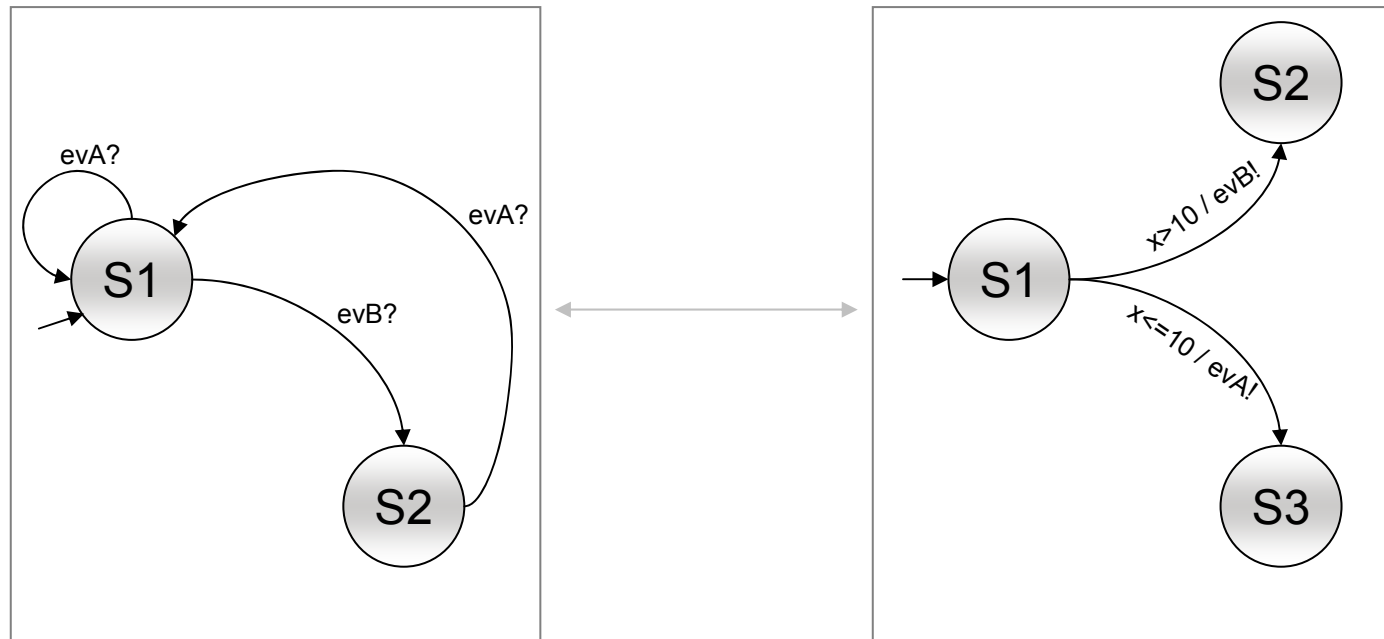




# Discrete Event Systems

- Discrete and qualitative changes
- State transitions caused by occurrence of asynchronous discrete events
- Parallel execution of multiple systems
- Synchronization by event-passing

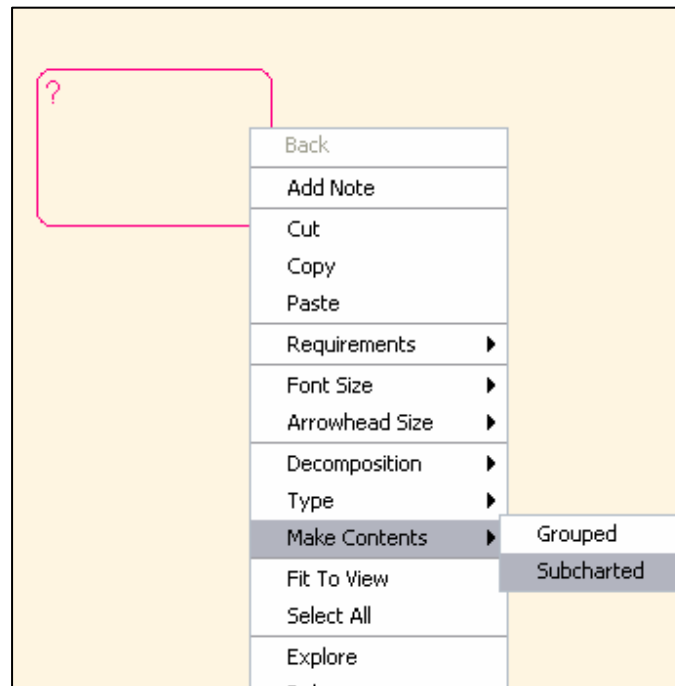
# DES Example



- Synchronization through events
- Parallel execution
- receive? / broadcast!

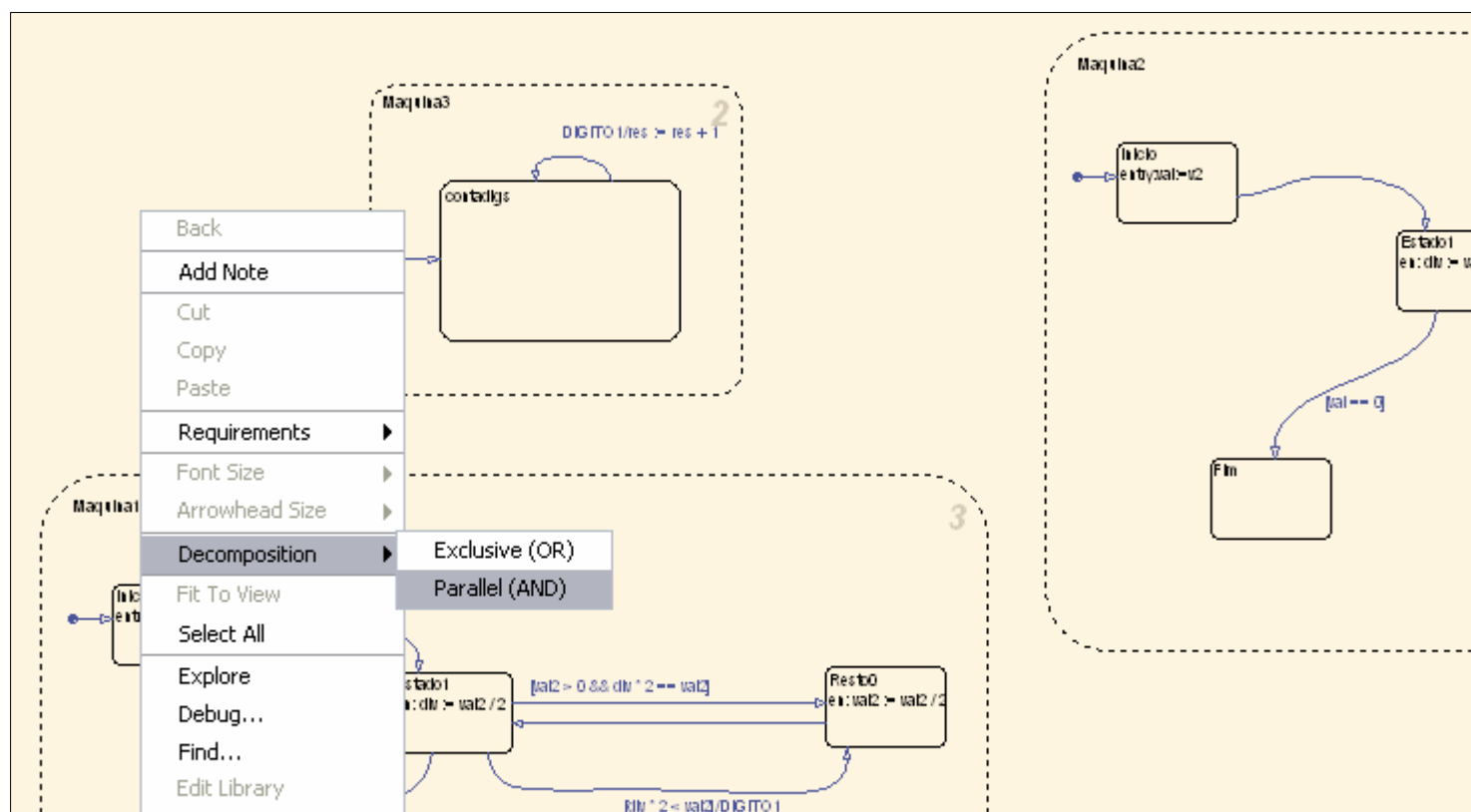
# Machine composition in Stateflow

- Grouped: Inner states are visible
- Subcharted: Creates a sub-chart
- Default behavior: sub-chart is executed

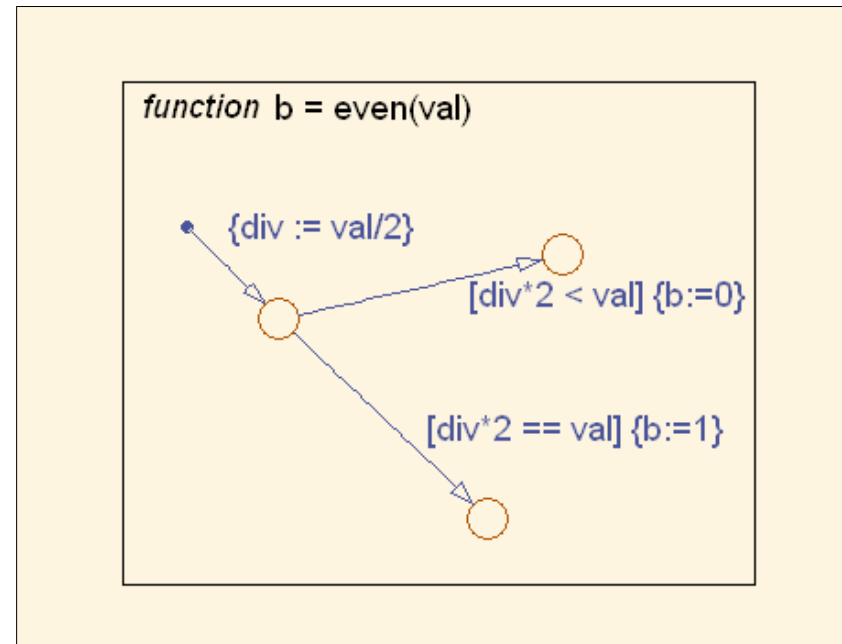




# Parallel composition in Stateflow

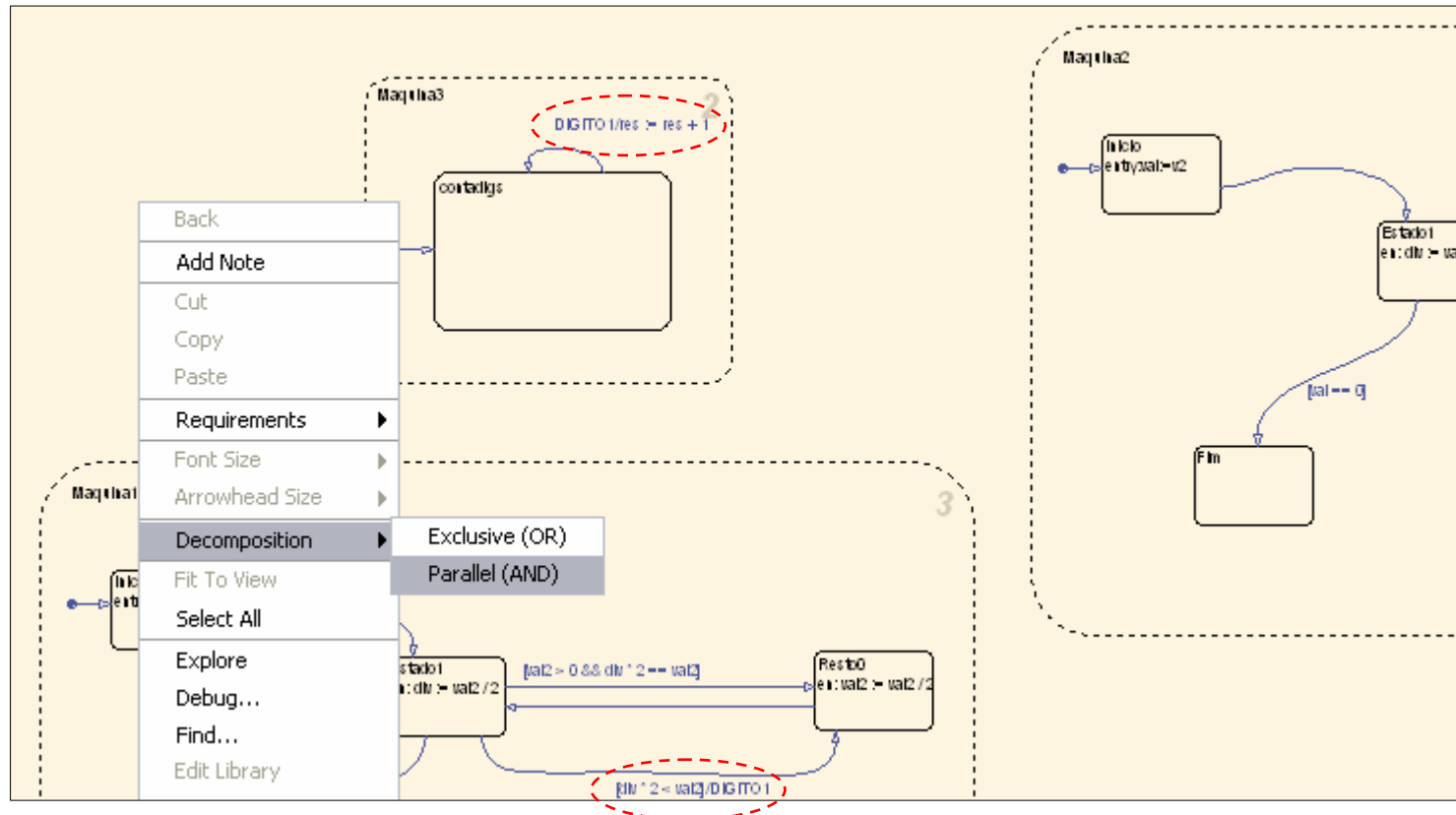



# Composition: Graphical functions



- `[even(x)]` and `[~even(x)]` are now valid conditions
- `{actions}` are called condition actions and are evaluated even when destination (state) is not valid

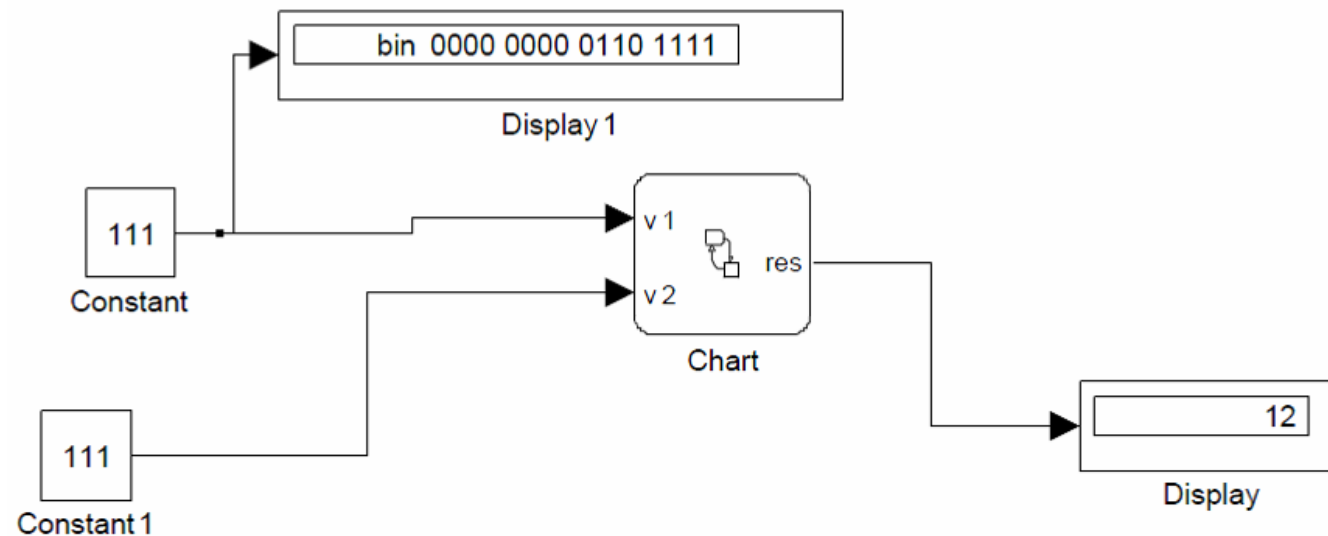
# Event passing in Stateflow



- Use Model Explorer to add Event data types 
- Events used both as conditions and actions

## DES in Stateflow Hands-on

- Create a stateflow chart that receives 2 inputs (uint32) and sums the number of 1 digits in their binary representation
- Use event passing to count all the 1 digits





4.

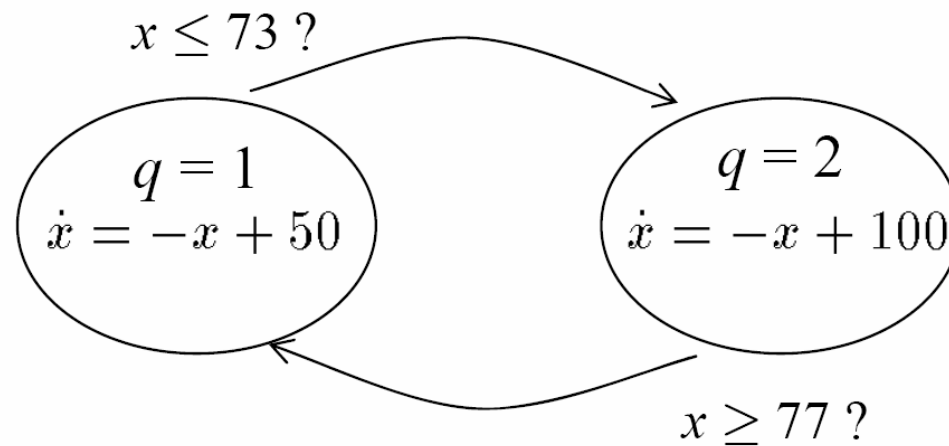
# Hybrid Automata





# Hybrid Automata

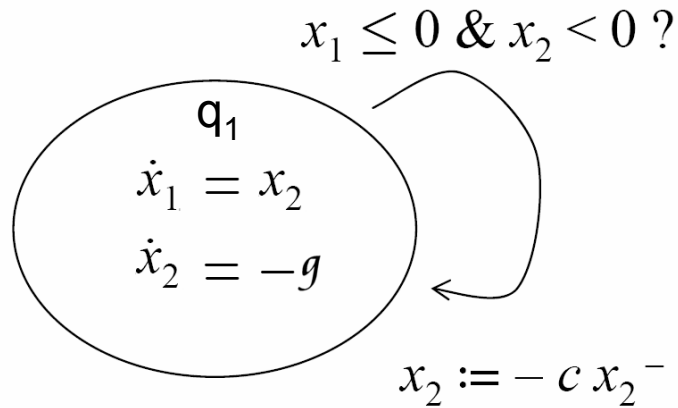
- $Q$   $\equiv$  set of discrete states
- $\mathbb{R}^n$   $\equiv$  continuous state-space
- $f: Q \times \mathbb{R}^n \rightarrow \mathbb{R}^n$   $\equiv$  vector field
- $\varphi: Q \times \mathbb{R}^n \rightarrow Q$   $\equiv$  discrete transition
- $\rho: Q \times \mathbb{R}^n \rightarrow \mathbb{R}^n$   $\equiv$  reset map



[Hespanha, J. P. 05]



# Bouncing Ball re-revisited



- $Q$   $\equiv$  set of discrete states
- $\mathbb{R}^n$   $\equiv$  continuous state-space
- $f: Q \times \mathbb{R}^n \rightarrow \mathbb{R}^n$   $\equiv$  vector field
- $\varphi: Q \times \mathbb{R}^n \rightarrow Q$   $\equiv$  discrete transition
- $\rho: Q \times \mathbb{R}^n \rightarrow \mathbb{R}^n$   $\equiv$  reset map

$$Q = \{q_1\}$$

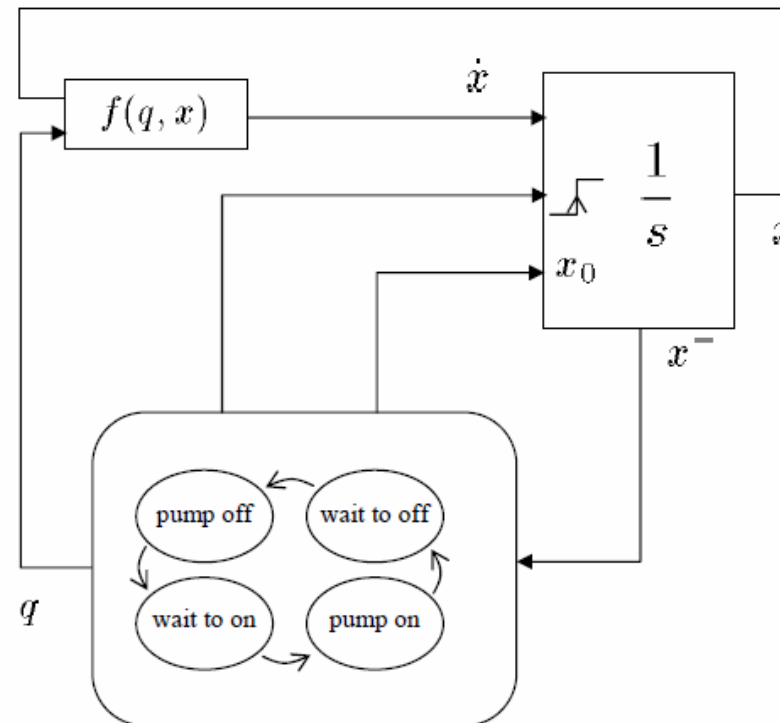
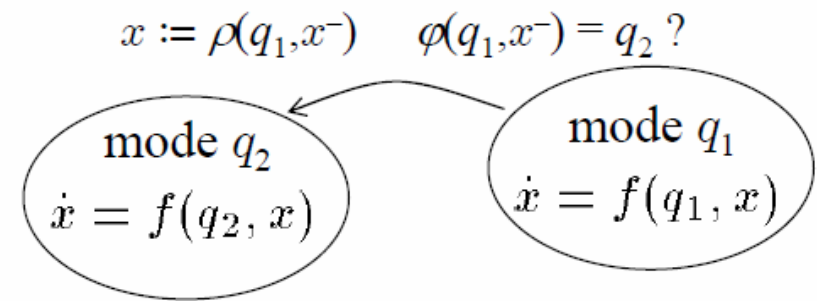
$$f(q, x_1, x_2) = \{q_1 \longrightarrow \dot{x}_1 := x_2, \dot{x}_2 := -g\}$$

$$\varphi(q, x_1, x_2) = \{q_1, x_1 \leq 0 \wedge x_2 < 0 \longrightarrow q_1\}$$

$$\rho(q, x_1, x_2) = \{q_1, x_1 \leq 0 \wedge x_2 < 0 \longrightarrow x_2 := -c \times x_2\}$$

# Simulation of Hybrid Automata

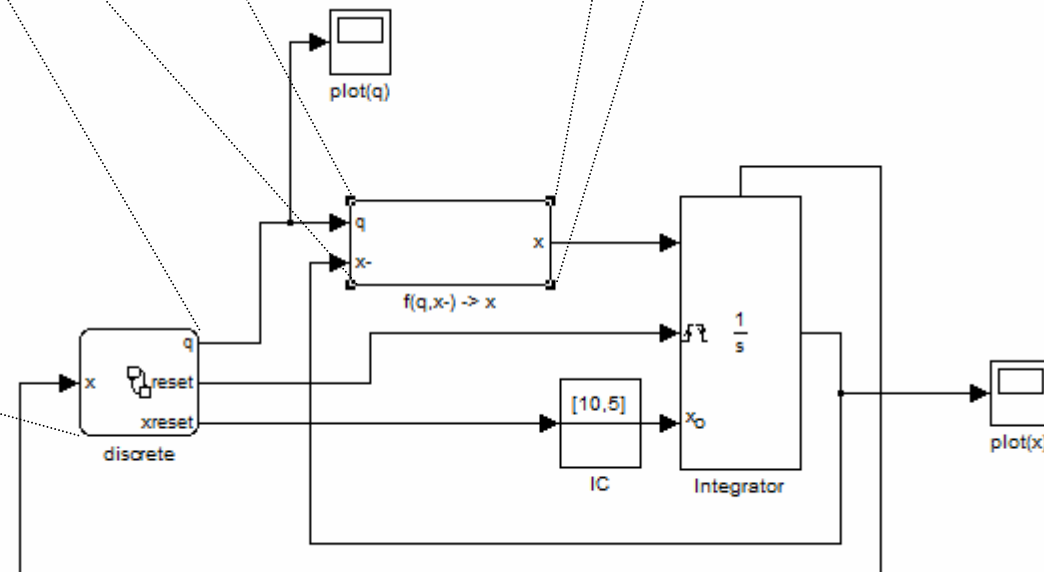
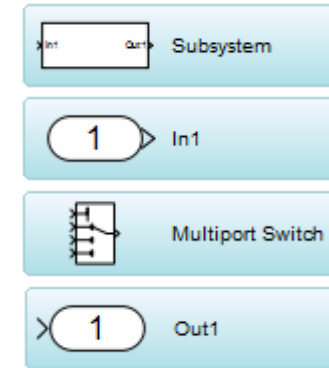
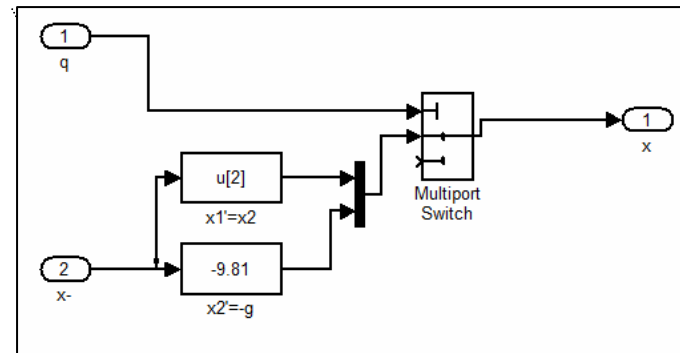
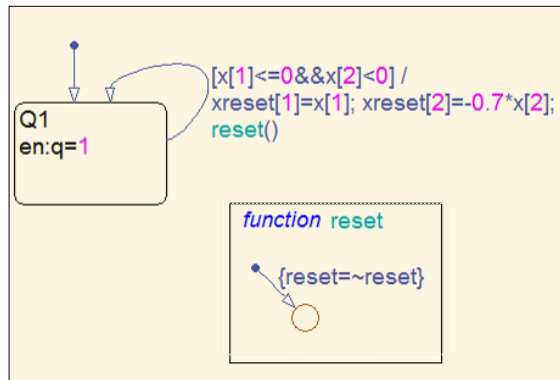
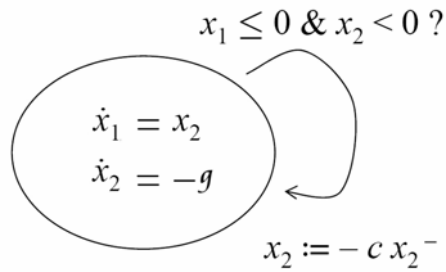
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[Hespanha, J. P. 05]

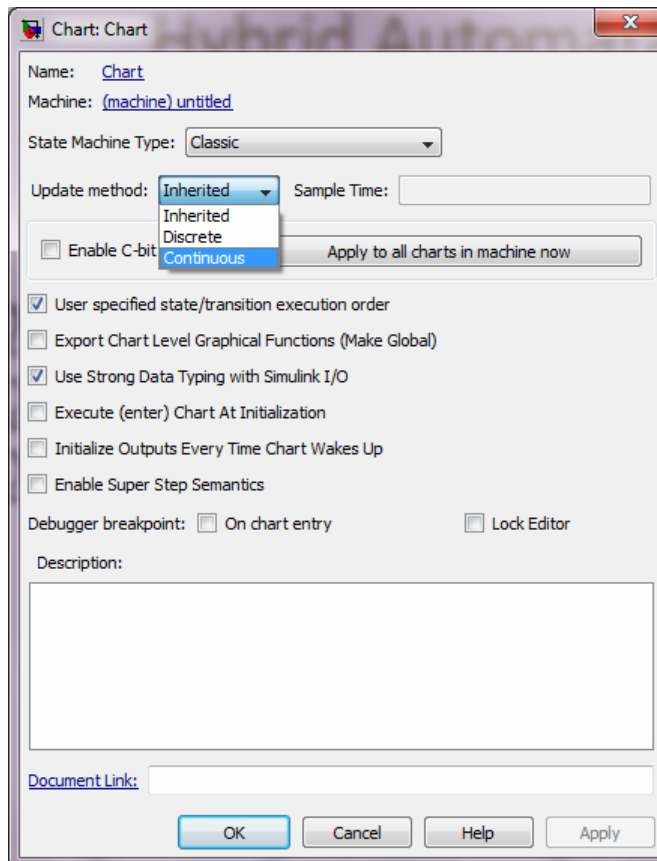


# Bouncing Ball in StateFlow



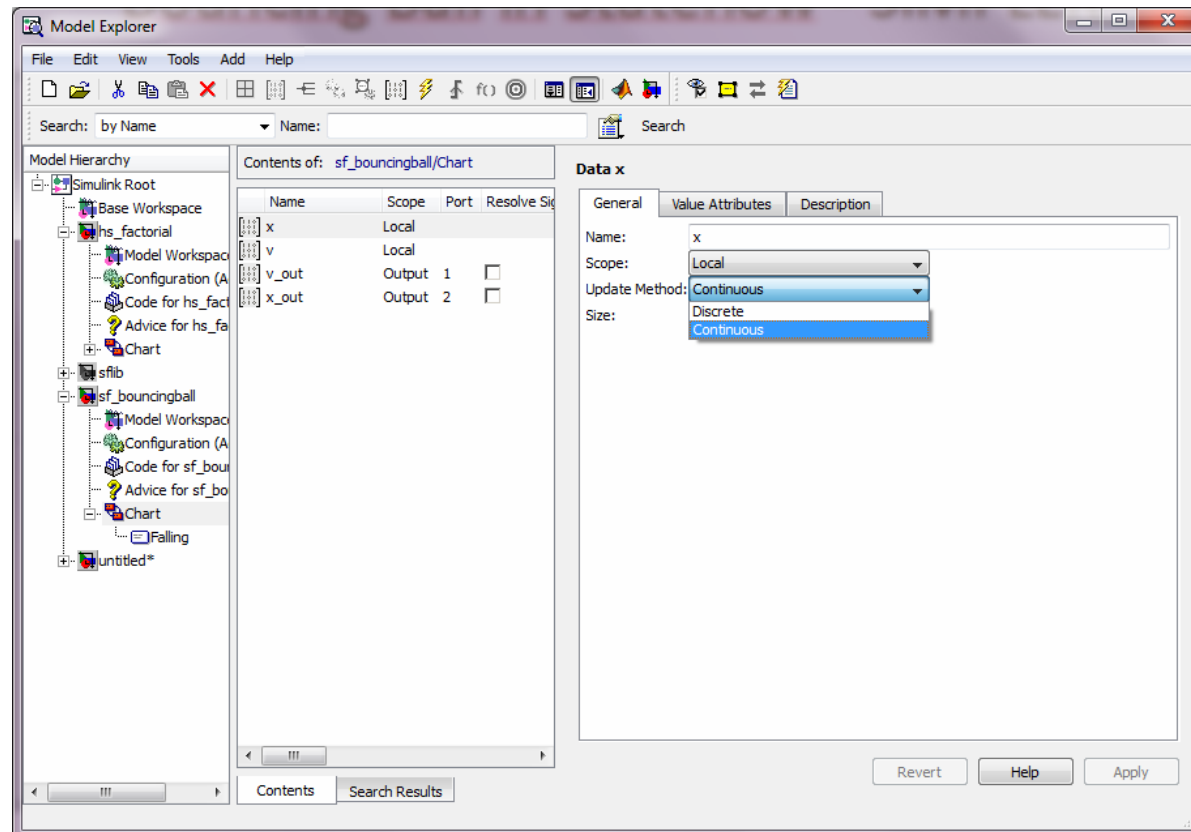
# Bouncing Ball in Stateflow - SIMPLER

- Go to “File->Chart properties” ...
- Select “Continuous” update method



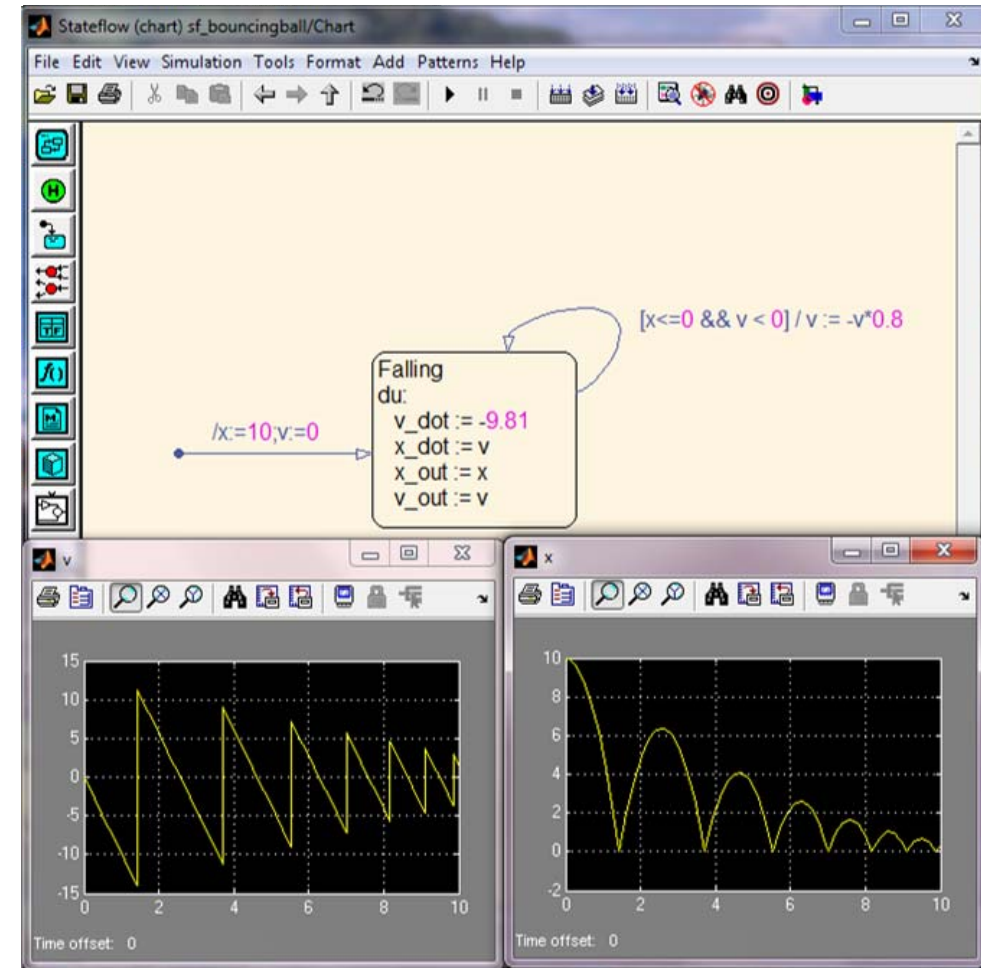
# Bouncing Ball in Stateflow - SIMPLER

- In Model Explorer you can now local variables of type double as continuous variables (update method)



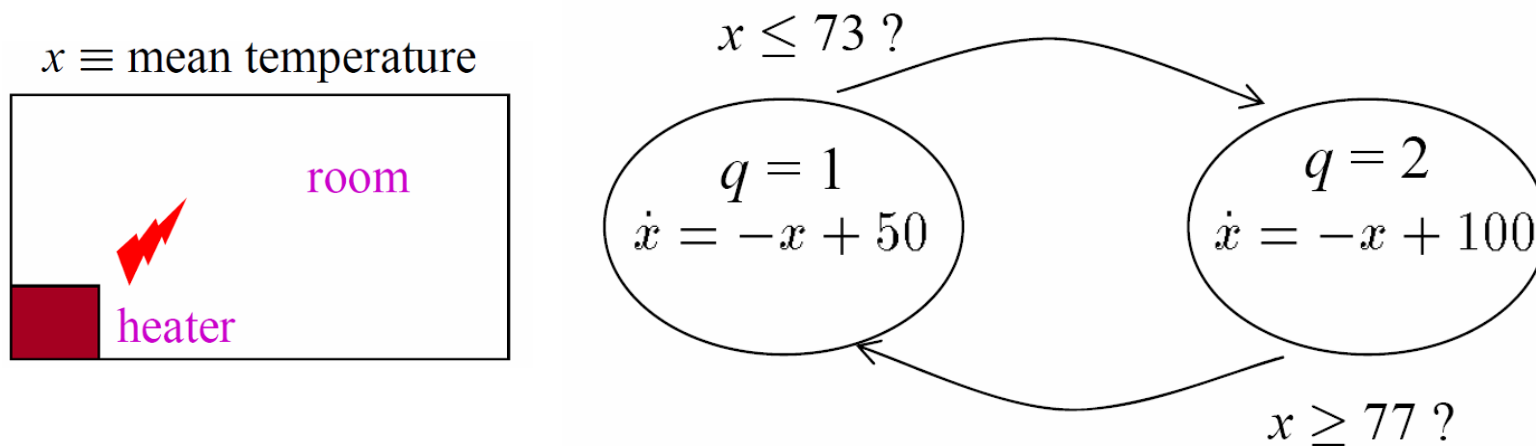
# Bouncing Ball in Stateflow - SIMPLER

- For each continuous local variable “x”...
- stateflow automatically defines “x\_dot”...
- which is derivative of “x”



# Exercise 1: Thermostat Hybrid System

$Q$   $\equiv$  set of discrete states  
 $\mathbb{R}^n$   $\equiv$  continuous state-space  
 $f: Q \times \mathbb{R}^n \rightarrow \mathbb{R}^n$   $\equiv$  vector field  
 $\varphi: Q \times \mathbb{R}^n \rightarrow Q$   $\equiv$  discrete transition  
 $\rho: Q \times \mathbb{R}^n \rightarrow \mathbb{R}^n$   $\equiv$  reset map



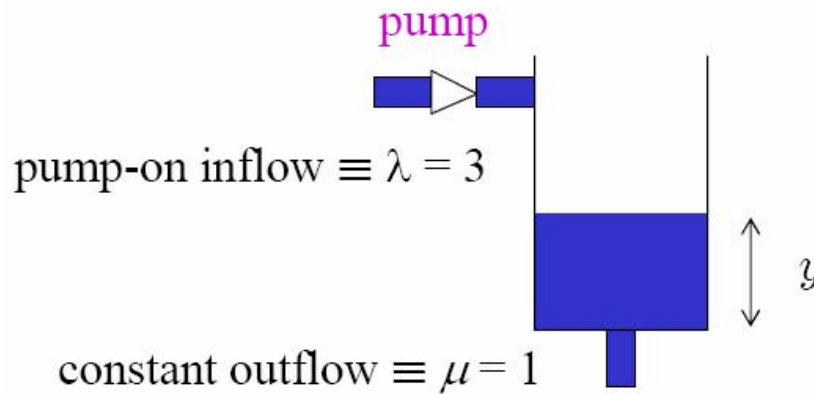
1. Define the HS formally
2. Simulate Hybrid System

[Hespanha, J. P. 05]



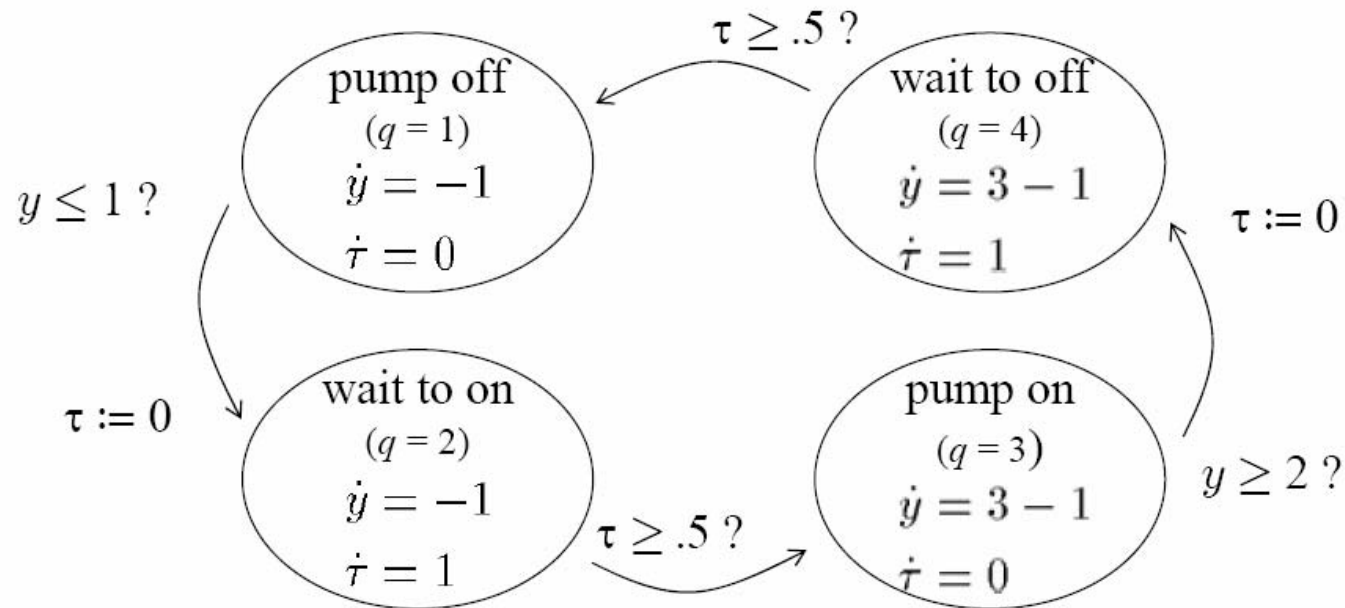


# Exercise 2: Tank Hybrid System



goal  $\equiv$  prevent the tank from emptying or filling up

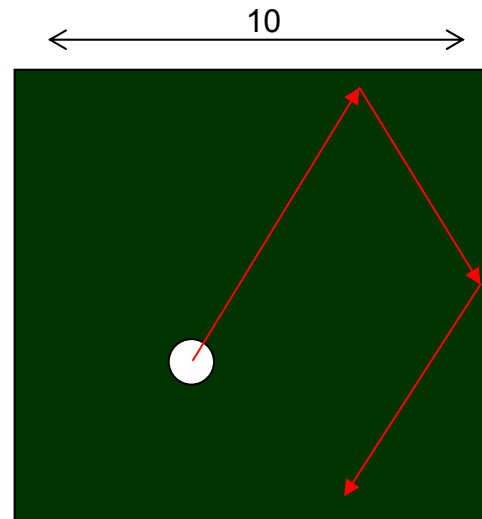
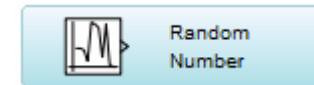
$\delta = .5 \equiv$  delay between command is sent to pump and the time it is executed

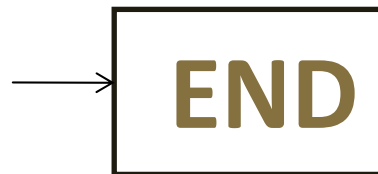


[Hespanha, J. P. 05]

## Exercise 3: Billiard Hybrid System

- Ball inside a 10x10 box
- Ball starts at unknown position  $(x,y)$  and with unknown velocity vector  $(v_x, v_y)$
- Ball bounces in any of the 4 walls
- Constant energy dissipation factor between 0 and 1





**References:**

- <http://www.ece.ucsb.edu/~hespanha/ece229/>
- [http://www.mathworks.com/access/helpdesk/help/pdf\\_doc/stateflow/sf\\_ug.pdf](http://www.mathworks.com/access/helpdesk/help/pdf_doc/stateflow/sf_ug.pdf)