

## An introduction to hybrid systems theory and applications



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DISC Summer School on

Modeling and Control of Hybrid Systems  
Veldhoven, The Netherlands

June 23-26, 2003

[http://icewww.et.tudelift.nl/~disc\\_ha/](http://icewww.et.tudelift.nl/~disc_ha/)



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### Support

NSF Career

NSF ITR

ARO MURI

DARPA MoBIES

Honeywell

Microsoft



## Goals for this mini-course

### Why hybrid systems ?

Emphasis on engineering and biological examples

### Modeling of hybrid systems

Emphasis on abstraction and refinement

### Analysis of hybrid systems

Emphasis on algorithmic verification

### Synthesis of hybrid controllers

Emphasis on temporal logic synthesis

**Warning :** All questions and answers are biased and incomplete!



## Some references

### Bisimilar linear systems

George J. Pappas  
Automatica. To appear in 2003.

### Model checking LTL over controllable linear systems is decidable

Paulo Tabuada and George J. Pappas  
Hybrid Systems - Computation and Control, Lecture Notes in Computer Science, Prague, Czech Republic, April 2003

### Modeling and analyzing biomolecular networks

Rajeev Alur, Colin Baltz, Vijay Kumar, Max Mintz, George J. Pappas, Harvey Rubin, and Jonathan Schug  
Computing in Science and Engineering, 4(1):20-31, January 2002.

### Symbolic reachability computations for families of linear vector fields

G. Lafferriere, G. J. Pappas, and S. Yovine  
Journal of Symbolic Computation, 32(3):231-253, September 2001.

### Discrete abstractions of hybrid systems

R. Alur, T. Henzinger, G. Lafferriere, G. Pappas  
Proceedings of the IEEE, 88(2):971-984, July 2000.

### Hierarchically consistent control systems

George J. Pappas, Gerardo Lafferriere, and Shankar Sastry  
IEEE Transactions on Automatic Control, 45(6):1144-1160, June 2000.

### O-minimal hybrid systems

G. Lafferriere, G. J. Pappas, and S. Sastry  
Mathematics of Control, Signals, and Systems, 13(1):1-21, March 2000.

### Decidable controller synthesis for classes of linear systems

Omid Shakhmura, George J. Pappas, and Shankar Sastry  
Hybrid Systems - Computation and Control, Lecture Notes in Computer Science, volume 1790, Springer, 2000



## Outline of this mini-course

### Lecture 1 : Monday, June 23

Examples of hybrid systems, modeling formalisms

### Lecture 2 : Monday, June 23

Transitions systems, temporal logic, refinement notions

### Lecture 3 : Tuesday, June 24

Discrete abstractions of hybrid systems for verification

### Lecture 4 : Tuesday, June 24

Discrete abstractions of continuous systems for control

### Lecture 5 : Thursday, June 26

Bisimilar control systems



## Why hybrid ?

## Enabling technologies

Advances in sensor and actuator technology  
GPS, control of quantum systems

Invasion of powerful microprocessors in physical devices  
Sophisticated software/hardware on board

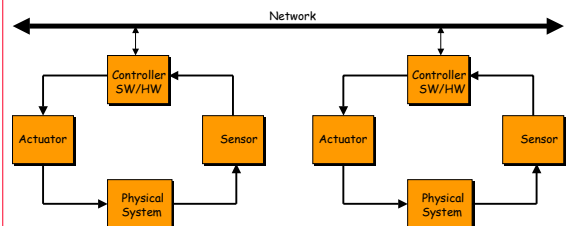
Networking everywhere  
Interconnects subsystems

## Emerging applications...

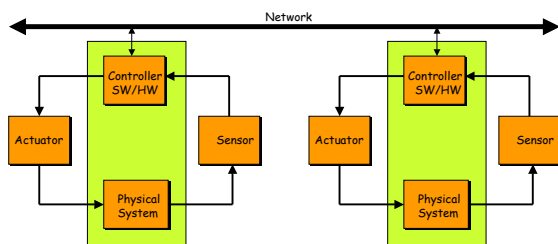


Latest BMW : 72 networked microprocessors  
Boeing 777 : 1280 networked microprocessors

## Networked embedded systems...

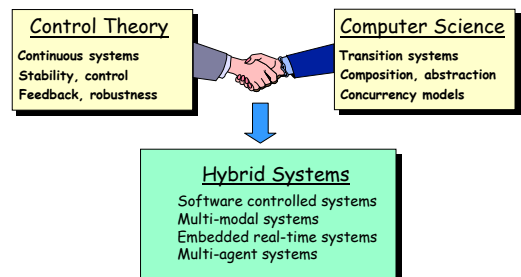


## Networked embedded systems...

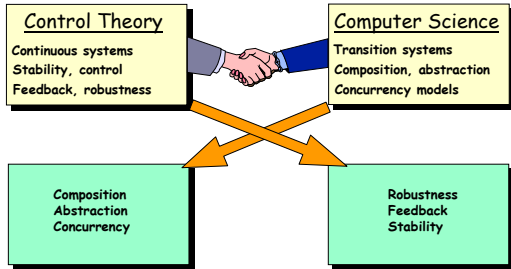


Physical system is continuous, software is discrete

## Discrete and Continuous



## Exporting Science



## Different views...

### Computer science perspective

View the physics from the eyes of the software  
Modeling result : Hybrid automaton

### Control theory perspective

View the software from the eyes of the physics  
Modeling result : Switched control systems

## Hybrid behavior arises in

### Hybrid dynamics

Hybrid model is a simplification of a larger nonlinear model

### Quantized control of continuous systems

Input and observation sets are finite

### Logic based switching

Software is designed to supervise various dynamics/controllers

### Partial synchronization of many continuous systems

Resource allocation for competing multi-agent systems

### Hybrid specifications of continuous systems

Plant is continuous, but specification is discrete or hybrid...

## Logic based switching

## Nuclear reactor example

Without rods

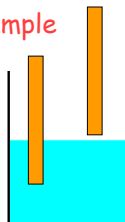
$$\dot{T} = 0.1T - 50$$

With rod 1

$$\dot{T} = 0.1T - 56$$

With rod 2

$$\dot{T} = 0.1T - 60$$

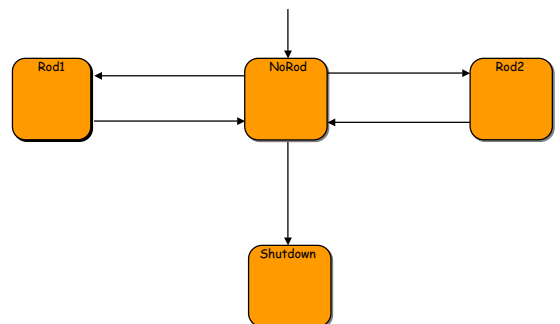


Rod 1 and 2 cannot be used simultaneously

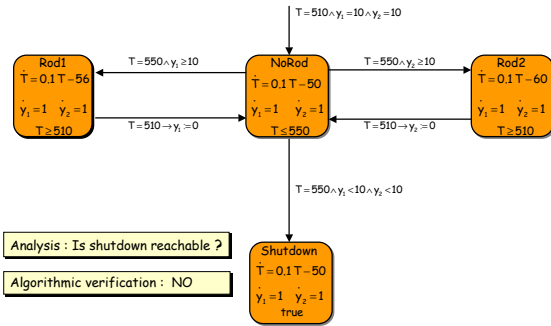
Once a rod is removed, you cannot use it for 10 minutes

**Specification :** Keep temperature between 510 and 550 degrees.  
If  $T=550$  then either a rod is available or we shutdown the plant.

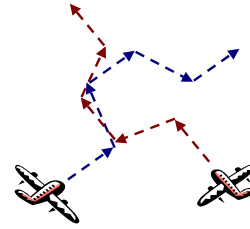
## Software model of nuclear reactor



## Hybrid model of nuclear reactor



## Conflict Resolution in ATM\*

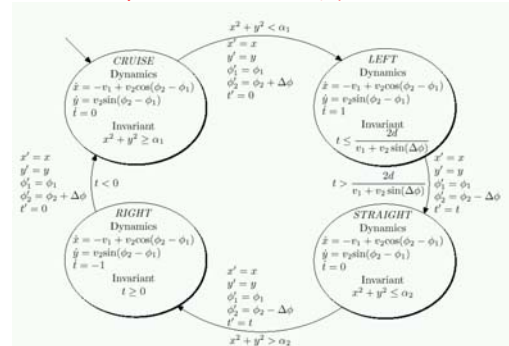


## Conflict Resolution Protocol

1. Cruise until  $a_1$  miles away
2. Change heading by  $\Delta\phi$
3. Maintain heading until lateral distance  $d$
4. Change to original heading
5. Change heading by  $-\Delta\phi$
6. Maintain heading until lateral distance  $-d$
7. Change to original heading

Is this protocol safe?

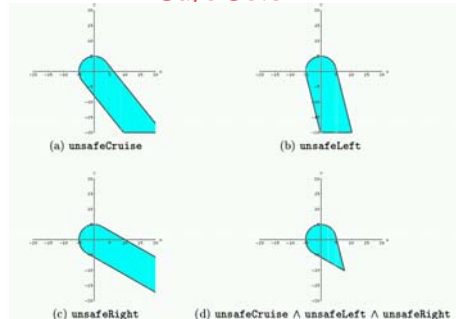
## Conflict Resolution Maneuver



## Computing Unsafe Sets

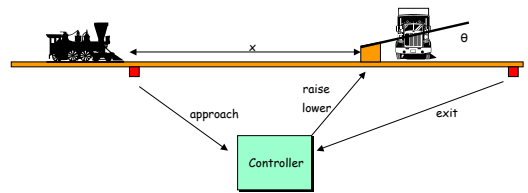
$$\begin{aligned} \text{unsafeCruise} &= \text{Resolve} \left[ \exists t > 0 \wedge (x - v_1 t + \lambda v_2 t)^2 + (y + \sqrt{1 - \lambda^2} v_2 t)^2 \leq 25 \right] \\ &= \left( y < -\frac{30}{\sqrt{11}} \wedge -\sqrt{41} - \frac{3}{4} \leq x \leq \sqrt{41} - \frac{3}{4} \right) \vee \left( y = -\frac{30}{\sqrt{11}} \wedge -\sqrt{41} - \frac{3}{4} < x \leq \sqrt{41} - \frac{3}{4} \right) \vee \\ &\quad \left( y = \frac{30}{\sqrt{11}} \wedge -\sqrt{25 - y^2} < x < \sqrt{41} - \frac{3}{4} \right) \vee \left( \frac{30}{\sqrt{11}} \leq y < 5 \wedge -\sqrt{25 - y^2} < x < \sqrt{25 - y^2} \right) \vee \\ &\quad \left( -\frac{30}{\sqrt{11}} < y < \frac{30}{\sqrt{11}} \wedge -\sqrt{25 - y^2} < x \leq \sqrt{41} - \frac{3}{4} \right) \\ \\ \text{unsafeLeft} &= \text{Resolve} \left[ \exists t > 0 \wedge (x - v_1 t + \lambda v_2 t)^2 + (y + \sqrt{1 - \lambda^2} v_2 t)^2 \leq 25 \right] \\ &= \left( y < -\frac{30}{\sqrt{11}} \wedge -\frac{3\sqrt{41}}{4} - \frac{3}{4} \leq x \leq \frac{3\sqrt{41}}{4} - \frac{3}{4} \right) \vee \left( y = -\frac{30}{\sqrt{11}} \wedge -\frac{3\sqrt{41}}{4} - \frac{3}{4} < x \leq \frac{3\sqrt{41}}{4} - \frac{3}{4} \right) \vee \\ &\quad \left( y = \frac{30}{\sqrt{11}} \wedge -\sqrt{25 - y^2} < x < \frac{3\sqrt{41}}{4} - \frac{3}{4} \right) \vee \left( \frac{30}{\sqrt{11}} < y < 5 \wedge -\sqrt{25 - y^2} < x < \sqrt{25 - y^2} \right) \vee \\ &\quad \left( -\frac{30}{\sqrt{11}} < y < \frac{30}{\sqrt{11}} \wedge -\sqrt{25 - y^2} < x \leq \frac{3\sqrt{41}}{4} - \frac{3}{4} \right) \\ \\ \text{unsafeRight} &= \text{Resolve} \left[ \exists t > 0 \wedge (x - v_1 t + \lambda v_2 t)^2 + (y + \sqrt{1 - \lambda^2} v_2 t)^2 \leq 25 \right] \\ &= \left( y < -7\sqrt{\frac{13}{11}} \wedge -\frac{3\sqrt{41}}{4} - \frac{3}{4} \leq x \leq \frac{3\sqrt{41}}{4} - \frac{3}{4} \right) \vee \left( y = -7\sqrt{\frac{13}{11}} \wedge -\frac{3\sqrt{41}}{4} - \frac{3}{4} < x \leq \frac{3\sqrt{41}}{4} - \frac{3}{4} \right) \vee \\ &\quad \left( y = 7\sqrt{\frac{13}{11}} \wedge -\sqrt{25 - y^2} < x < \frac{3\sqrt{41}}{4} - \frac{3}{4} \right) \vee \left( 7\sqrt{\frac{13}{11}} < y < 5 \wedge -\sqrt{25 - y^2} < x < \sqrt{25 - y^2} \right) \vee \\ &\quad \left( -7\sqrt{\frac{13}{11}} < y < 7\sqrt{\frac{13}{11}} \wedge -\sqrt{25 - y^2} < x \leq \frac{3\sqrt{41}}{4} - \frac{3}{4} \right) \end{aligned}$$

## Safe Sets



## Partial synchronization (Concurrency)

## The train gate

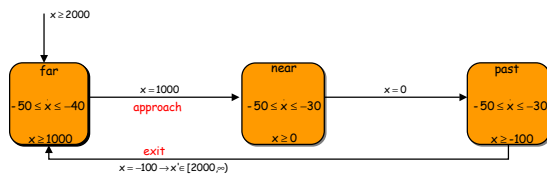


System = Train || Gate || Controller

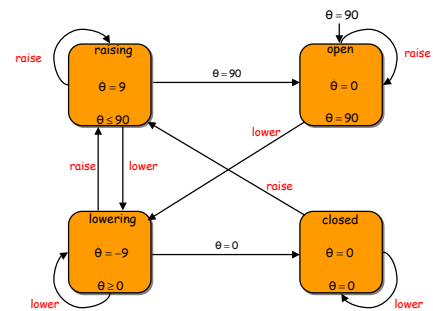
**Safety specification** : If train is within 10 meters of the crossing, then gate should completely closed.

**Liveness specification** : Keep gate open as much as possible.

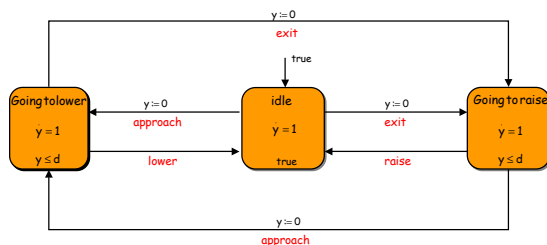
## Train model



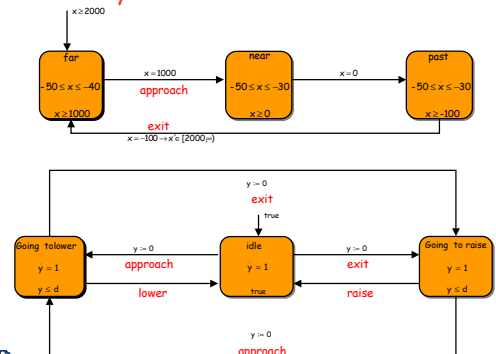
## Gate model



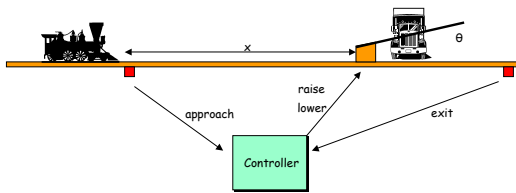
## Controller model



## Synchronized transitions



## Verifying the controller



System = Train || Gate || Controller

**Safety specification** : Can we avoid the set  $\theta > 0 \wedge (-10 \leq x \leq 10)$  ?

**Parametric HyTech verification** : YES if  $d \leq \frac{49}{5}$



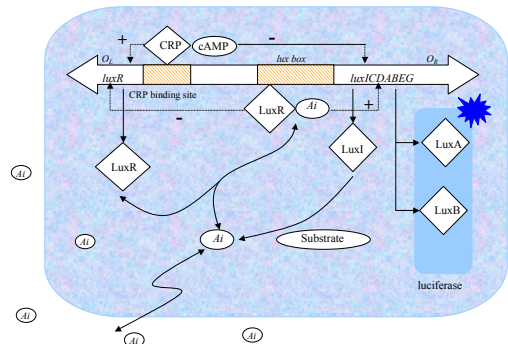
## Hybrid dynamics



## Quorum sensing in *V. fischeri*

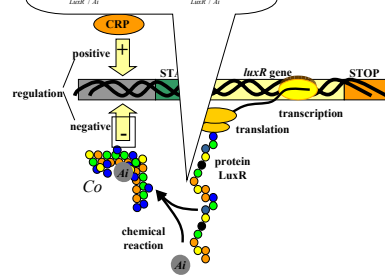


## Quorum sensing in *V. fischeri*



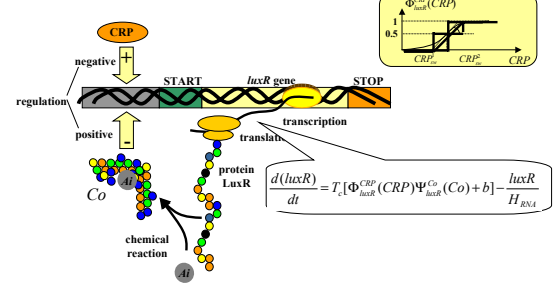
## Modeling of biological systems

$$\frac{d(LuxR)}{dt} = T_l \cdot LuxR - \frac{LuxR}{H_{sp}} - r_{LuxR/AI} \cdot LuxR + r_{LuxR/Co} \cdot Co \pm \text{transport}$$



## Modeling of biological systems

$$\frac{d[x]}{dt} = \text{synthesis} - \text{decay} \pm \text{transform} \pm \text{transport}$$



## V. fischeri mathematical model

$$\frac{d(luxR)}{dt} = T_c(p_{lq} + b) - \frac{luxR}{H_{RNA}}$$

$$\frac{d(luxICDABEG)}{dt} = T_c(p_{Ai} + b) - \frac{luxICDABEG}{H_{RNA}}$$

$$\frac{d(LuxR)}{dt} = T_l \frac{luxR}{H_{sp}} - k_1 LuxR_{Ai} - i + k_{-1} Co$$

$$\frac{d(LuxI)}{dt} = T_l \frac{luxICDABEG}{H_{sp}} - \frac{LuxI}{H_{sp}}$$

$$\frac{d(Ai - i)}{dt} = (k_2 LuxI) S - \frac{Ai - i}{H_{Ai}} - k_1 LuxR_{Ai} - i + k_{-1} Co + n(Ai - e - Ai - i)$$

$$\frac{d(Co)}{dt} = -\frac{Co}{H_{sp}} + k_1 LuxR_{Ai} - i - k_{-1} Co$$

$$\frac{d(Ai - e)}{dt} = -\frac{Ai - e}{H_{Ai}} - n(Ai - e - Ai - i)$$

$$\frac{d(CRP)}{dt} = S_2$$

Co	CRP	% act
Co<Co_sw_1	CRP<CRP_sw_1	pl <sub>10</sub>
Co<Co_sw_1	CRP<CRP_sw_1	pl <sub>11</sub>
Co<Co_sw_1	CRP<CRP_sw_1	pl <sub>10</sub>
Co<Co_sw_1	CRP<CRP_sw_1	pl <sub>11</sub>

*luxR*

Co	CRP	% act
Co<Co_sw_r	CRP<CRP_sw_r	pr <sub>10</sub>
Co<Co_sw_r	CRP<CRP_sw_r	pr <sub>11</sub>
Co<Co_sw_r	CRP<CRP_sw_r	pr <sub>10</sub>
Co<Co_sw_r	CRP<CRP_sw_r	pr <sub>11</sub>

*luxICDABEG*

## BioCharon = BioSketchPad + Charon



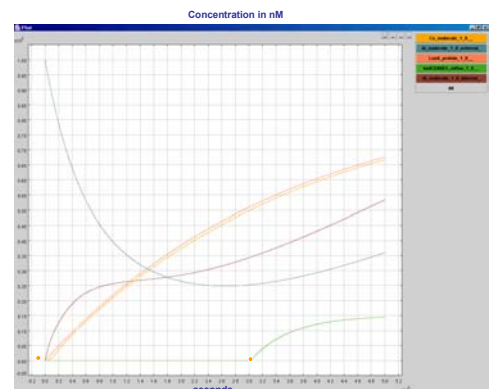
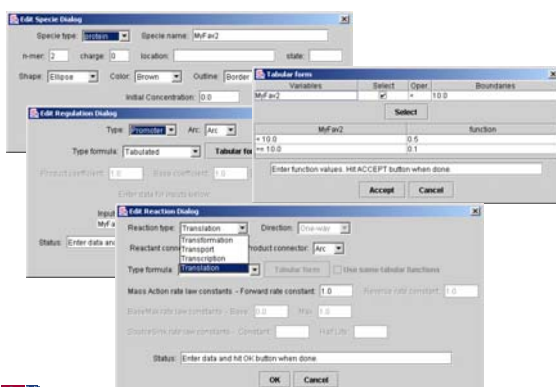
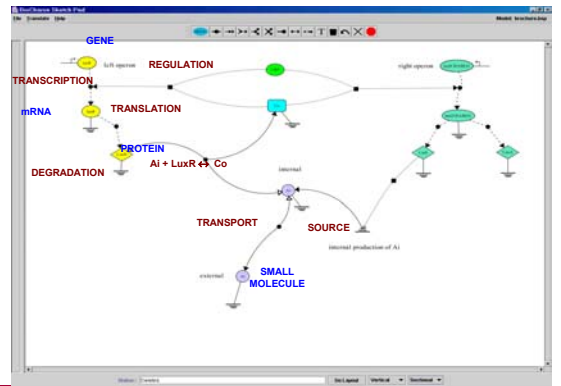
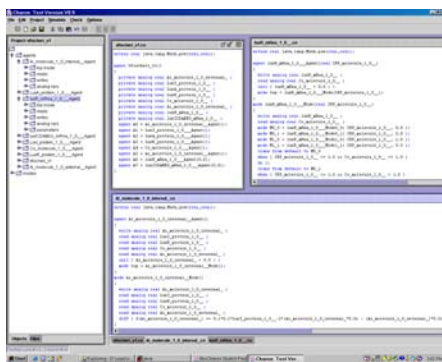
BioSketchPad

Biologist-friendly environment for representing, storing, simulating, and analyzing biomolecular networks.



Charon

A programming language for modeling, simulating, analyzing, and designing hybrid systems



## Research Issues

### Modeling Issues

- Well posedness, robustness, zenoness

### Analysis

- Stability issues, qualitative theory, parametric analysis

### Verification

- Algorithmic methods that verify system performance

### Controller Synthesis

- Algorithmic methods that design hybrid controllers

### Simulation

- Mixed signal simulation, event detection, modularity

### Code generation

- From hybrid models to embedded code

### Complexity

- Compositionality and hierarchies

Tools : HyTech, Checkmate, d/dt, HYSDEL, Stateflow, Charon

