

# Safety Verification of Hybrid Systems

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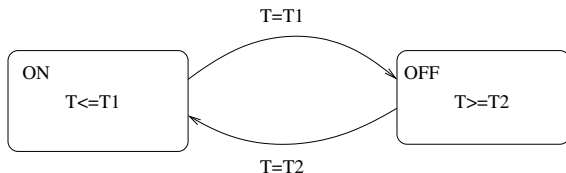
November 30, 2009

# Hybrid System

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- ▶ Example: Thermostat



$$\dot{T}_{on} = c_1(T - T_0) + c_2$$
$$\dot{T}_{off} = c_1(T - T_0)$$

## Definition of Hybrid System

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- ▶ **Jump**: Relation on State pairs. If two states are in jump relation, there is possible discrete transition between them

# What can we model with Hybrid Systems?

- ▶ Various traffic protocols within project AVACS  
<http://avacs.org>
  - ▶ Aircraft collision avoidance protocol
  - ▶ ETCS European Train Control System
- ▶ Embedded systems
  - ▶ Consumer and household products
  - ▶ Office, telecommunications devices
  - ▶ Medicine measurement and treatment devices
- ▶ Networking and locking protocols
- ▶ Physical systems with impact

# Verification of Hybrid System

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**Verification:** Algorithm that for each safe Hybrid System finishes in finite time and proves its safety

**Correctness** of algorithm should not be hampered by floating-point rounding errors (reliable computing)



# Basic Verification Algorithm

- ▶ We **split** continuous statespace into multidimensional intervals - **boxes**
- ▶ Box and Mode form **abstract state** of the Hybrid System. We explore **possible transitions** between abstract states. This involves solving quantified constraints.
- ▶ If there is a route from initial to unsafe abstract state, we **refine abstraction** by splitting one of the boxes

# Basic Verification Algorithm

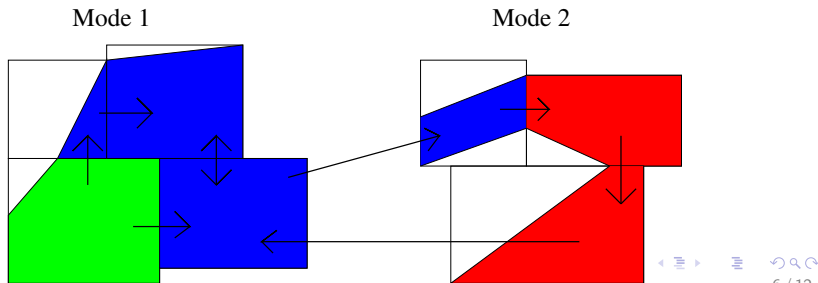
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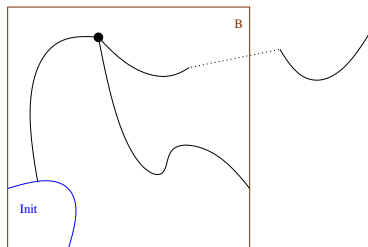
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# Reach Set Constraint

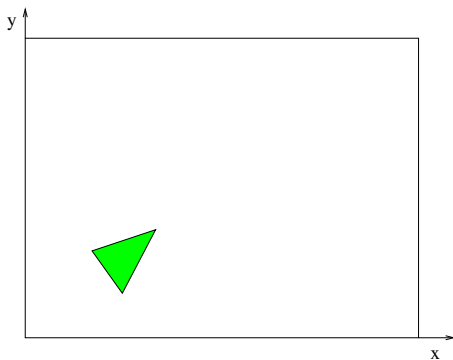
A point in a box  $B$  can be reachable

- ▶ from the **initial set** via a flow in  $B$
- ▶ from a **jump** via a flow in  $B$
- ▶ from a **neighboring box** via a flow in  $B$



# Reachability Analysis Using Constraints

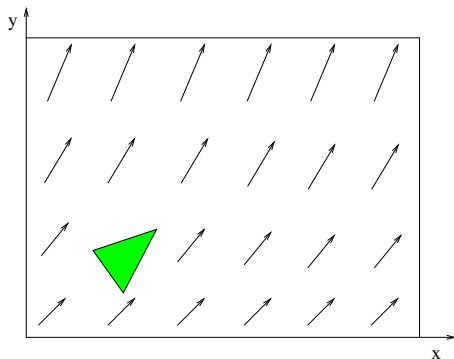
Single box and initial states



$Init(x_0, y_0)$

# Reachability Analysis Using Constraints

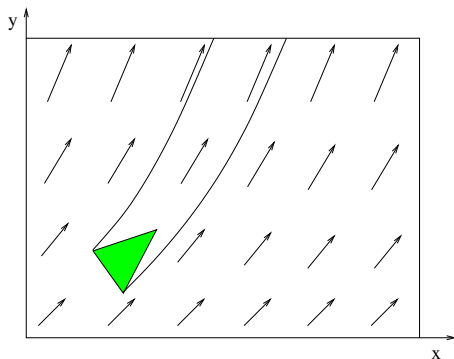
Vector field for **derivatives**



$$\text{Init}(x_0, y_0) \wedge \text{Flow}(x_d, y_d, x_a, y_a)$$

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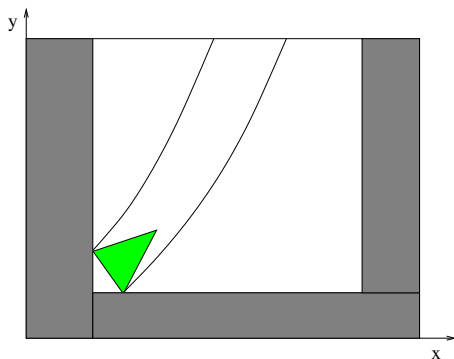
Reachable states for this example



$$Init(x_0, y_0) \wedge Flow(x_d, y_d, x_a, y_a)$$

## Reachability Analysis Using Constraints

We create a constraint that **overapproximates** the reachable set and solve it, using **interval methods**

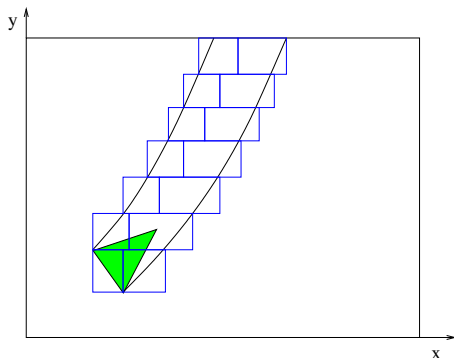


$$\begin{aligned} &\exists x_0, y_0, x_a, y_a, t : \\ &Init(x_0, y_0) \wedge Flow(x_d, y_d, x_a, y_a) \wedge \\ &x = x_0 + t * x_d \wedge y = y_0 + t * y_d \end{aligned}$$



# Reachability Analysis Using Constraints

**Splitting** reduces overapproximation



$$\begin{aligned} &\exists x_0, y_0, x_a, y_a, t : \\ &Init(x_0, y_0) \wedge Flow(x_d, y_d, x_a, y_a) \wedge \\ &x = x_0 + t * x_d \wedge y = y_0 + t * y_d \end{aligned}$$

# Method Properties

**Advantages** of this method:

- ▶ Possible **non-linear** Init, Flow, Unsafe and Jump constraint
- ▶ **Speed** of one solving step
- ▶ **Simple** hyper-rectangle representation
- ▶ Safe rounding

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**Disadvantage** of the method:

- ▶ Potentially big amount of **overapproximation**

# Tools We Use for Verification

**RSolver** - algorithm for solving quantified inequality constraints

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All computations have to be **rounding-safe**

- ▶ Use of interval arithmetic library

## Future Work

Improving **abstraction**: Use polyhedrons or Taylor Models instead of boxes

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Improving **verification algorithm**

- ▶ Exact solution for certain types of ODEs
- ▶ Polyhedral Quantifier Elimination
- ▶ Reduce Wrapping Effect
- ▶ Increase degree of Taylor constraint
- ▶ SAT modulo ODE
- ▶ LP Solver on linear jumps/flows etc.

# References

- ▶ T. Dzetkulič, S. Ratschan: How to Capture Hybrid Systems Evolution into Slices of Parallel Hyperplanes, ADHS 2009
- ▶ S. Ratschan and Z. She: Safety verification of hybrid systems by constraint propagation based abstraction refinement, HSCC 2005
- ▶ <http://hsolver.sourceforge.net/>