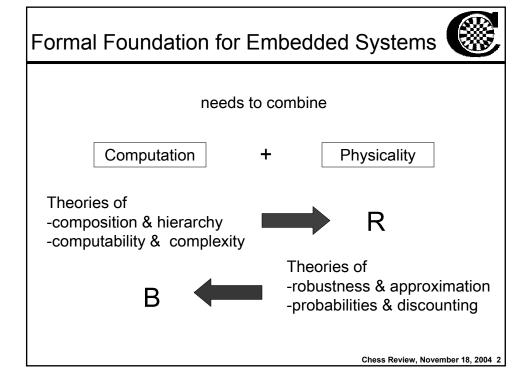
### Hybrid Systems Theory

Edited and Presented by Thomas A. Henzinger, Co-PI UC Berkeley

Chess Review November 18, 2004 Berkeley, CA





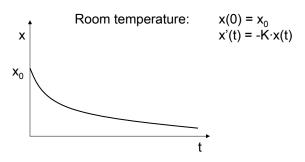


## Continuous Dynamical Systems



State space: Rn

Dynamics: initial condition + differential equations



Analytic complexity.

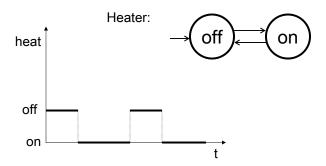
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## Discrete Transition Systems



State space: B<sup>m</sup>

Dynamics: initial condition + transition relation



Combinatorial complexity.

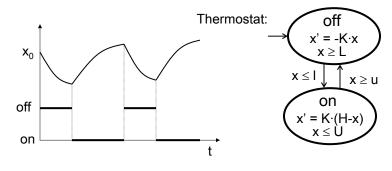
# Hybrid Automata



State space:  $B^m \times R^n$ 

Dynamics: initial condition + transition relation

+ differential equations



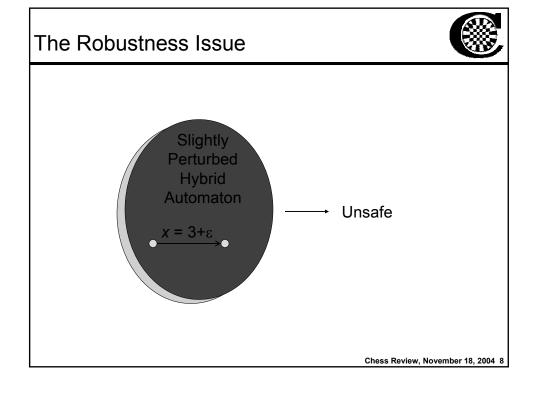
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# Four Problems with Hybrid Automata



- 1 Robustness
- 2 Uncertainty
- 3 Compositionality
- 4 Computationality

# The Robustness Issue Hybrid Automaton Safe Chess Review, November 18, 2004 7



### Robust Hybrid Automata



value(Model, Property): States  $\rightarrow$  B



value(Model,Property): States  $\rightarrow R$ 

Semantics: de Alfaro, H, Majumdar [ICALP 03]

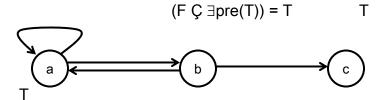
Computation: de Alfaro, Faella, H, Majumdar, Stoelinga [TACAS 04]

Metrics on models: Chatterjee et al. [submitted]

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### Boolean-valued Reachability

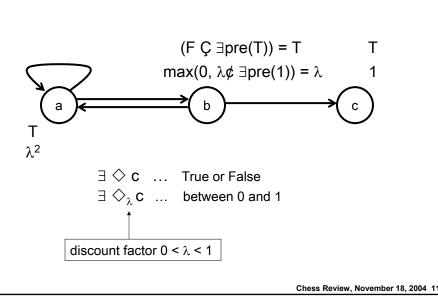




 $\exists \diamondsuit c \dots$  True or False

### Real-valued Reachability





### Robust Hybrid Automata



### **Continuity Theorem:**

If discountedBisimilarity( $m_1, m_2$ ) > 1 -  $\varepsilon$ , then |discountedValue( $m_1, p$ ) - 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)

# Four Problems with Hybrid Automata



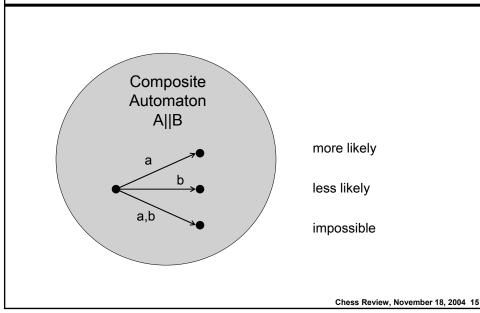
- 1 Robustness
- 2 Uncertainty
- 3 Compositionality
- 4 Computationality

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# The Uncertainty Issue Hybrid Automaton A 0 < x < 2 a 1 < y < 3 b Chess Review, November 18, 2004 14

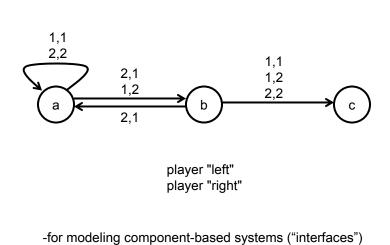
# The Uncertainty Issue





### **Concurrent Games**

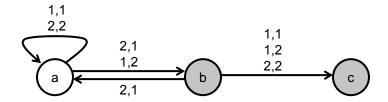




-for strategy synthesis ("control")

### **Concurrent Games**





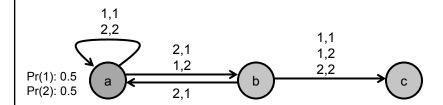
 $\exists_{\mathsf{left}} \ \forall_{\mathsf{right}} \diamondsuit \mathsf{c} \ \dots \ \mathsf{player}$  "left" has a deterministic strategy to reach  $\mathsf{c}$ 

$$(\mu X)$$
 (c  $\vee \exists_{\mathsf{left}} \forall_{\mathsf{right}} \mathsf{pre}(X)$ )

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### **Concurrent Games**





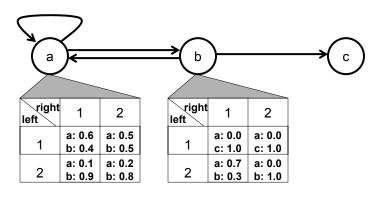
 $\exists_{\mathsf{left}} \ orall_{\mathsf{right}} \diamondsuit \mathsf{c} \ \dots$  player "left" has a deterministic strategy to reach  $\mathsf{c}$   $\exists_{\mathsf{left}} \ orall_{\mathsf{right}} \diamondsuit \mathsf{c} \ \dots$  player "left" has a randomized strategy to reach  $\mathsf{c}$ 

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

### **Stochastic Games**



Probability with which player "left" can reach c?

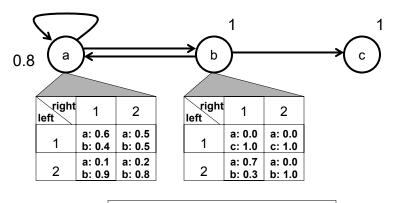


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Probability with which player "left" can reach c?

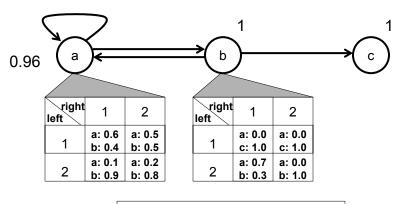


 $(\mu X)$  max(c,  $\exists_{left} \forall_{right} pre(X)$ )

### **Stochastic Games**



Probability with which player "left" can reach c?



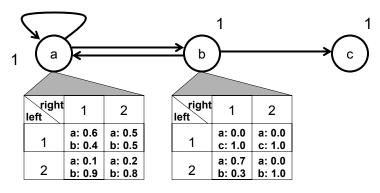
 $(\mu X) \max(c, \exists_{left} \forall_{right} pre(X))$ 

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### **Stochastic Games**



Probability with which player "left" can reach c?



Limit gives correct answer: de Alfaro, Majumdar [JCSS 04] coNP Å NP computation: Chatterjee, de Alfaro, H [submitted]

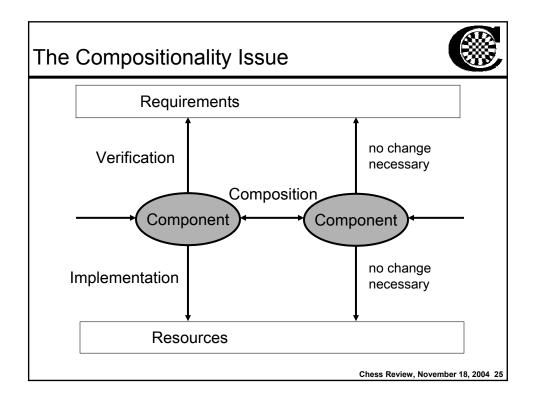
### Four Problems with Hybrid Automata

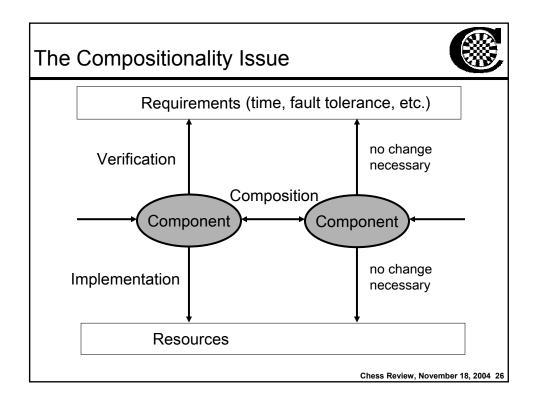


- 1 Robustness
- 2 Uncertainty
- 3 Compositionality
- 4 Computationality

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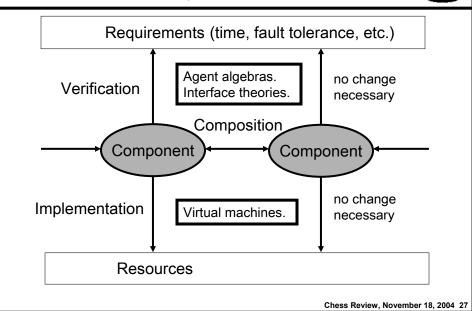
# Requirements Verification automatic (model checking) Model Environment Implementation automatic (compilation) Resources Chess Review, November 18, 2004 24





### The Compositionality Issue

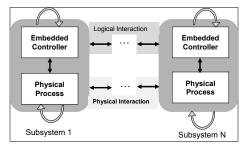




### Heterogeneous Compositional Modeling



# Consider hybrid system made up of interacting distributed subsystems:



- Physical subsystems coupled through a backbone
- Each unit includes ECDs that implement the control, monitoring, and fault diagnosis tasks
- > Subsystem interactions at two levels:
  - physical energy-based
  - logical information based, facilitated by LANs

Levels are not independent.

Question: How does one systematically model the interactions between the subsystems efficiently while avoiding the computational complexity of generating global hybrid models?

Implications: reachability analysis, design, control, and fault diagnosis

### Four Problems with Hybrid Automata



- 1 Robustness
- 2 Uncertainty
- 3 Compositionality
- 4 Computationality

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### The Computationality Issue



### **Reach Set Computation:**

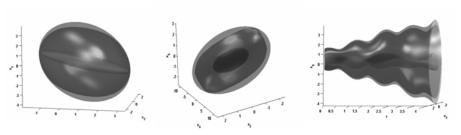
system 
$$\dot{x}(t) = A(t)x(t) + B(t)u(t)$$
 control  $u(t) \in \mathcal{P}(t)$ , initial state  $x(t_0) \in \mathcal{X}^0$ 

Find reach set  $\mathcal{X}(t, t_0, X^0)$  of all states that can be reached at time t starting in  $\mathcal{X}^0$  at  $t_0$  using open loop control u(t).

### Ellipsoidal Toolbox



- Calculation of reach sets using ellipsoidal approximation algorithms
- · Visualization of their 3D projections



www.eecs.berkeley.edu/~akurzhan/ellipsoids

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### Putting It All Together



- 1 Robustness
- 2 Uncertainty
- 3 Compositionality
- 4 Computationality

# Classification of 2-Player Games



- Zero-sum games: complementary payoffs.
- Non-zero-sum games: arbitrary payoffs.

1,-1	0,0
-1,1	2,-2

3,1	1,0
3,2	4,2

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# Classical Notion of Rationality



 $\begin{tabular}{ll} Nash\ equilibrium: none\ of\ the\ players\ gains\ by\ deviation. \end{tabular}$ 

(row, column)

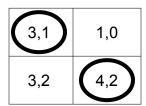
3,1	1,0
3,2	4,2

# Classical Notion of Rationality



Nash equilibrium: none of the players gains by deviation.

(row, column)



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# New Notion of Rationality



Nash equilibrium: none of the players gains by deviation.

Secure equilibrium: none hurts the opponent by deviation.

(row, column)

3,1	1,0
3,2	4,2

### Secure Equilibria



- Natural notion of rationality for component systems:
  - First, a component tries to meet its spec.
  - Second, a component may obstruct the other components.
- For Borel specs, there is always unique maximal secure equilibrium.

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### Borel Games on State Spaces



### Synthesis:

- Zero-sum game controller versus plant.
- Control against all plant behaviors.

### Verification:

- Non-zero-sum specs for components.
- Components may behave adversarially, but without threatening their own specs.

### Borel Games on State Spaces



- · Zero-sum games:
  - Complementary objectives:  $\phi_2 = : \phi_1$ .
  - Possible payoff profiles (1,0) and (0,1).
- Non-zero-sum games:
  - Arbitrary objectives  $\phi_1$ ,  $\phi_2$ .
  - Possible payoff profiles (1,1), (1,0), (0,1), and (0,0).

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### Zero-Sum Borel Games



- · Winning:
  - Winning-1 states s:  $(9 \sigma) (8 \pi) \Omega^{\sigma,\pi}(s) 2 \phi_1$ .
  - Winning-2 states s:  $(9 \pi) (8 \sigma) \Omega^{\sigma,\pi}(s) 2 \phi_2$ .
- Determinacy:
  - Every state is winning-1 or winning-2.
  - Borel determinacy [Martin 75].
  - Memoryless determinacy for parity games [Emerson/Jutla 91].



### Secure Equilibria



• Secure strategy profile  $(\sigma,\pi)$  at state s:

$$\begin{array}{l} (8 \ \pi') \ (\ v_{1}^{\sigma,\pi'} \ (s) < v_{1}^{\sigma,\pi} \ (s) \ ) \ \ v_{2}^{\sigma,\pi'} \ (s) < v_{2}^{\sigma,\pi} \ (s) \ ) \\ (8 \ \sigma') \ (\ v_{2}^{\sigma',\pi} \ (s) < v_{2}^{\sigma,\pi} \ (s) \ ) \ \ v_{1}^{\sigma',\pi} \ (s) < v_{1}^{\sigma,\pi} \ (s) \ ) \end{array}$$

- A secure profile (σ,π) is a contract:
   if the player-1 deviates to lower player-2's payoff,
   her own payoff decreases as well, and vice versa.
- Secure equilibrium: secure strategy profile that is also a Nash equilibrium.

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### State Space Partition



# Computing the Partition



hh2ii ( : 
$$\phi_1$$
 Ç  $\phi_2$  )

 $W_{10}$  hh1ii (  $\phi_1 \not = \vdots \phi_2$  )

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# Computing the Partition



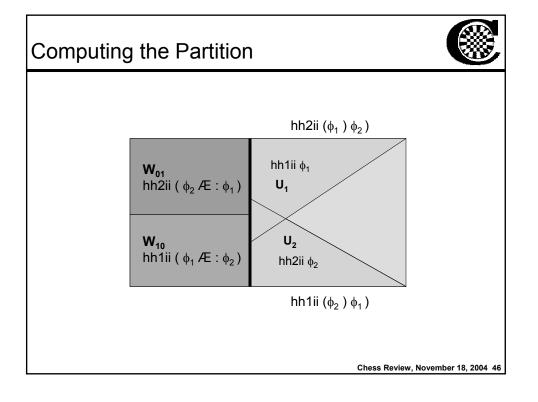
hh2ii 
$$(\phi_1) \phi_2$$

 $W_{01}$  hh2ii (  $\phi_2 \not E : \phi_1$  )

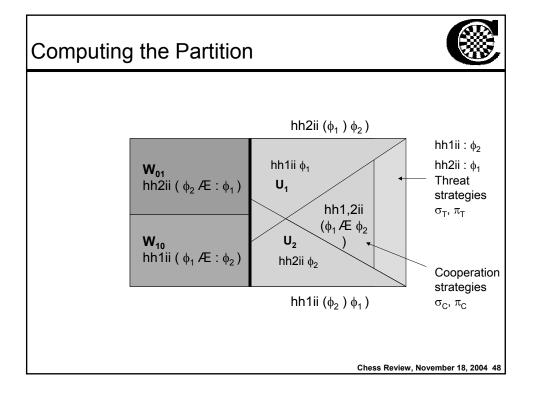
 $W_{10}$  hh1ii (  $\phi_1 \not = \phi_2$ )

hh1ii (
$$\phi_2$$
 )  $\phi_1$  )

# Computing the Partition $\begin{array}{c} hh2ii\ (\phi_1\ )\ \phi_2\ )\\ \hline\\ W_{01} \\ hh2ii\ (\phi_2\ \mathcal{A}:\phi_1) \\ \hline\\ W_{10} \\ hh1ii\ (\phi_1\ \mathcal{A}:\phi_2) \\ \end{array}$ $hh1ii\ (\phi_2\ )\ \phi_1\ )$ Chess Review, November 18, 2004 45

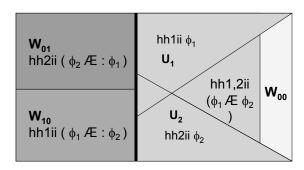


### 



# Computing the Partition





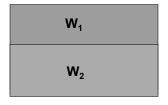
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# Generalization of Determinacy



Zero-sum games:  $\phi_2 = :\phi_1$ 

Non-zero-sum games:  $\phi_1$ ,  $\phi_2$ 





W <sub>01</sub>	$\mathbf{W}_{00}$
W <sub>10</sub>	<b>W</b> <sub>11</sub>

## Application: Compositional Verification



$$P_1 \ 2 \ W_1 \ (\phi_1)$$
  
 $P_2 \ 2 \ W_2 \ (\phi_2)$   
 $\phi_1 \not\leftarrow \Phi_2 \ ) \ \phi$ 

$$P_1||P_2|^2 \phi$$

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# Application: Compositional Verification



$$P_1||P_2|^2 \phi$$

$$P_1 \ 2 \ (\mathbf{W_{10}} \ [ \ \mathbf{W_{11}}) \ (\phi_1)$$
 $P_2 \ 2 \ (\mathbf{W_{01}} \ [ \ \mathbf{W_{11}}) \ (\phi_2)$ 
 $\phi_1 \not= \Phi_2 \ ) \ \phi$ 

$$P_1 || P_2^2 \phi$$

$$W_1 \frac{1}{2} W_{10} [W_{11} \\ W_2 \frac{1}{2} W_{01} [W_{11}$$

An assume/guarantee rule.

### Related In-Depth Talks



Roberto Passerone (11:50 am):

-semantics of hybrid systems

Aaron Ames (12:10 pm):

-stochastic approximation of hybrid systems

-a categorical theory of hybrid systems

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### **Related Posters**



Robust Hybrid Systems:

Blowing up Hybrid Systems (Aaron Ames) Quantitative Verification (Vinayak Prabhu)

Compositional Hybrid Systems:

Rich Interface Theories (Arindam Chakrabarti)

Stochastic Hybrid Systems:

Stochastic Games (Krishnendu Chatterjee)

Computational Hybrid Systems:

Computation of Reach Sets (Alex Kurzhansky)