

# Hybrid Systems Theory

presented by Tom Henzinger

1. Robust hybrid systems
2. Stochastic hybrid systems
3. Compositional hybrid systems
4. Computational hybrid systems

*Program Review*  
*May 10, 2004*  
*Berkeley, CA*

*UC Berkeley: Chess*  
*Vanderbilt University: ISIS*  
*University of Memphis: MSI*

*Foundations of Hybrid and Embedded Software Systems*



NSF



## A Formal Foundation for Embedded Systems

needs to combine

Computation

+

Physicality

Theories of  
-composition & hierarchy  
-computability & complexity



R

Theories of  
-robustness & approximation  
-probabilities & discounting

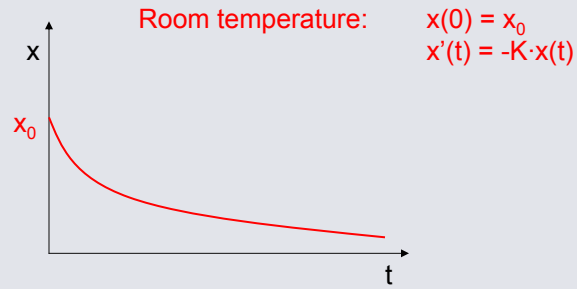
B



## Continuous Dynamical Systems

State space:  $\mathbb{R}^n$

Dynamics: initial condition + differential equations

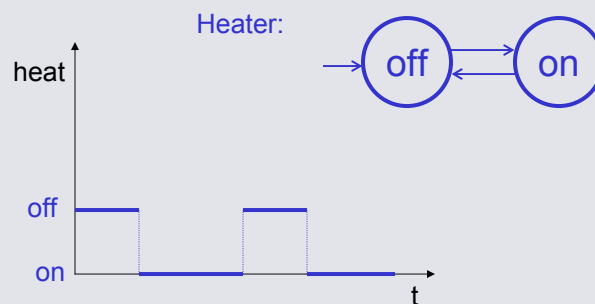


Analytic complexity.

## Discrete Transition Systems

State space:  $\mathbb{B}^m$

Dynamics: initial condition + transition relation

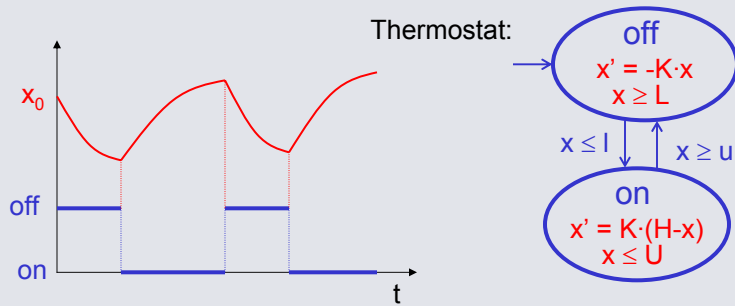


Combinatorial complexity.

# Hybrid Automata

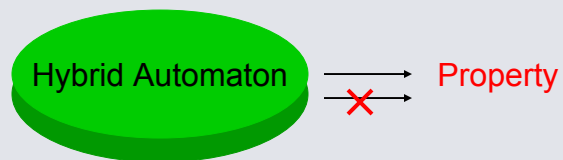
State space:  $B^m \times \mathbb{R}^n$

Dynamics: initial condition + transition relation  
+ differential equations



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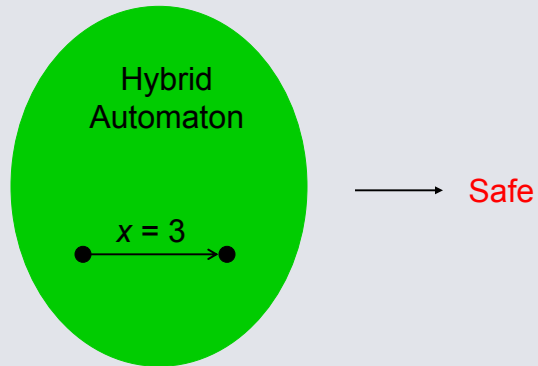
# The Robustness Issue



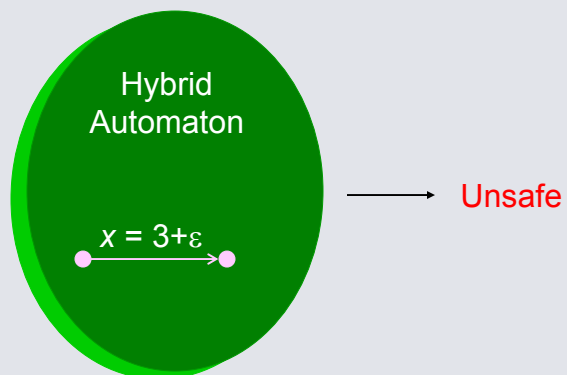
slightly perturbed automaton

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## The Robustness Issue



## The Robustness Issue



## Towards Robust Hybrid Automata

$\text{value}(\text{Model}, \text{Property}): \text{States} \rightarrow \mathbb{B}$



$\text{value}(\text{Model}, \text{Property}): \text{States} \rightarrow \mathbb{R}$

## Towards Robust Hybrid Automata

$\text{value}(\text{Model}, \text{Property}): \text{States} \rightarrow \mathbb{B}$

$\text{value}(m, \diamond T) = (\mu X) (T \vee \text{pre}(X))$

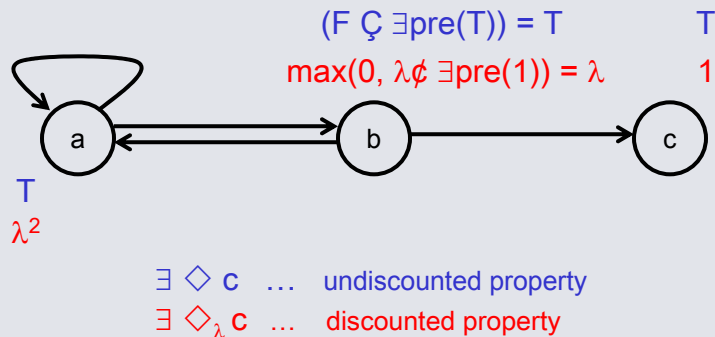


$\text{discountedValue}(\text{Model}, \text{Property}): \text{States} \rightarrow \mathbb{R}$

$\text{discountedValue}(m, \diamond T) = (\mu X) \max(T, \lambda \cdot \text{pre}(X))$

discount factor  $0 < \lambda < 1$

## Reachability (coSafety)



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## Main Result (so far, only for discrete systems)

### Robustness Theorem [de Alfaro, Henzinger, Majumdar]:

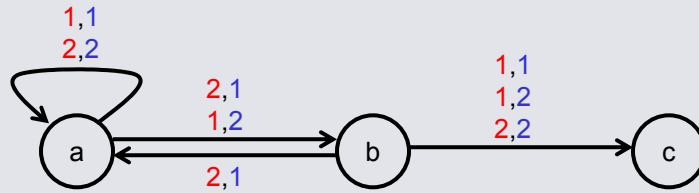
If  $\text{discountedBisimilarity}(m_1, m_2) > 1 - \varepsilon$ ,  
 then  $|\text{discountedValue}(m_1, p) - \text{discountedValue}(m_2, p)| < f(\varepsilon)$ .

### Further Advantages of Discounting:

- approximability** because of geometric convergence (avoids non-termination of verification algorithms)
- applies also to **probabilistic** systems and to **games** (enables reasoning under uncertainty, and control)

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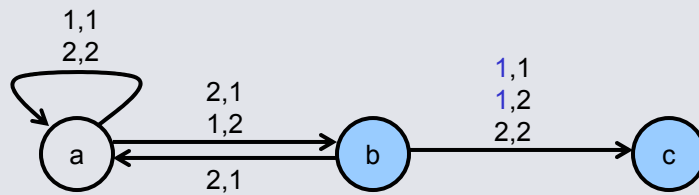
## Concurrent Game



player "left"  
player "right"

- for modeling component-based systems ("interfaces")
- for strategy synthesis ("control")

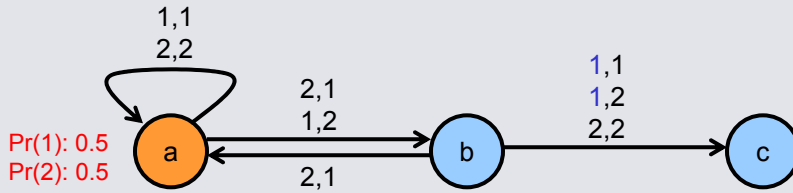
## Concurrent Game



$\exists_{\text{left}} \forall_{\text{right}} \diamond c \dots$  player "left" has a deterministic strategy to reach c

$$(\mu X) (T \vee \exists_{\text{left}} \forall_{\text{right}} \text{pre}(X))$$

## Concurrent Game

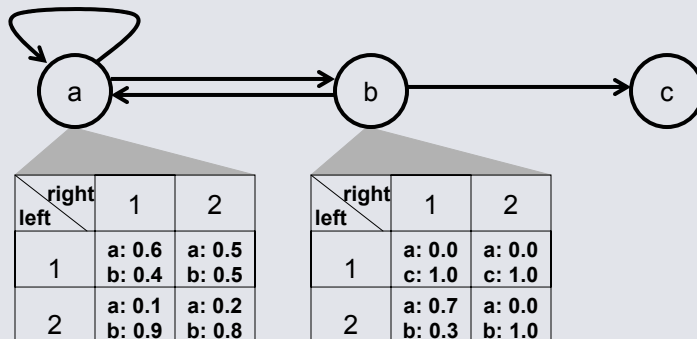


$\exists_{\text{left}} \forall_{\text{right}} \diamond c$  ... player "left" has a deterministic strategy to reach c  
 $\exists_{\text{left}} \forall_{\text{right}} \diamond c$  ... player "left" has a randomized strategy to reach c

$$(\mu X) (T \vee \exists_{\text{left}} \forall_{\text{right}} \text{pre}(X))$$

## Stochastic Game

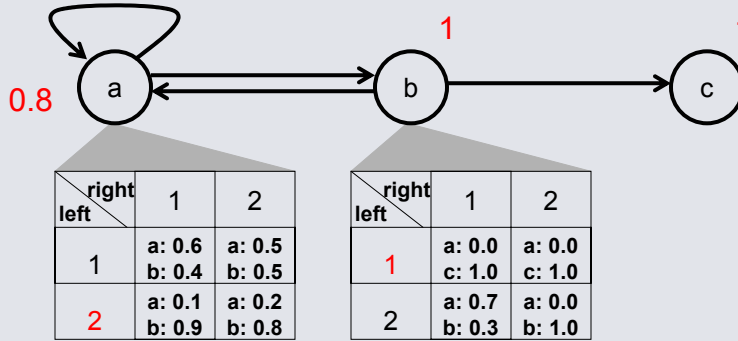
Probability with which player "left" can reach c ?





# Stochastic Game

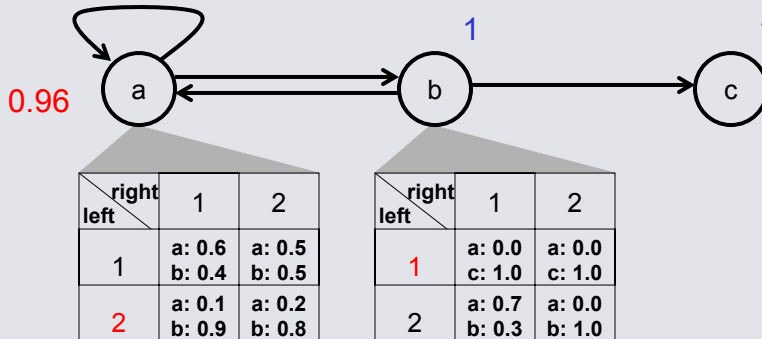
Probability with which player "left" can reach c ?



$$(\mu X) \max(\mathcal{T}, \exists_{\text{left}} \forall_{\text{right}} \text{pre}(X))$$

# Stochastic Game

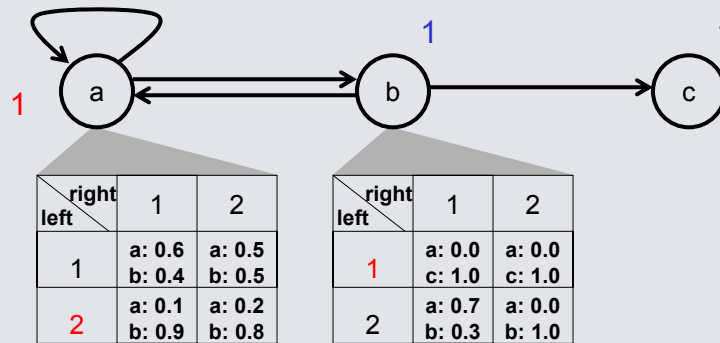
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# Stochastic Game

Probability with which player "left" can reach c ?



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Theory of discounting.  
Timed and stochastic games and optimal control.

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# Hybrid Systems Theory

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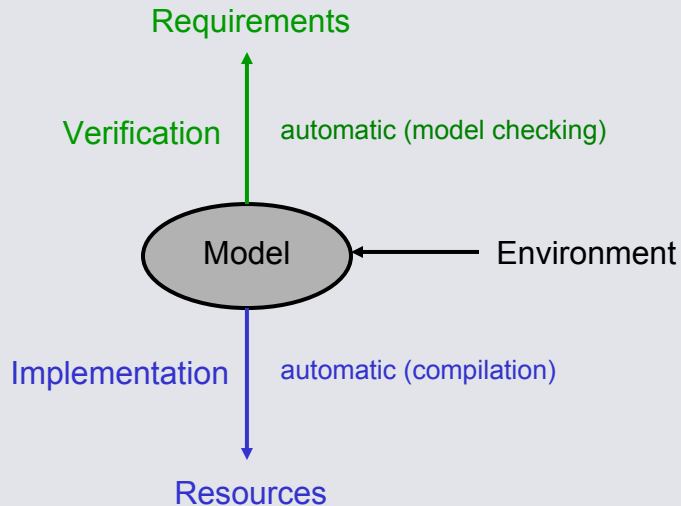
Agent algebras and interface theories.

Hybrid systems simulation (Ptolemy II, GME).

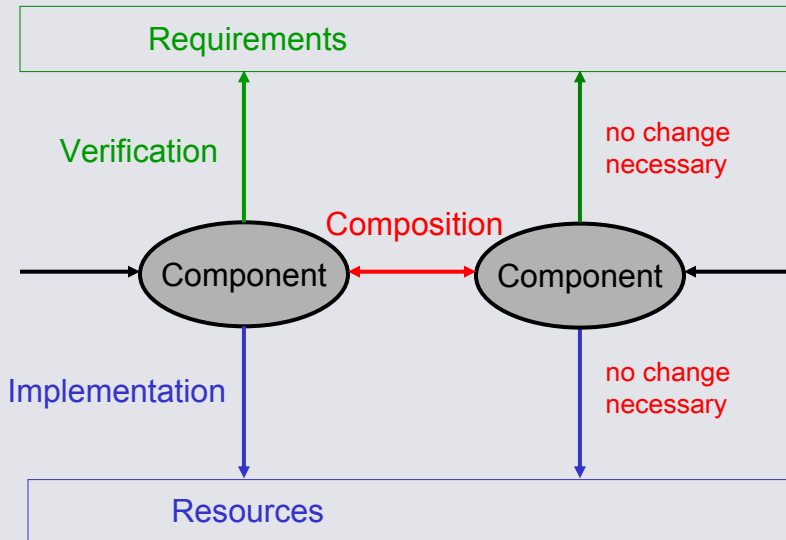
Hybrid systems verification (polyhedral & ellipsoidal methods).

Code generation from hybrid systems (Ptolemy II, Giotto).

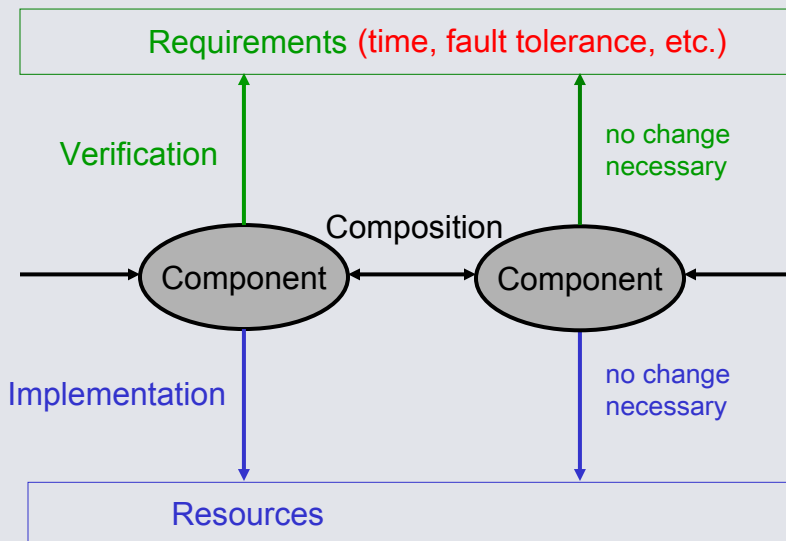
# The Compositionality Issue



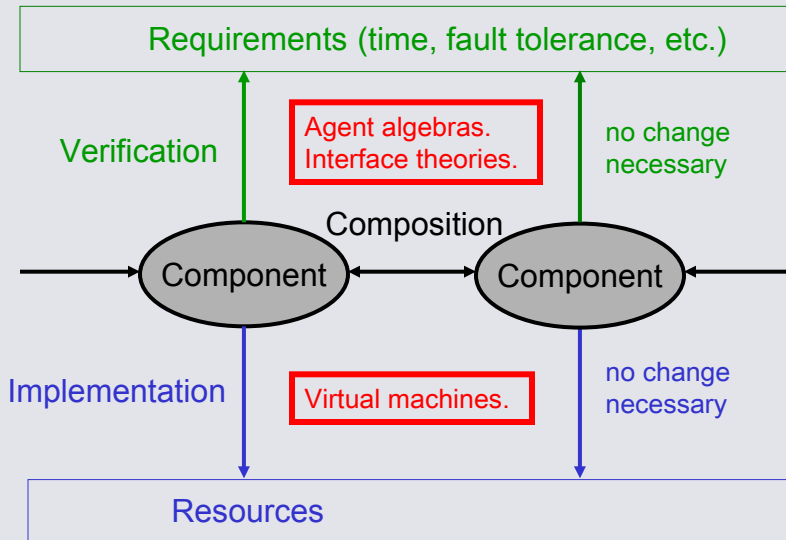
# The Compositionality Issue



# The Compositionality Issue



# The Compositionality Issue



## Compositional Hybrid Systems Modeling and Simulation I: HyVisual (based on Ptolemy II)

This models the dynamics of a ball falling in a gravitational field.

velocity

Const -10

Velocity

Position

ZeroCrossingDetector

bump

stop

free

ab(position) < stopped

bump.isPresent

free.initialVelocity = -elasticity \* velocity; free.initialPosition = position

HyVisual 2.2-beta - Hybrid System Visual Modeler

Block diagram editor and simulator for hybrid systems.

- Computation
- Diagram

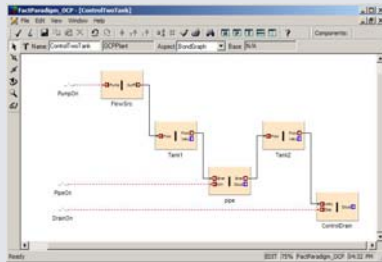
Position

height (meters)

time (sec)

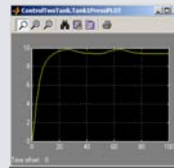
HyVisual is being used to nail down an operational semantics for hybrid systems.

## Compositional Hybrid Systems Modeling and Simulation II: Generating SIMULINK models from Hybrid Bond Graphs



Two Tank Example

GME



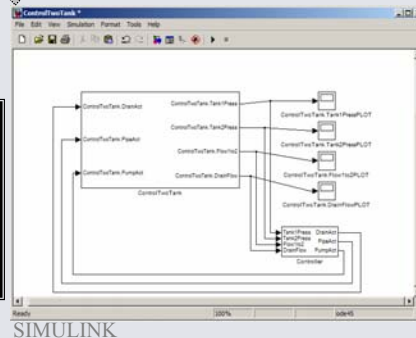
Tank1 Pressure



Tank2 Pressure

### THE SIMULINK ENVIROMENT

- Using Simulink blocks and subsystems we can create a block diagram that corresponds to the Hybrid Bond Graph in GME.
- Simulink provides variable step solvers for the simulation of ODEs, with error control and zero crossing detection.



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## Continuous System Verification: Problem

Given

- control system  $\dot{x}(t) \in Ax(t) + BU$
- control set  $U$
- target set  $M$

Consider decision problems

$$X(t_1, t_0, x^0) \subset M?$$

$$X(t_1, t_0, x^0) \cap M = \emptyset?$$

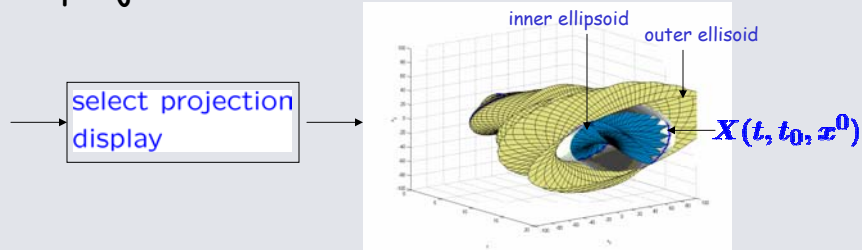
$$X(t_1, t_0, x^0) \cap M \neq \emptyset?$$

## Continuous System Verification: Approach

1. Express decision problems as optimization problems
2. Derive Hamilton-Jacobi-Bellman (HJB) partial differential equation of value functions
3. Obtain support functions of  $X(t, t_0, x^0)$  using convex analysis
4. Obtain tight outer and inner ellipsoidal approximations to  $X(t, t_0, x^0)$

## Continuous System Verification: Implementation

1. Matlab 'toolbox' to calculate ellipsoidal approximations and display any 2-d projection of reach set



2. Solve control problem: find control to steer  $(t_0, x^0) \rightarrow (t_1, x^1)$

## From Continuous to Hybrid System Verification

1. Find states that can be reached despite disturbances  $\dot{x}(t) \in Ax(t) + BU + CV$  in which  $V$  is set of disturbances

2. Find reach set of hybrid systems

$$\dot{x}(t) \in A_i x(t) + B_i U$$

in which i-th system is triggered by 'guard'

$$\langle c_i, x \rangle = d_i$$

(future work)



## Related In-Depth Talks

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**3:50 p.m.** Compositional Hybrid Systems:

Model Transformations on Hybrid Models  
(Aditya Agrawal)

**4:10 p.m.** Stochastic Hybrid Systems:

Hybrid Systems in Systems Biology  
(Wei Chung Wu, Jianghai Hu, Shankar Sastry)

**4:30 p.m.** Computational Hybrid Systems:

Computational Methods for Analyzing and  
Controlling Hybrid Systems (Claire Tomlin)

## Related Posters

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Compositional Hybrid Systems:

Rich Interface Theories (Arindam Chakrabarti)  
Compositional Metamodeling (Matthew Emerson)

Stochastic Hybrid Systems:

Stochastic Hybrid Systems (Alessandro Abate)

Computational Hybrid Systems:

Zeno Behavior in Hybrid Systems (Aaron Ames)  
Computation of Reach Sets (Alex Kurzhansky)