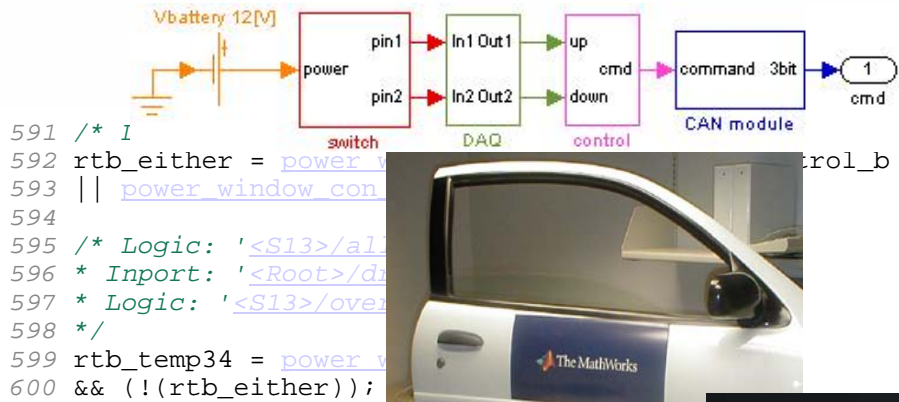
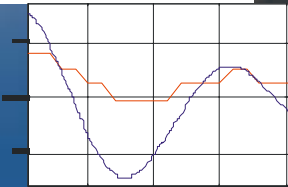


# Model-Based Design – What it is and what it still needs



Pieter J. Mosterman  
 pieter.mosterman@mathworks.com

Senior Research Scientist  
 The MathWorks



# Introduction

- Model-Based Design
  - Exploit computational models
  - Increasingly adopted in industry
- Underlying needs
  - Many different modeling formalisms
    - Syntax
    - Semantics
  - Relate and combine models
    - Different parts of a system
    - Different design stages of a system
- Open research topics ...

# Agenda

- Model-Based Design
- Computer Automated Multiparadigm Modeling
- Application
- Multi-formalism modeling
- Mixed-signal simulation
- Hybrid Dynamic Systems
- Summary

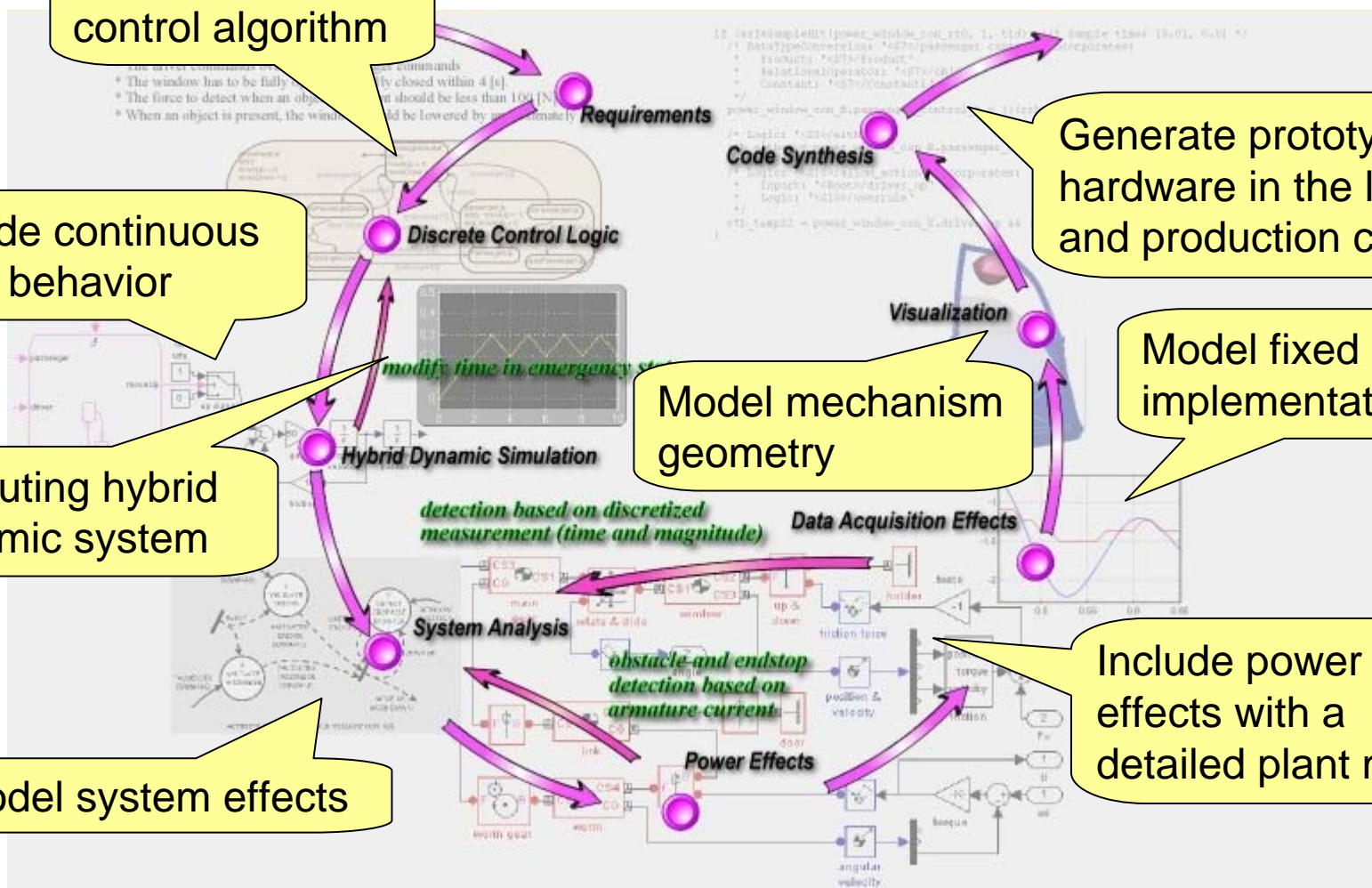
# Power Window Demo Summary

Model discrete control algorithm

Include continuous plant behavior

Executing hybrid dynamic system

Model system effects



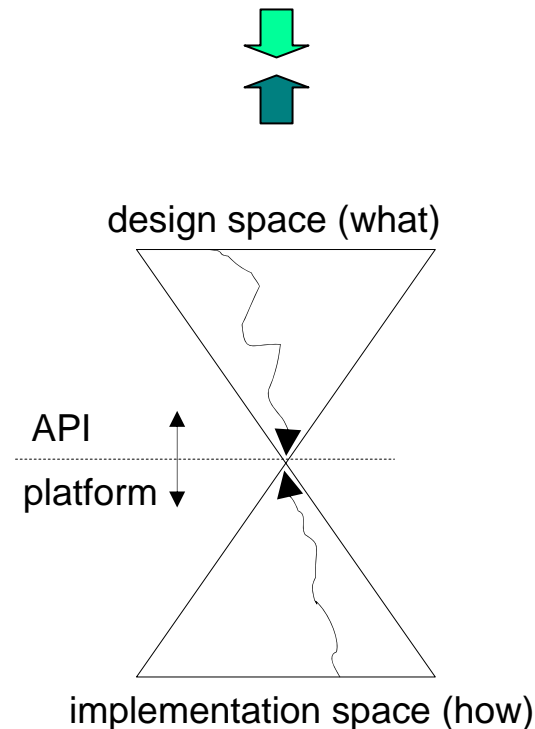
Generate prototype, hardware in the loop, and production code

Model fixed point implementation

Include power effects with a detailed plant model

# Design?

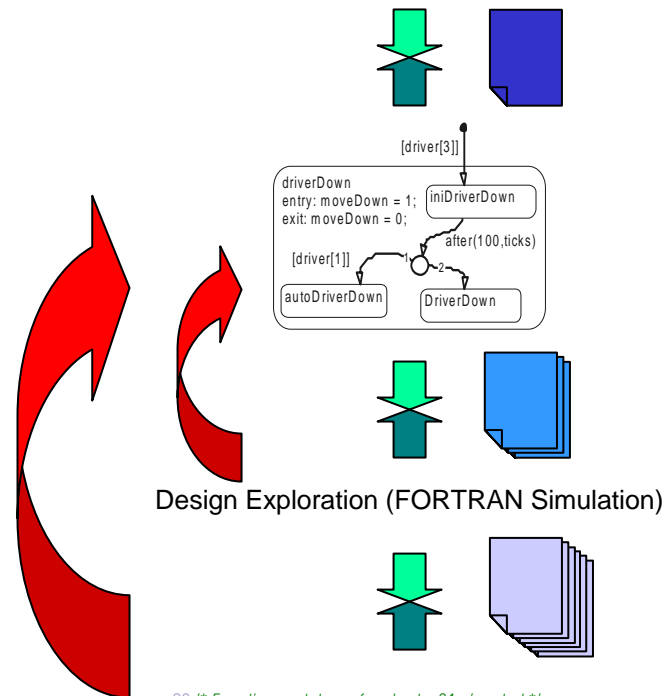
- Design of complex systems is a process of transaction
  - Requirements (what)
  - Specification (how)
- Platform-based design
  - Meet in the middle



# Typical Document-Based Design

- Results from each design stage are documented
- Specifications output of one stage are requirements input to the next
- Simulation requires programming of specification (e.g., FORTRAN)

The window has to be fully opened and fully closed within 4 [s].  
 The force to detect when an object is present should be less than 100 [N].



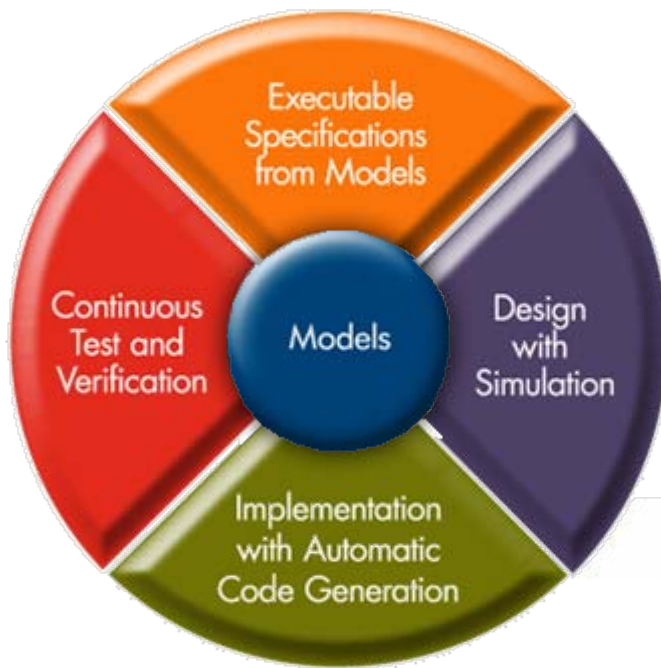
Design Exploration (FORTRAN Simulation)

```

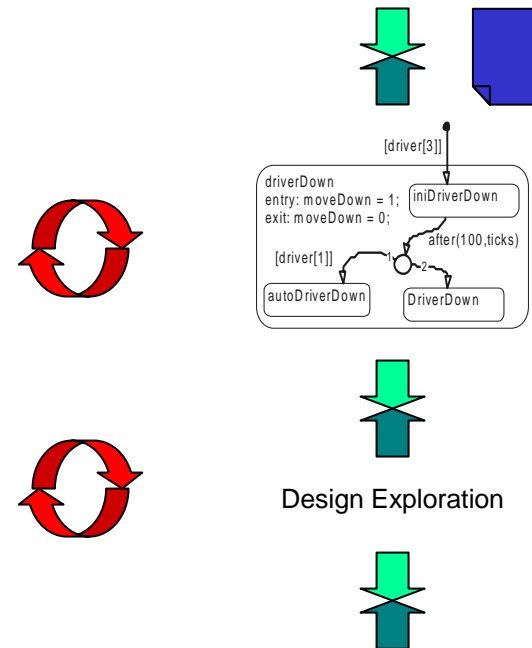
28 /* Function prototypes for chart <S1>|control */
29 static void exit_internal_c2_s2_safe(SFpower_window_con_rtw_c2InstanceStruct
30 *chartInstance);
31
32
33
34
35 #define IN_NO_ACTIVE_CHILD (0)
36 #define IN_c2_s1_emergencyDown 1
39 #define IN_c2_s7_driverNeutral 2
591 /* Logic: '<S3>|either */
592 rtb_either = power_window_con_B.passenger_control_b
593 || power_window_con_B.passenger_control_a;
    
```

# Model-Based Design

- Share in computational form



The window has to be fully opened and fully closed within 4 [s].  
 The force to detect when an object is present should be less than 100 [N].

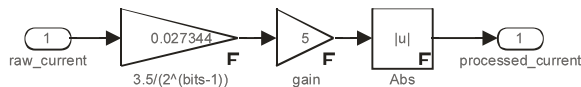
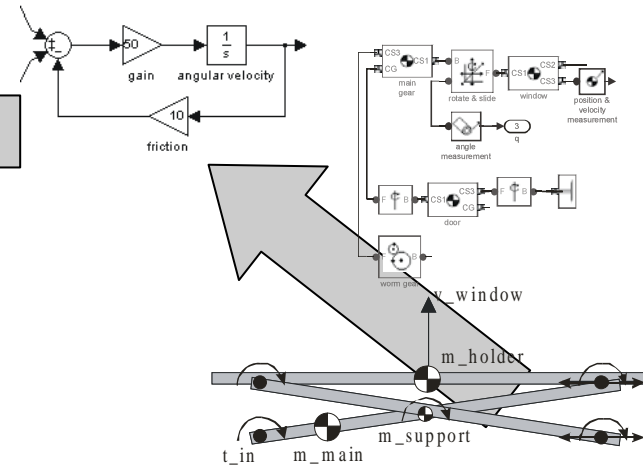
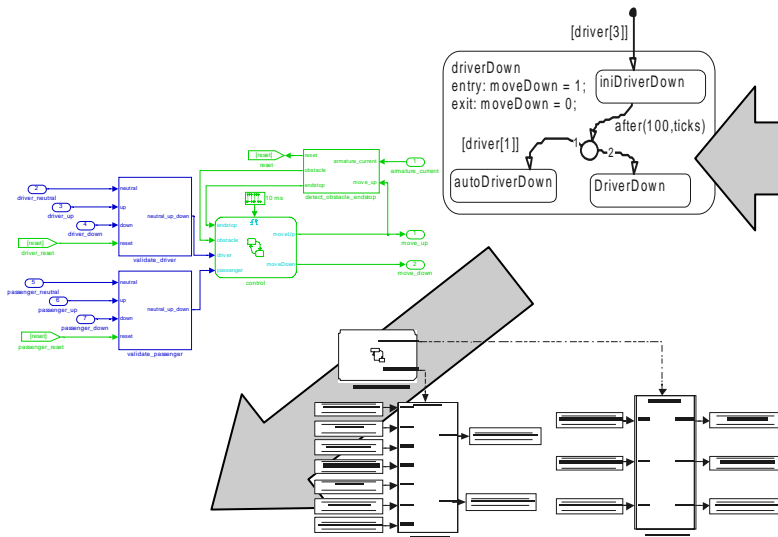


```

28 /* Function prototypes for chart <S1>|control */
29 static void exit_internal_c2_s2_safe(SFpower_window_con_rtw_c2InstanceStruct
30 *chartInstance);
34
35 #define IN_NO_ACTIVE_CHILD (0)
36 #define IN_c2_s1_emergencyDown 1
39 #define IN_c2_s7_driverNeutral 2
591 /* Logic: '<S3>|either' */
592 rtb_either = power_window_con_B.passenger_control_b
593 || power_window_con_B.passenger_control_a;
    
```



# Where are the models?

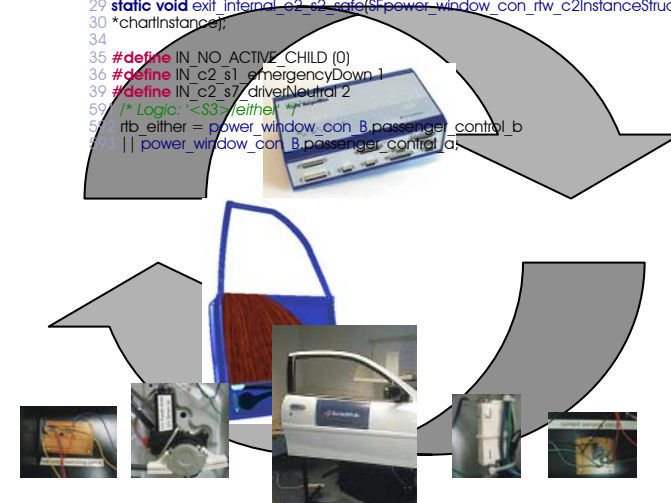


```

28 /* Function prototypes for chart <S1>/control */
29 static void exit_internal_c2_s2_safeSFpower_window_con_rtw_c2InstanceStruct
30 *chartInstance);
31 static void
32 exit_internal_c2_s7_driverNeutral(SFpower_window_con_rtw_c2InstanceStruct
33 *chartInstance);
34
35 #define IN_NO_ACTIVE_CHILD (0)
36 #define IN_c2_s1_emergencyDown 1
37 #define IN_c2_s7_driverNeutral 2
591 /* Logic: '<S13>/Driver */
592 rtb_either = power_window_con_B.passenger_control_b
593 || power_window_con_B.passenger_control_a;
594
595 /* Logic: '<S13>/follow action incorporates */
596 /* Logic: '<S13>/override */
597 */
598 */
599 rtb_temp34 = power_window_con_U.driver_up
600 && (!(rtb_either));
    
```

```

28 /* Function prototypes for chart <S1>/control */
29 static void exit_internal_c2_s2_safeSFpower_window_con_rtw_c2InstanceStruct
30 *chartInstance);
31
32 #define IN_NO_ACTIVE_CHILD (0)
33 #define IN_c2_s1_emergencyDown 1
34 #define IN_c2_s7_driverNeutral 2
591 /* Logic: '<S3>/either */
592 rtb_either = power_window_con_B.passenger_control_b
593 || power_window_con_B.passenger_control_a;
    
```





# Benefits of a computational form

- Simulate a design immediately
  - Try out different ideas quickly
  - Combine with partially detailed design **Combine semantics!**
  - Allow sharing of design decisions across stages
  - Domain-specific languages can easily be developed
- Automatic model processing
  - Style guideline enforcing (automatic fixing) **Style specification; static semantics!**
  - Data type inference
- Static checking of dynamics
- Test bench generation **Coverage test suites; prover complexity!**
- Digital linking to other documents **Consistency and inconsistency!**
- Model transformation **Correctness!**
  - Allows one reference model
  - Choose best representation for given analysis **Performance evaluation!**
  - Automate synthesis
  - Automate optimization
  - Automate design?! **Architecture modeling!**

# Agenda

- Model-Based Design
- **Computer Automated Multiparadigm Modeling**
- Application
- Multi-formalism modeling
- Mixed-signal simulation
- Hybrid Dynamic Systems
- Summary

# Computer Automated Multiparadigm Modeling

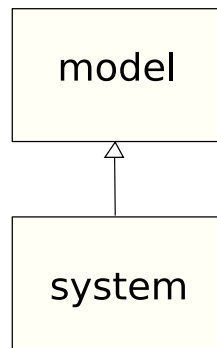
- Computer Automated Multiparadigm Modeling (CAMPaM)
  - Annual McGill Bellairs workshop
- Three elements of CAMPaM
  - Multi-formalism modeling
  - Metamodeling
  - Multiple levels of abstraction
- Model model transformation
  - Graph grammars
  - ...

# What is a model anyway?

Jean Bézivin



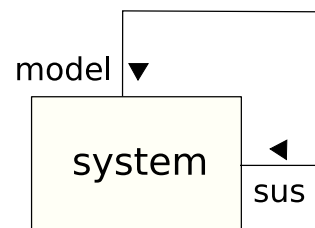
Everything is a model !



Jean-Marie Favre



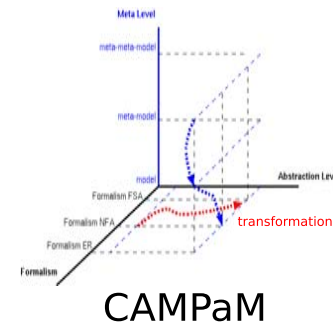
Nothing is a model !



Hans Vangheluwe



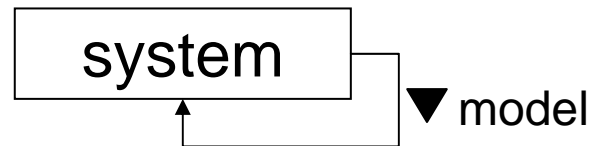
Model everything !



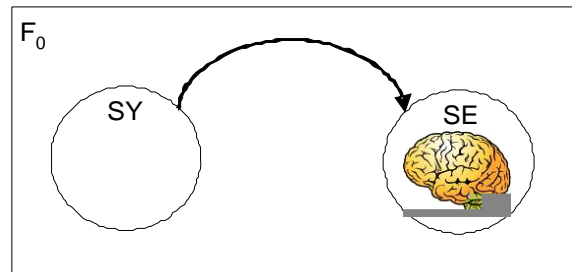
*Acknowledgment: picture, courtesy of Hans Vangheluwe*

# Nothing is a model

- A system that represents a system



- Representation in a formalism
- Formally define a formalism (Ogden-Richards triangle of semiotics)
  - Abstract syntax
  - Semantic domain



# Syntax versus Semantics

- Fasten seat belt syntax



- Fasten semantics ...

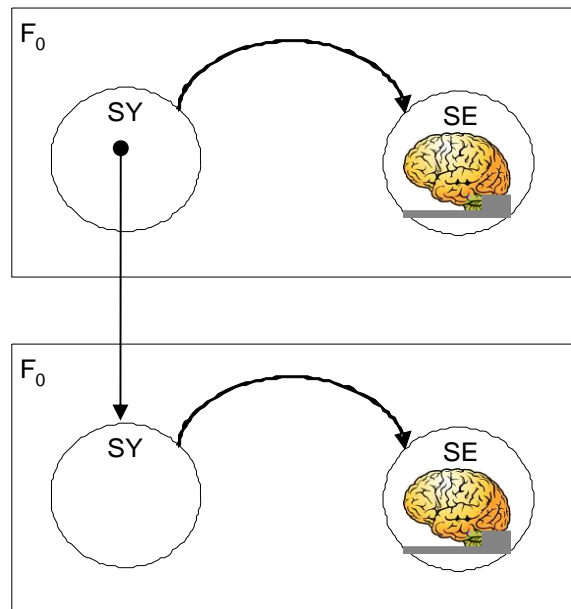


- ... or open semantics?



# Defining a formalism

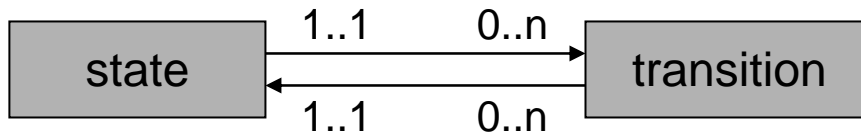
- The syntax can be defined by
  - Enumeration
  - A model of the modeling formalism: a 'meta' model
    - For example, a grammar



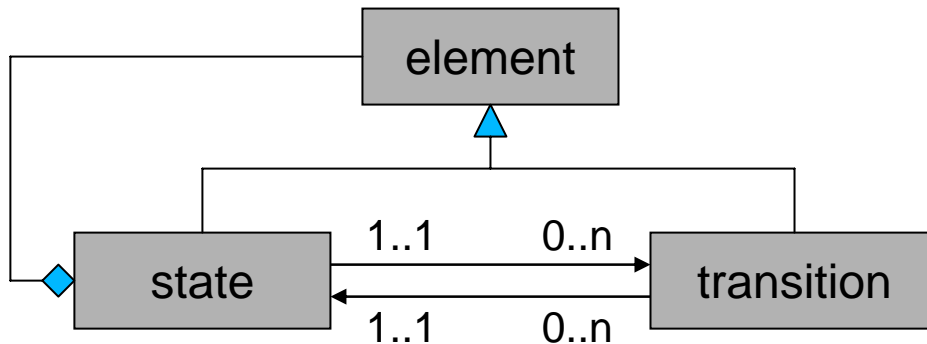


# A metamodel

- State transition diagram

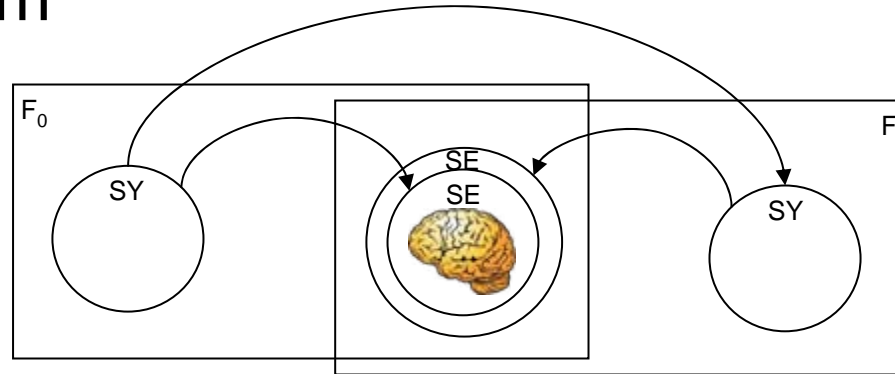


- Automatically generate an editor
- Add hierarchy and regenerate new editor



# Defining semantics

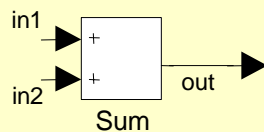
- Define semantics of a new formalism by mapping the abstract syntax onto defined formalism
- The semantic domain to be defined needs to be subsumed by the semantic domain of the defining formalism



- Model the transformations!
  - Graph rewriting

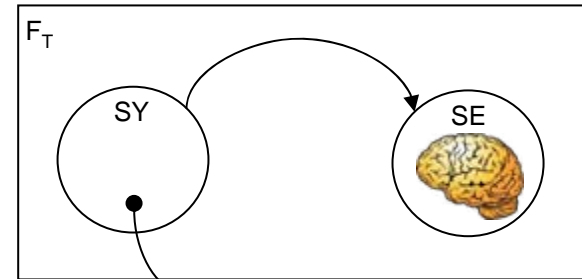
# Model everything

- Reasoning vs. efficiency
  - Operationally
  - Denotationally
- Semantic anchoring
  - Abstract state machines
  - DEVS
  - Haskell

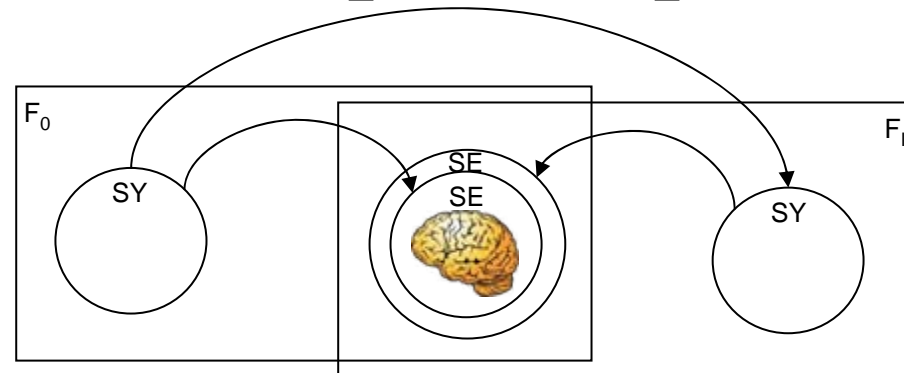


```

----- LHS
c AddAdd = c BinaryOp (+)
f Sum = c AddAdd
y Sum out = f Sum (u Sum in1, u Sum in2)
----- RHS
    
```

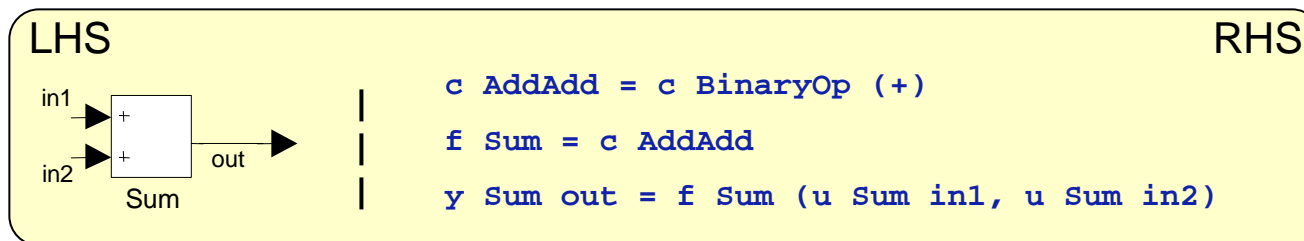


$$T \Rightarrow \left[ \begin{array}{c|c|c|c} \downarrow & \downarrow & \dots & \downarrow \\ L & R & & L \\ \hline & & & R \end{array} \right]$$

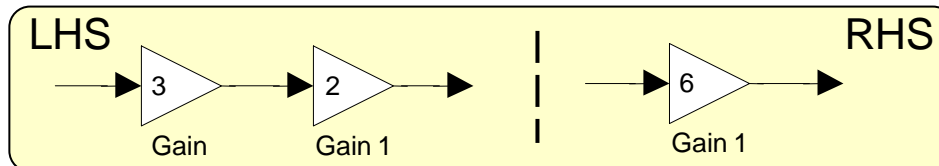


# Transformations in general

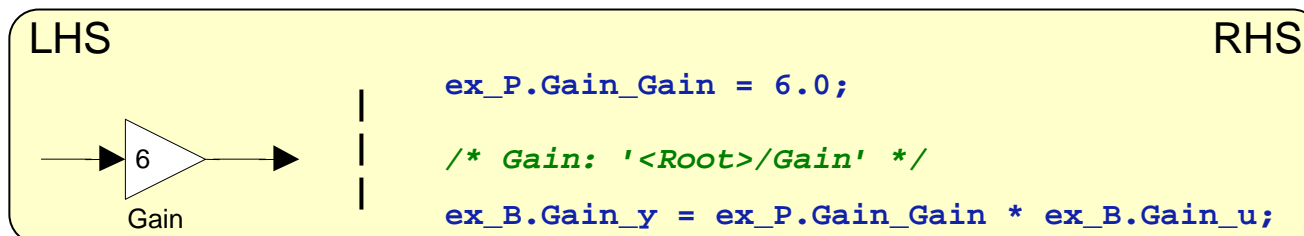
- Defining semantics (Haskell)



- Optimization (minimize number of blocks)



- Code generation



# Research

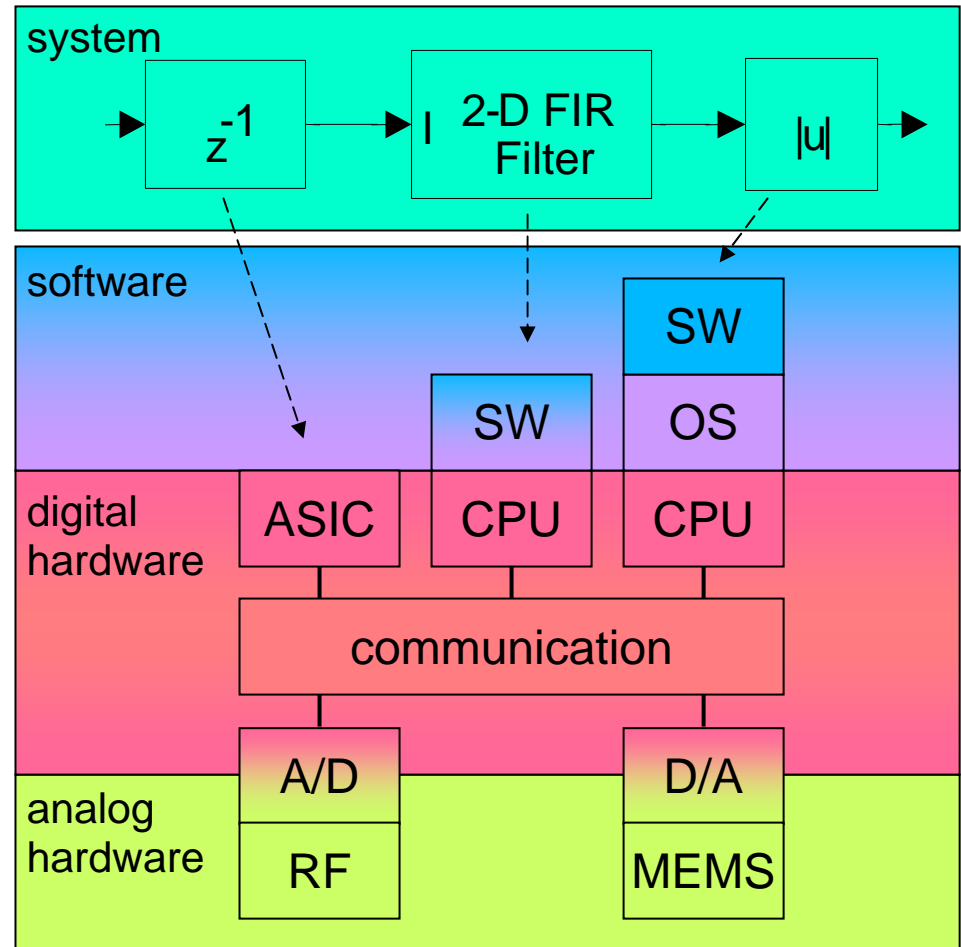
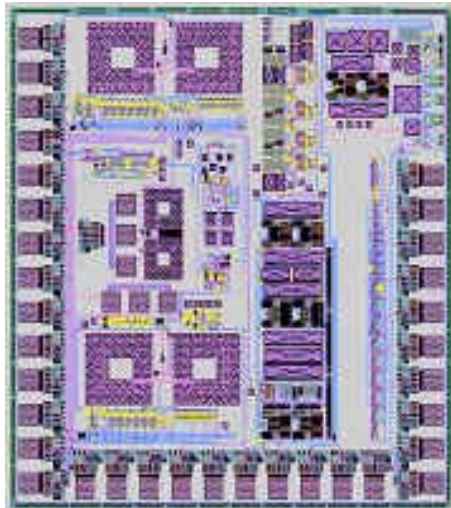
- Provably correct transformations
- Efficiency
  - Programmed graph rewriting
- Domain-specific formalisms evolve constantly
- Semantic anchoring
  - What formalism to use?
  - Is there a metaformalism?
  - How do you deal with semantic nuances?
    - Approximative semantics?

# Agenda

- Model-Based Design
- Computer Automated Multiparadigm Modeling
- **Application**
- Multi-formalism modeling
- Mixed-signal simulation
- Hybrid Dynamic Systems
- Summary

# An EDA application

- SoC platform
  - Heterogeneous
  - Highlights more common design challenges

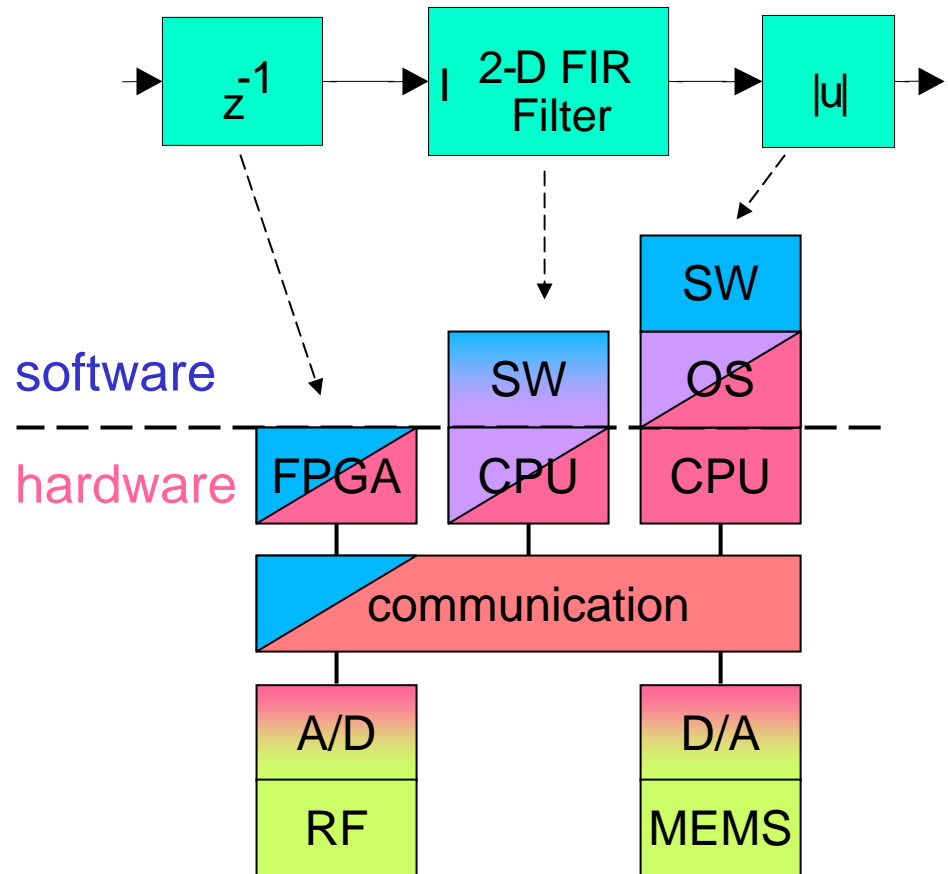


*Acknowledgment: picture redrawn from work by Jan Madsen*



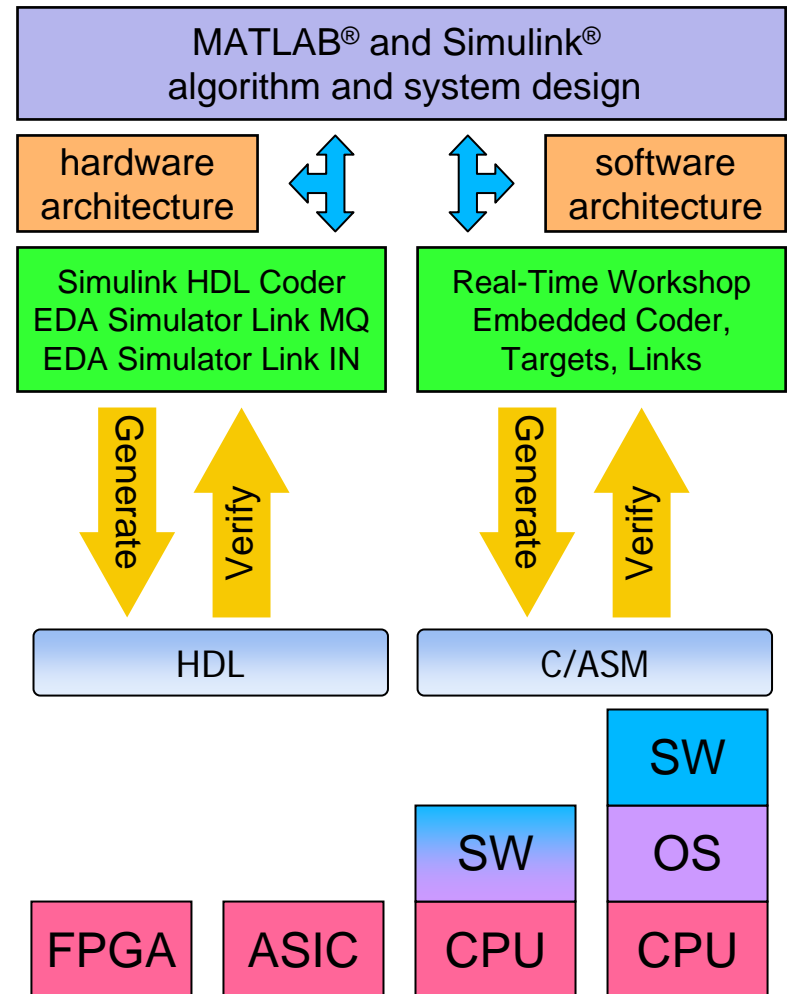
# A new frontier ...

- No clear HW/SW separation
  - Traditionally different design paradigms
  - Reconfigurable
    - Hardware and software
    - Adapt to environment
- Novel
  - Design paradigms
  - Applications



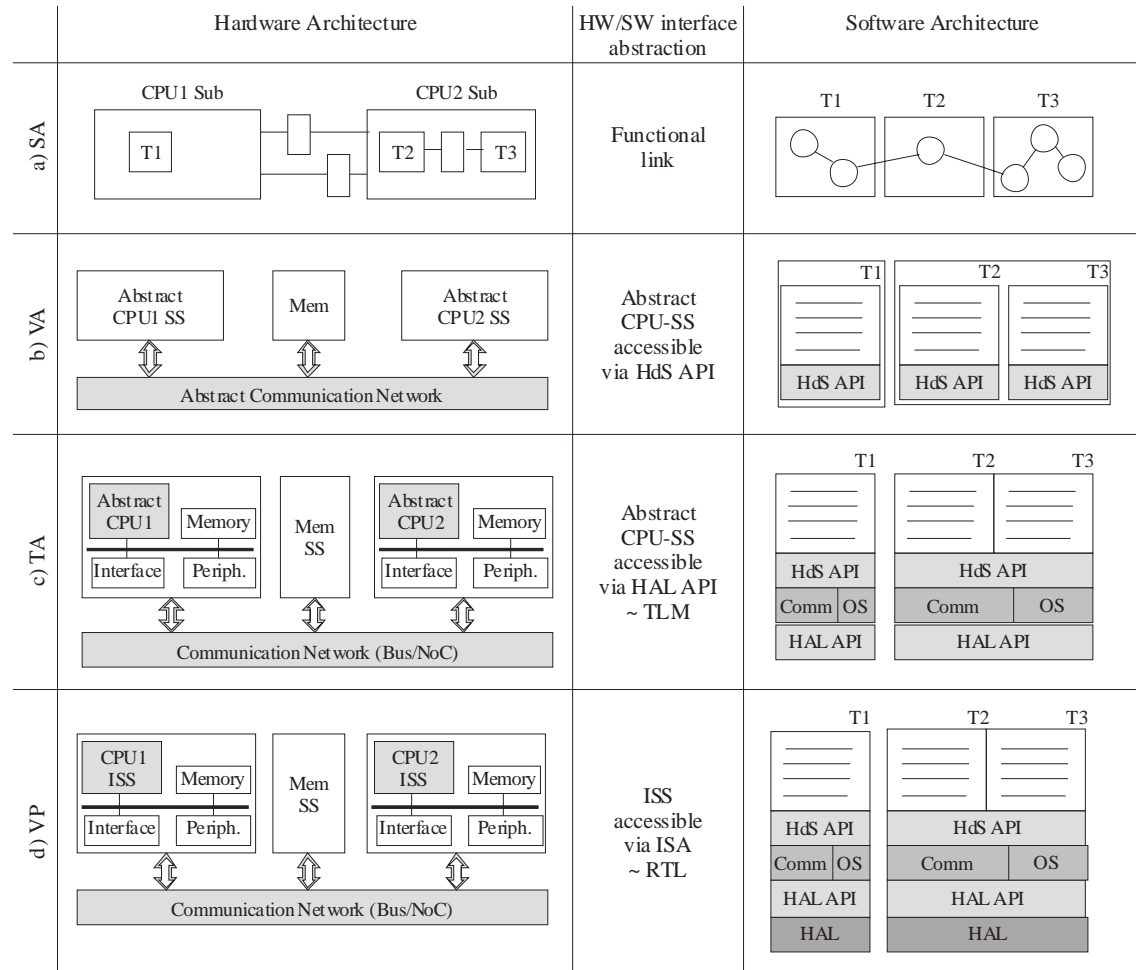
# Piecing it all together ...

- **Compiler**
  - Combines
    - Functional design
    - Architecture
  - Generates
    - Hardware (HDL)
    - Software (C/ASM)
- **Simulator to**
  - Explore design space
  - Verify design choices
    - Hardware in the loop
    - Processor in the loop
    - Silicon in the loop
    - ...



# Implementation effects

- Application algorithm validation
- Task code validation  
*Deadlock free execution*
- Partitioning validation
- Communication architecture  
*Number of exchanged bytes*
- HdS Integration validation
- Communication architecture  
*Number of exchanged bytes*  
*Number of conflicts on bus*  
*Level of NoC congestion*
- Final SW binary validation
- Performance measurement
- Memory mapping validation



**Acknowledgment:** picture redrawn from work by Katalin Popovici and Ahmed Amine Jerraya

# Research

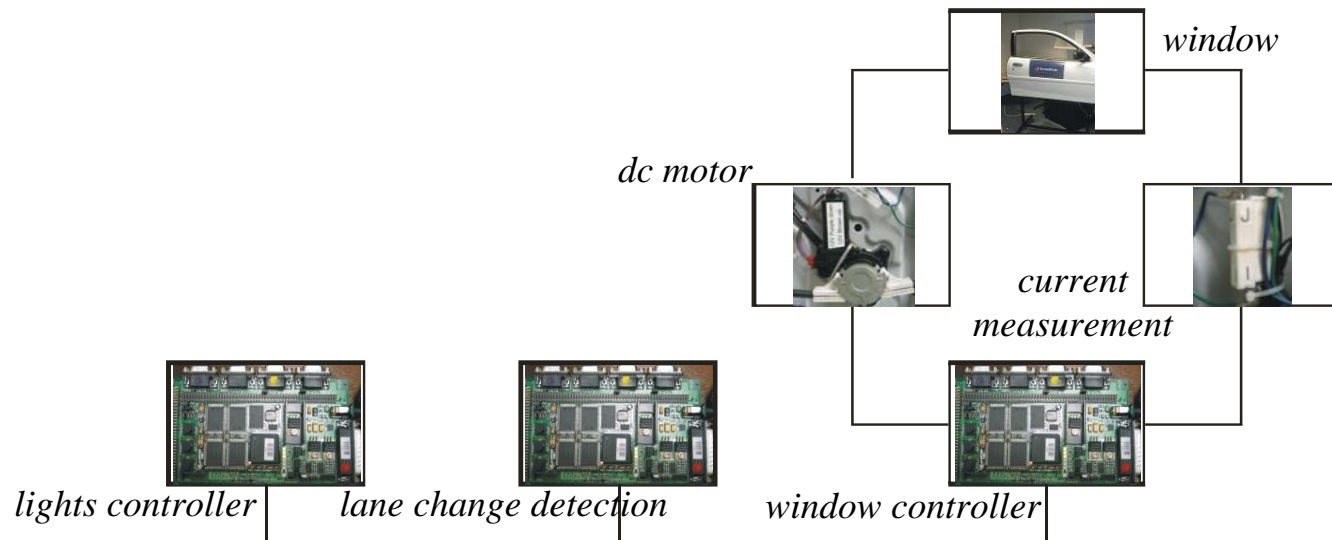
- Include performance metrics
- Systems of systems
  - Compositionality
  - Composability
- How to deal with heterogeneity?
  - Dieting philosophers
- Can you prove abstractions are property preserving?

# Agenda

- Model-Based Design
- Computer Automated Multiparadigm Modeling
- Application
- **Multi-formalism modeling**
- Mixed-signal simulation
- Hybrid Dynamic Systems
- Summary

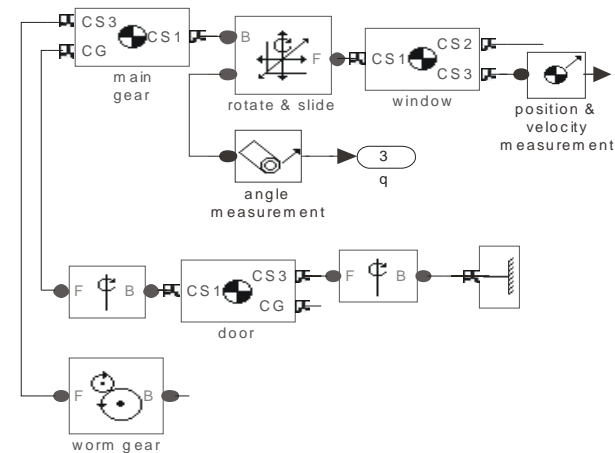
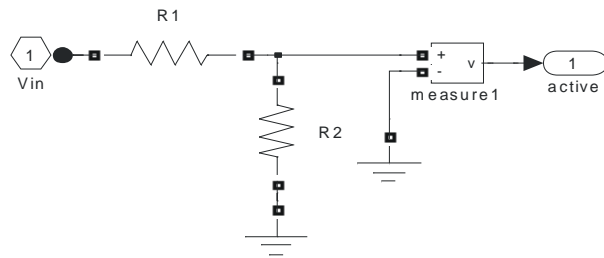
# Networked Embedded Control System

- Continuous and discrete behavior
  - Plant; Continuous-time behavior with sporadic discrete events
  - Controller; Frequent periodic events
  - Network; Frequent aperiodic events



# Modeling the plant physics

- Domain-specific modeling
  - DC motor and signal conditioning—Power Systems
  - Window lift mechanism—Multibody Systems

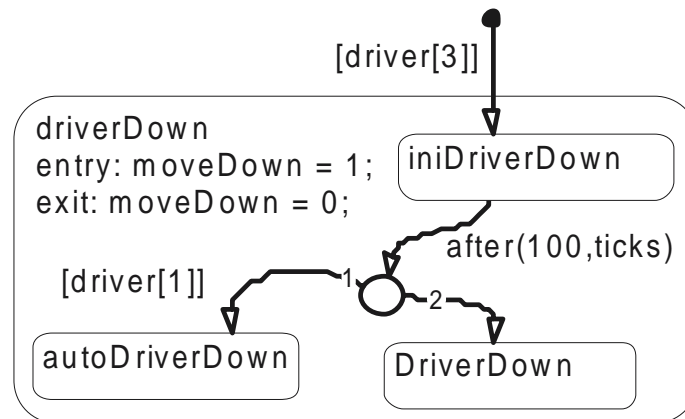


- Characteristics
  - **Noncausal**, energy-based, modeling
  - **Differential equation** based



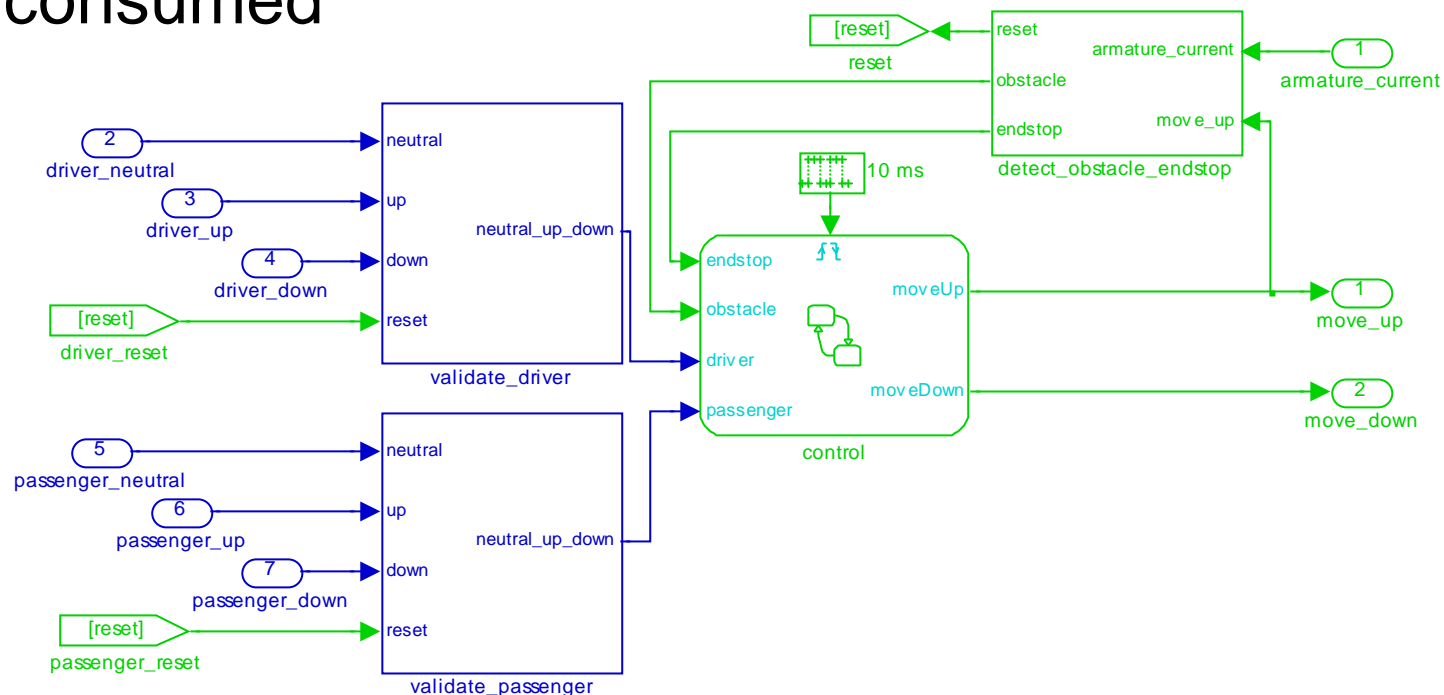
# Modeling the supervisory control

- Discrete state based
- Discrete events cause transitions between states
- Conditions to guard the transition
- **Untimed**
- **Control centric, consume**



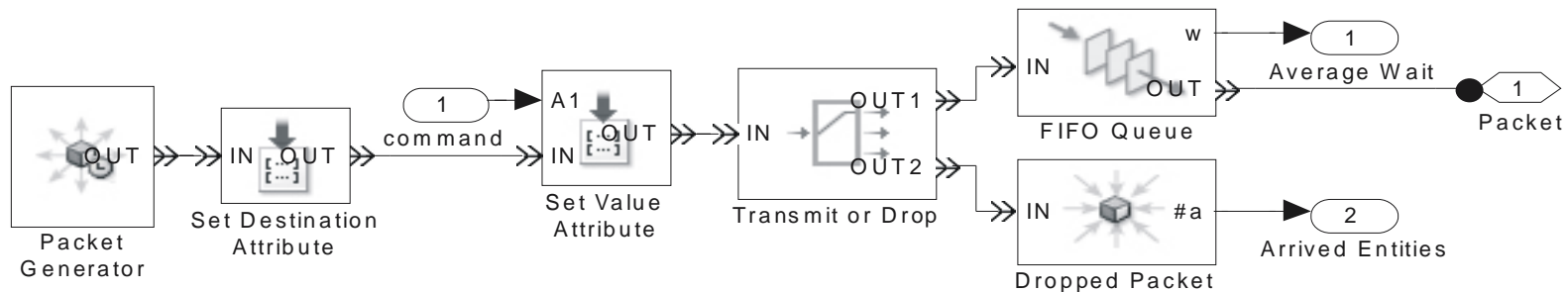
# Modeling the feedback control

- Embedded processors at fixed sample rate
- Sampled discrete time
- **Periodic, infinite read**; data values are not ‘consumed’

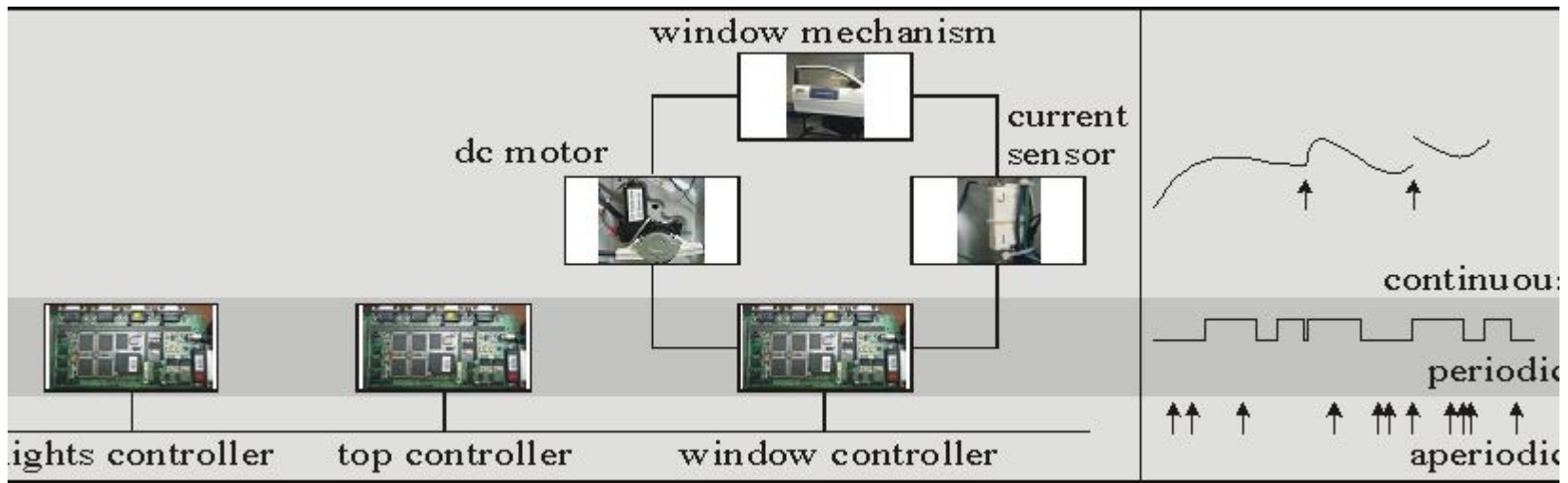


# Modeling network traffic

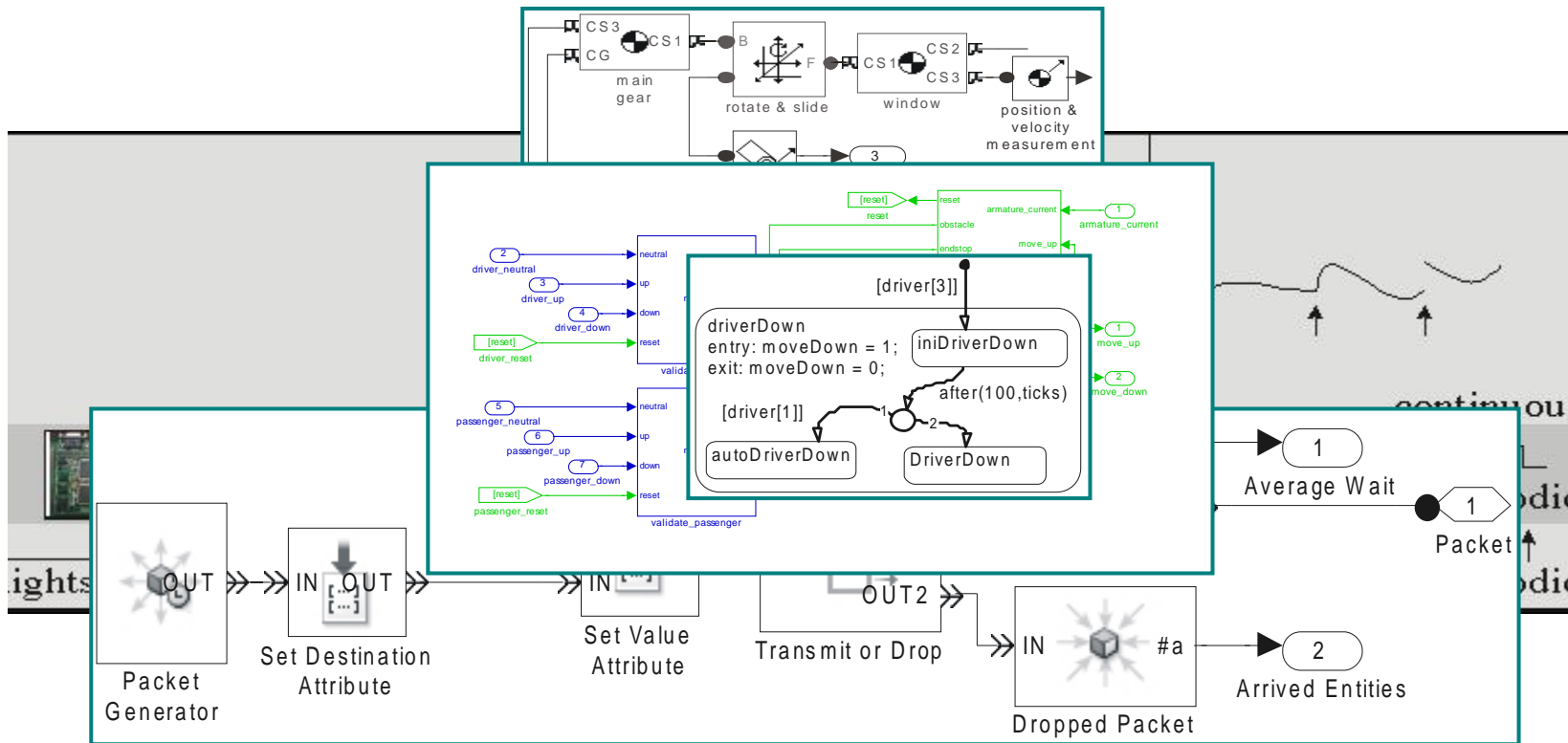
- Packets moving from one point to another
  - Attributes
    - Source, destination, service time, priority
  - Preemption
- Server/Queue systems
  - Entities flowing through a graph, **data centric, producer/consumer**
  - Discrete events, **aperiodic**, often *stochastic*



# All part of the networked embedded system



# All part of the networked embedded system



# Research

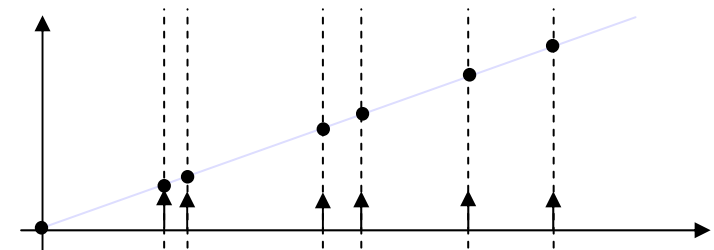
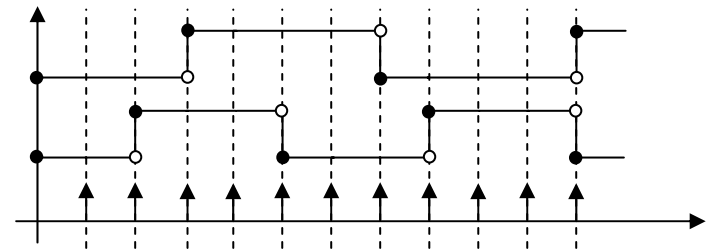
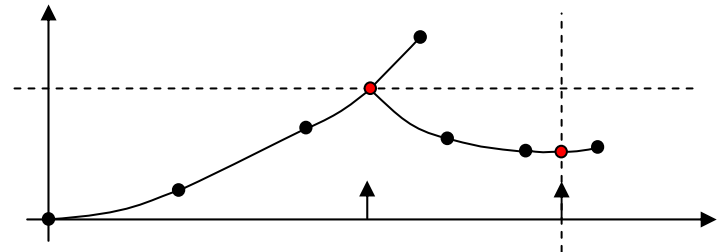
- How to handle multiple formalisms
  - Relate
  - Combine
  - Integrate
- Formalisms evolve
  - Forward and backward compatibility

# Agenda

- Model-Based Design
- Computer Automated Multiparadigm Modeling
- Application
- Multi-formalism modeling
- **Mixed-signal simulation**
- Hybrid Dynamic Systems
- Summary

# How to handle a discrete event

- Time-driven
  - Time integrated
    - Integrate up till event time
    - **Inefficient** for time events
  - Sampled time
    - Run scheduler at lowest rate
    - **Inefficient** for widely spaced events
- Event-driven
  - Jump to event time immediately
  - Does **not** apply to state events





# Classes of behavior

- Plant, time integrated (**TI**)
  - Continuous time
  - Sporadic *aperiodic state-events* (zero crossings)
  - Events occur *during execution*
- Controller, sampled time (**ST**)
  - Discrete time
  - Frequent *periodic time-events*
  - Events are known *before execution*
- Network/OS, event driven (**ED**)
  - Discrete time
  - Frequent *aperiodic time-events*
  - Events occur *during execution*

Event classification

	predict	unknown
periodic	ST	-
aperiodic	ED	TI

# Dedicated Time-Driven Solver

- Numerical solver integrates time (step  $h$ )

$$k_1 = h \cdot f(x_n, y_n)$$

$$k_2 = h \cdot f\left(x_n + \frac{h}{2}, y_n + \frac{k_1}{2}\right)$$

$$k_3 = h \cdot f\left(x_n + \frac{h}{2}, y_n + \frac{k_2}{2}\right)$$

$$k_4 = h \cdot f(x_n + h, y_n + k_3)$$

$$y_{n+1} = y_n + \frac{k_1}{6} + \frac{k_2}{3} + \frac{k_3}{3} + \frac{k_4}{6} + O(h^5)$$

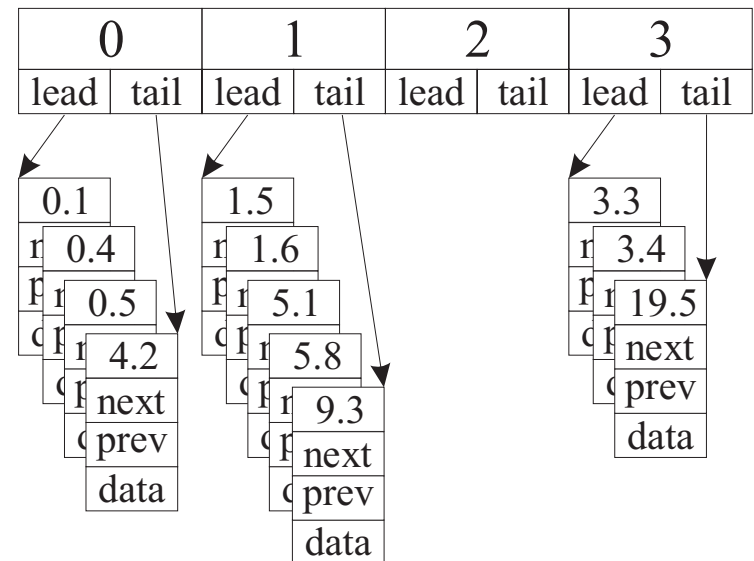
- Sampled time event schedule  
(time up till which to integrate)

# Dedicated Event-Driven Solver

- Event-driven solver
  - Event calendar

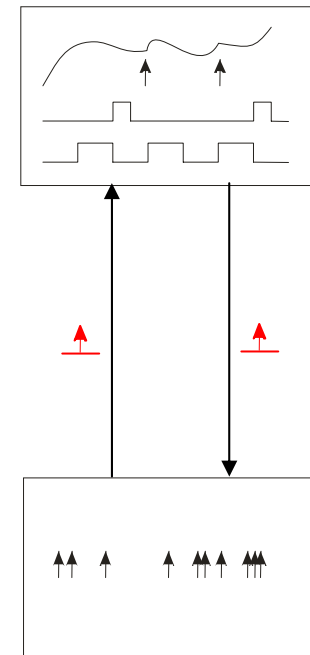
20 [ms]	open_cover
2020 [ms]	move_top_up_cmd
2150 [ms]	move_down_window
2250 [ms]	stop_moving_window

- Efficient data structure

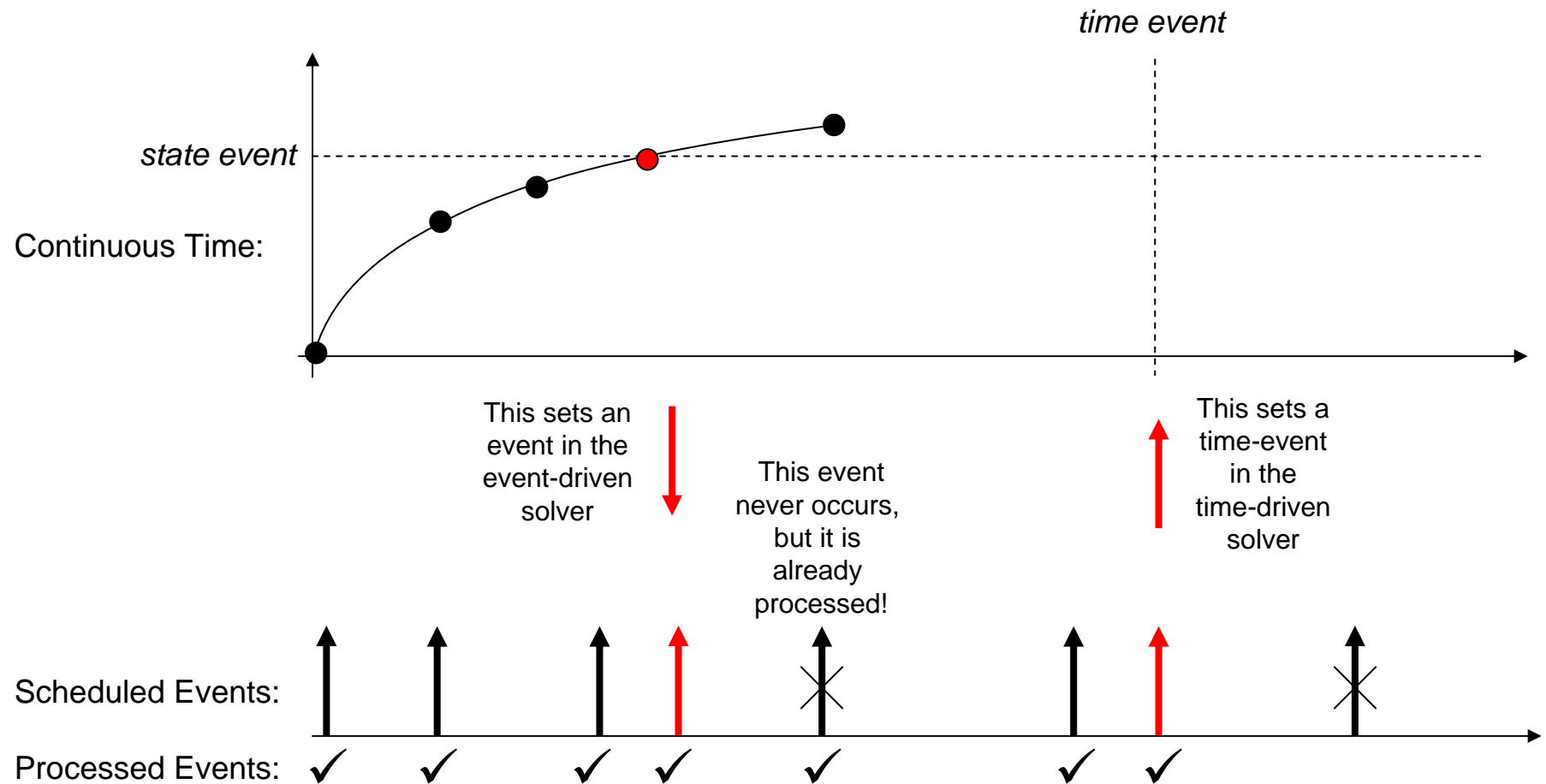


# Efficiency

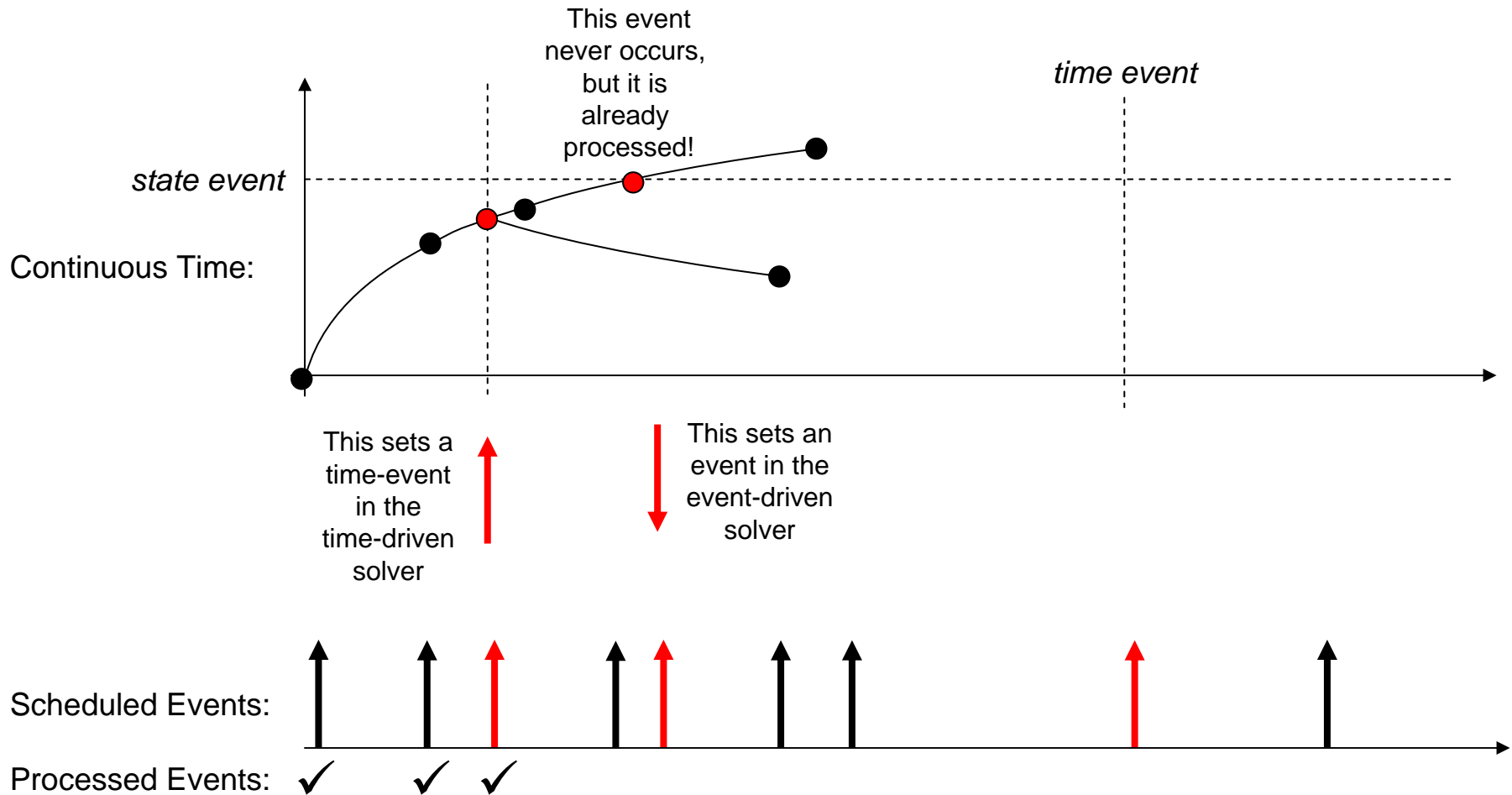
- Two separate solvers
  - Time-driven solver
    - Numerical solver integrates time (step  $h$ )
    - Sampled time event schedule (time up to which to integrate)
  - Event-driven solver
    - Event calendar
- Challenges
  - Combine the solvers
  - Integrate the solvers



# Event-driven leads



# Time-driven leads



# Questions

- Can we restrict the modeling constructs that are allowed?
  - For example, no state events allowed to trigger events in the event-driven solver
- What inaccuracy is acceptable?
  - Not do zero-crossing detection
  - Run event-driven part at a quick base rate
- What efficiency is necessary?
  - Lock step approach
  - Use one solver all together?
    - Do you lose the ability to handle a batch of discrete events independently?
  - Other techniques?
    - Model differently
- What is the preferred configuration?
  - Time-driven leads, store continuous-time state
  - Event-driven leads, store discrete event state
  - Alternatives?

# Agenda

- Model-Based Design
- Computer Automated Multiparadigm Modeling
- Application
- Multi-formalism modeling
- Mixed-signal simulation
- **Hybrid Dynamic Systems**
- Summary



# What is a hybrid dynamic system?

- Combines two types of behavior

- Continuous-time

- Ordinary differential equations (ODEs)

$$f_{\alpha_i} : \dot{x} = A_{\alpha_i} x + B_{\alpha_i} u$$

- Differential and algebraic equations (DAEs)

$$f_{\alpha_i} : E_{\alpha_i} \dot{x} = A_{\alpha_i} x + B_{\alpha_i} u$$

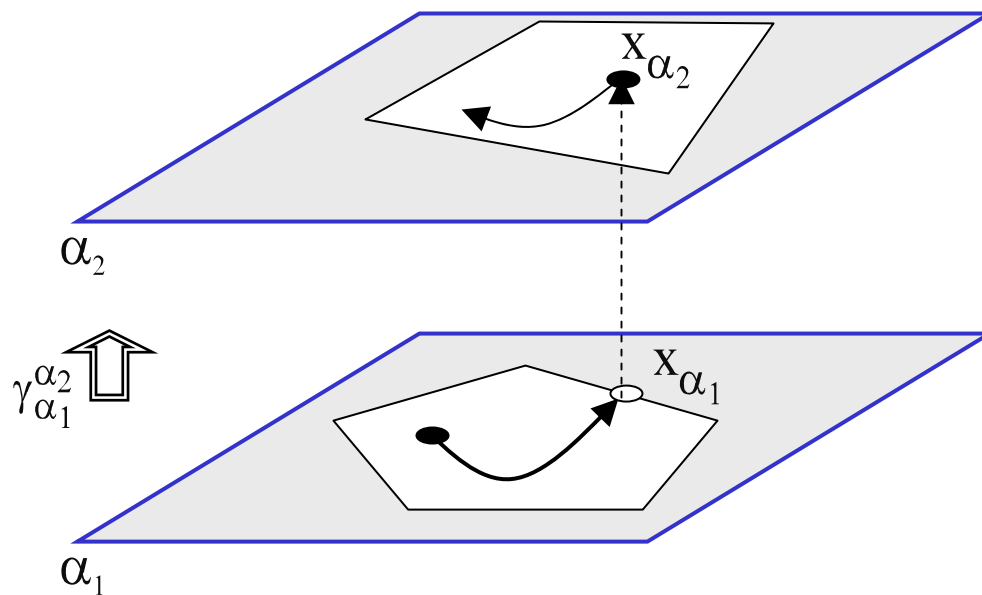
- Discrete state changes

- Inequalities

$$\gamma_{\alpha_i}^{\alpha_{i+1}} : C_{\alpha_i} x + D_{\alpha_i} u \geq 0$$

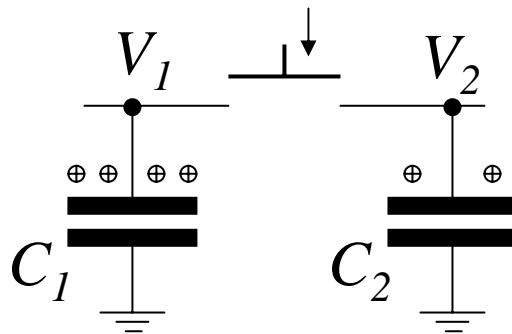
# Hybrid Dynamic Behavior

- Geometric view
  - Modes of continuous, smooth, behavior
  - Patches of admissible state variable values



# Generalized state space

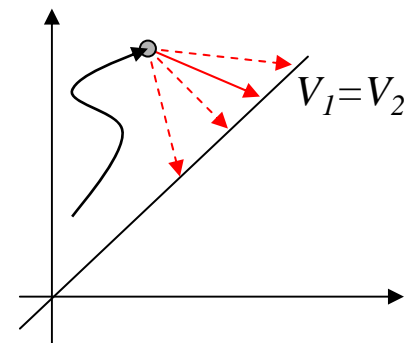
- Dimensions of state space may collapse



$$V_i = \frac{q_i}{C_i}$$

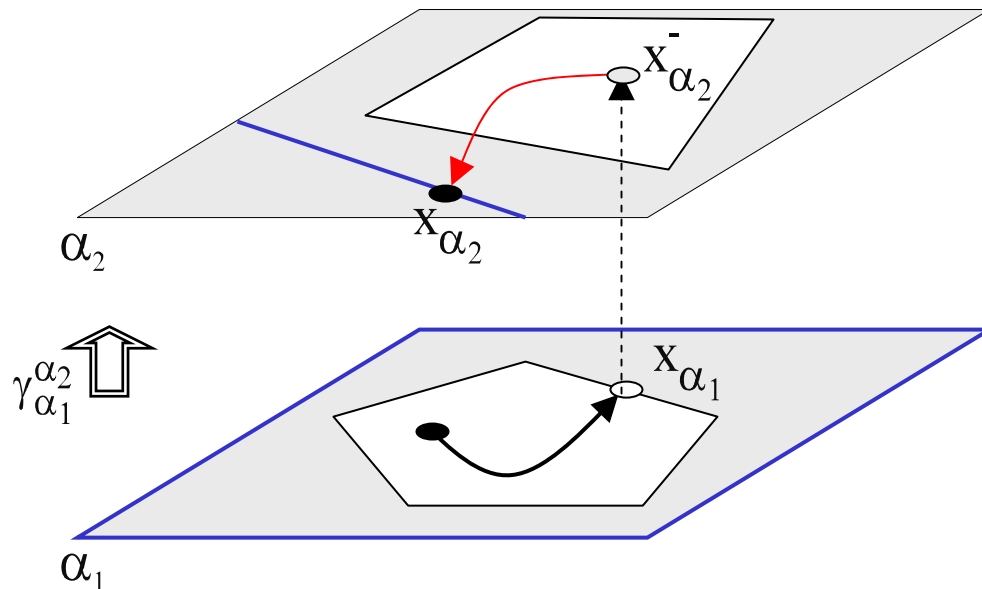
$$I = C_i \frac{dV_i}{dt}$$

- After switch closes
  - $V_1 = V_2$
  - Instantaneous change in charge



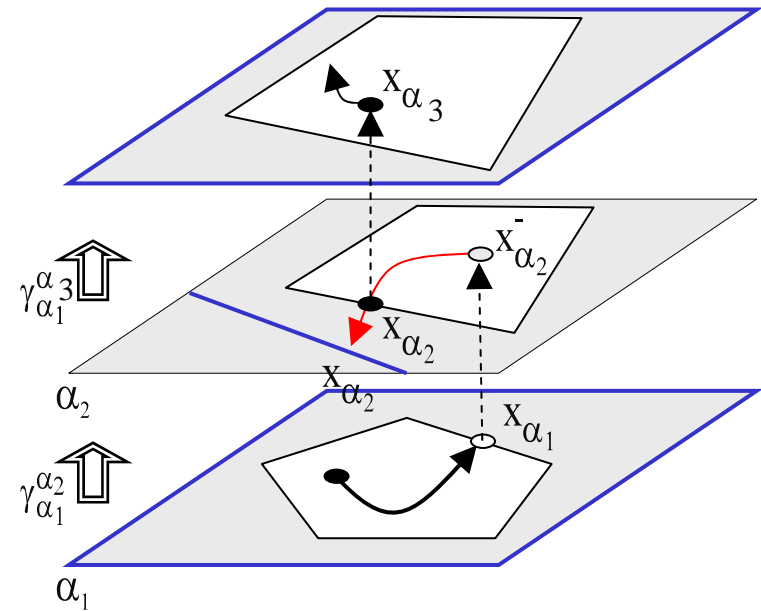
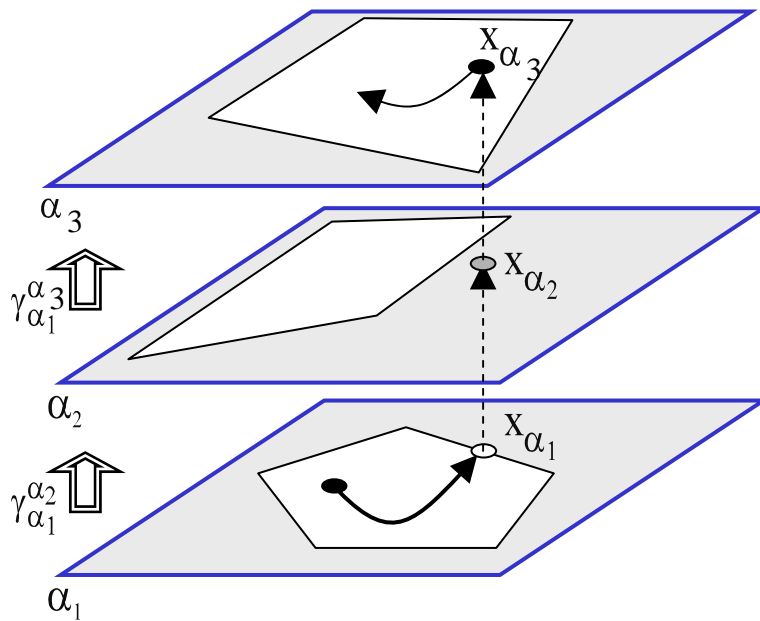
# Refined Hybrid Dynamic Behavior

- Geometric view
  - Modes of continuous, smooth, behavior
  - Patches of admissible state variable values
  - Manifold of dynamic behavior

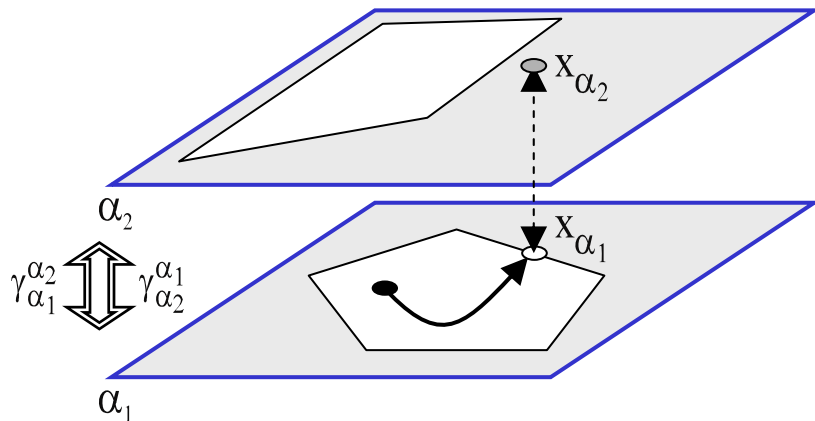


# Sequences of mode changes

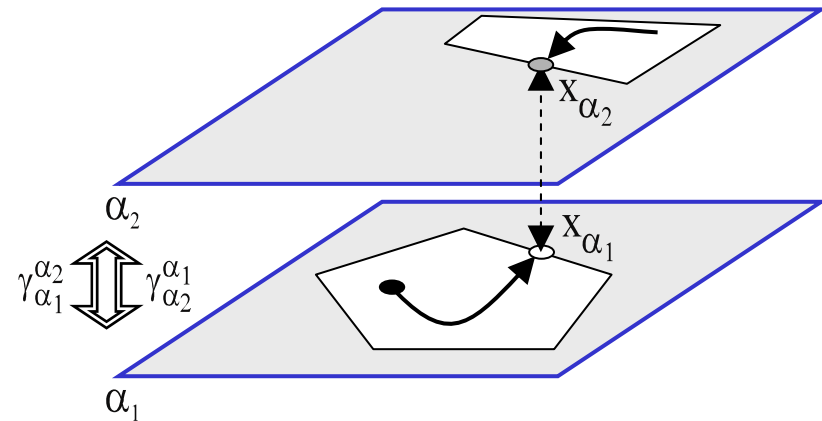
- Mythical mode
- Pinnacle



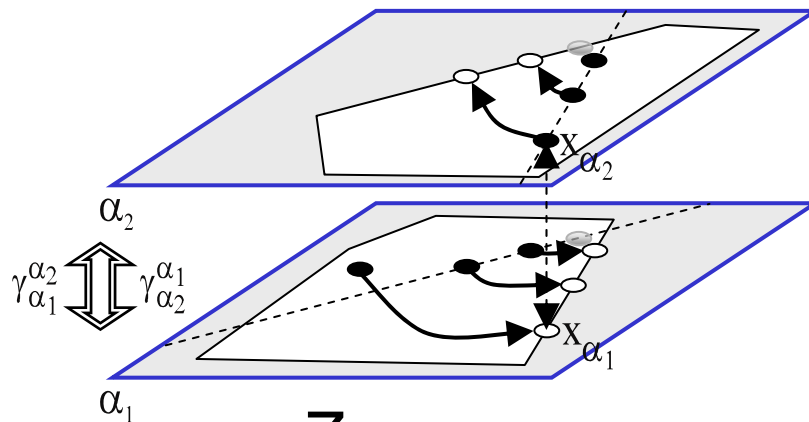
# Pathological behaviors



Divergence of time



Chattering



Zeno

# Ontology

- Phase Space Transition Behavior Classification
  - Mythical (state invariant)
  - Pinnacle (state projection aborted)
  - Continuous
    - Interior (continuous behavior)
    - Boundary (further transition after infinitesimal time advance)
    - Sliding (repeated transitions after each infinitesimal time advance)
- Combinations of Behavior Classes
- On Zeno
  - *Chattering*: infinitesimal time advance
  - *Divergence of time*: infinitely many switches without time advance
  - *Zeno*: infinitely many switches never past a point in time

# Research

- How to efficiently generate behavior for combined time-driven and event-driven execution engines?
- How to deal with run-time index changes?
- Pathological behaviors
  - How to detect in industrial-size models?
  - How to (re)solve?



# Agenda

- Model-Based Design
- Computer Automated Multiparadigm Modeling
- Application
- Multi-formalism modeling
- Mixed-signal simulation
- Hybrid Dynamic Systems
- **Summary**

# Summary

- Model-Based Design
  - Efficient engineering system design
- Important research
  - Computer Automated Multiparadigm Modeling
  - Hybrid Dynamic Systems
  - ...
- Multi-domain research
  - Electrical engineering
  - Computer engineering
  - Theoretical physics
  - Computer science

# Acknowledgments

- Hans Vangheluwe
- Ben Denckla
- Katalin Popovici
- Mirko Conrad
- All participants of the annual Computer Automated Multiparadigm Modeling (CAMPaM) workshop at the McGill University Bellairs Campus, Barbados
- ...