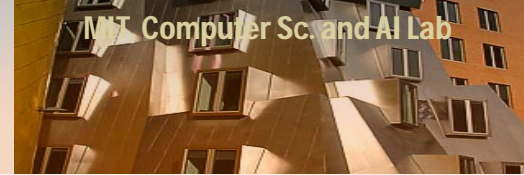




Verifying Average Dwell Time

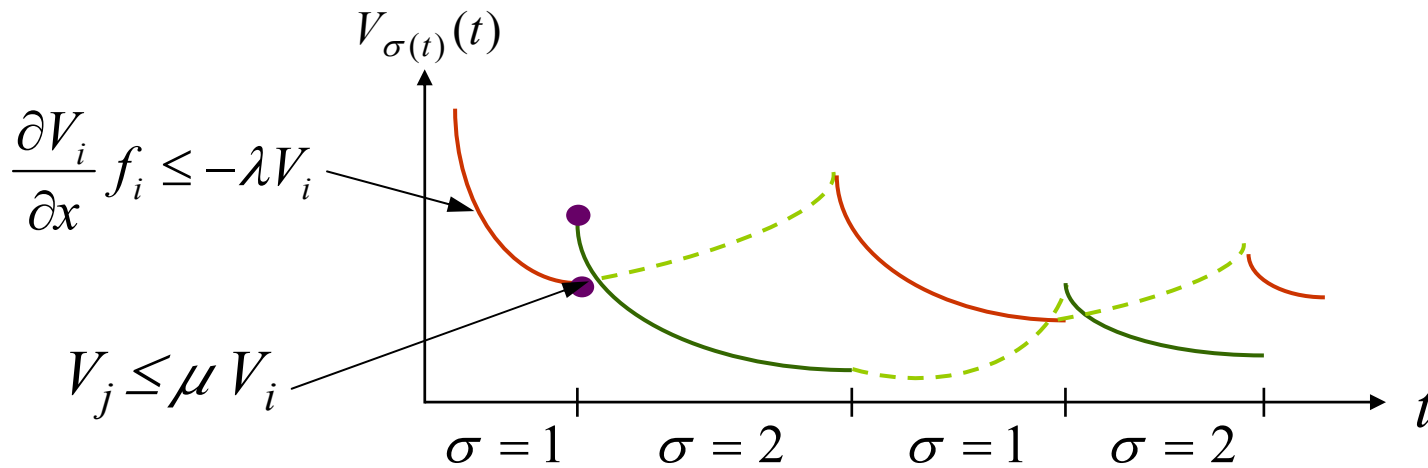
by solving optimization problems

Sayan Mitra, Nancy Lynch and Daniel Liberzon
HSCC 2006, Santa Barbara



- Stability properties arise naturally, some examples:
 - Switching supervisory controllers
 - Mobile robots starting from *arbitrary* positions must eventually converge, say on a circle
 - Real-time distributed computing with failures; *once failures stop*, the processes must perform some useful computation.

Stability Under Slow Switchings



- ADT characterizes switching signal σ
- **Definition:** Hybrid automaton A has **average dwell time (ADT)** T if there exists a constant N_0 such that for every execution α of A ,

$$N(\alpha) \leq N_0 + \text{dur}(\alpha)/T.$$

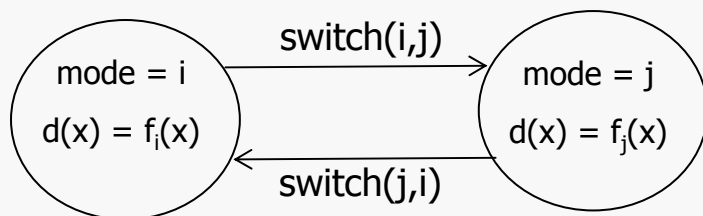
$N(\alpha)$: # mode switches in α , $\text{dur}(\alpha)$: duration of α

Extra switches: $S_T(\alpha) \equiv N(\alpha) - \text{dur}(\alpha) / T$

Problem statement

- **Theorem** (Morse & Hespanha): For stability it suffices to show that the modes of A have a set of **Lyapunov functions** (λ, μ) and that the **ADT of $A > \log \mu / \lambda$** .

- Given hybrid automaton A and $T > 0$, we want to check if T is an ADT for A ?
What is the ADT of A ?
 - Invariant-based method [**M-Liberzon: CDC04**]
 - Optimization-based method for verifying ADT
 - ADT preserving abstraction: switching simulations

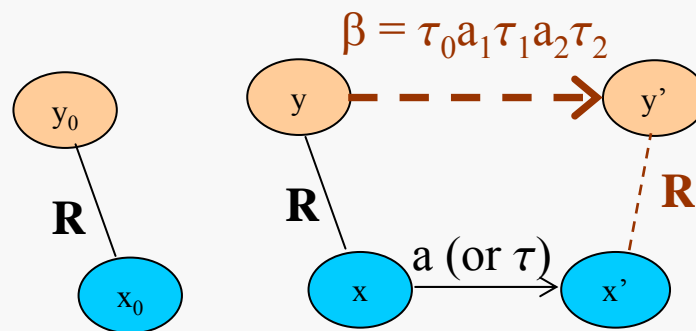


- X : set of state variables, A : set of actions
- Actions bring about state *transitions* (*mode switches*), $x \rightarrow_a x'$
- A *trajectory* of X is a function $\tau: [0, t] \rightarrow \text{val}(X)$
- An *execution* is a sequence $\alpha = \tau_0 a_1 \tau_1 a_2 \tau_2 \dots$ $\text{dur}(\alpha) = \sum_i \text{dur}(\tau_i)$

- Notion of external behavior, **input/output actions and variables**
- Abstraction/ implementation relations
- Compositionality

Switching simulation

- Consider two hybrid automata A and B . A relation $R \subseteq X_A \times X_B$ is a *switching simulation relation* from A to B if:
 - For every start state of A there is a related start state of B
 - If $x \in X_A$, $y \in X_B$, $x R y$ and
 - $x \xrightarrow{a} x'$, exists an **execution fragment** β of B ,
s.t. $y \xrightarrow{\beta} y'$ & $x' R y'$ & $N(\beta) \geq 1$, $\text{dur}(\beta)=0$
 - $x \xrightarrow{\tau} x'$, exists an **execution fragment** β of B ,
s.t. $y \xrightarrow{\beta} y'$ & $x' R y'$ & $\text{dur}(\tau) \geq \text{dur}(\beta)$



Switching simulations

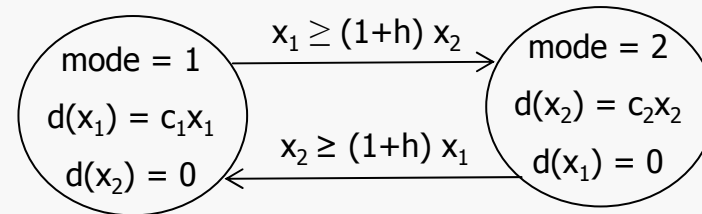
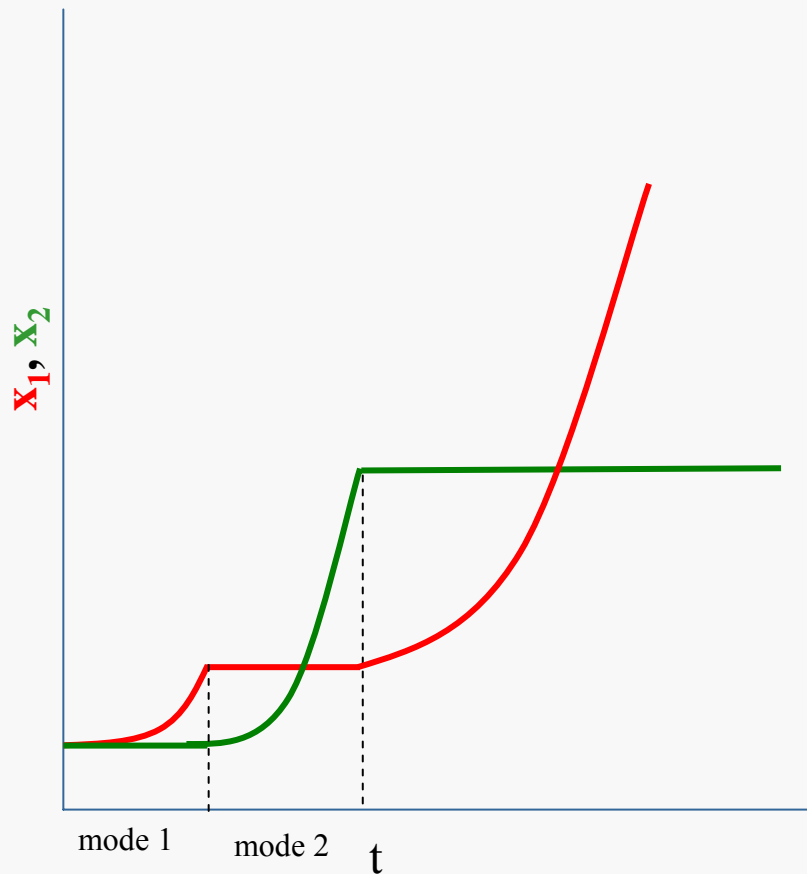
$$\mathbf{R} \subseteq X_A \times X_B$$

1. For every start state of A there is a related start state of B
2. If $x \mathbf{R} y$ and $x \xrightarrow{a} x'$, $\exists \beta$, s.t. $y \xrightarrow{\beta} y'$ & $x' \mathbf{R} y'$ & $N(\beta) \geq 1$, $\text{dur}(\beta) = 0$
3. If $x \mathbf{R} y$ and $x \xrightarrow{\tau} x'$, $\exists \beta$, s.t. $y \xrightarrow{\beta} y'$ & $x' \mathbf{R} y'$ & $\text{dur}(\tau) \geq \text{dur}(\beta)$

- Suppose \mathbf{R} is a switching simulation relation from A to B and T be ADT of A
- Consider any execution $\alpha = \tau_0 a_1 \tau_1 a_2 \tau_2 \dots$ of A
- Inductively construct a corresponding execution η of B
- $S_T(\eta) \geq S_T(\alpha)$

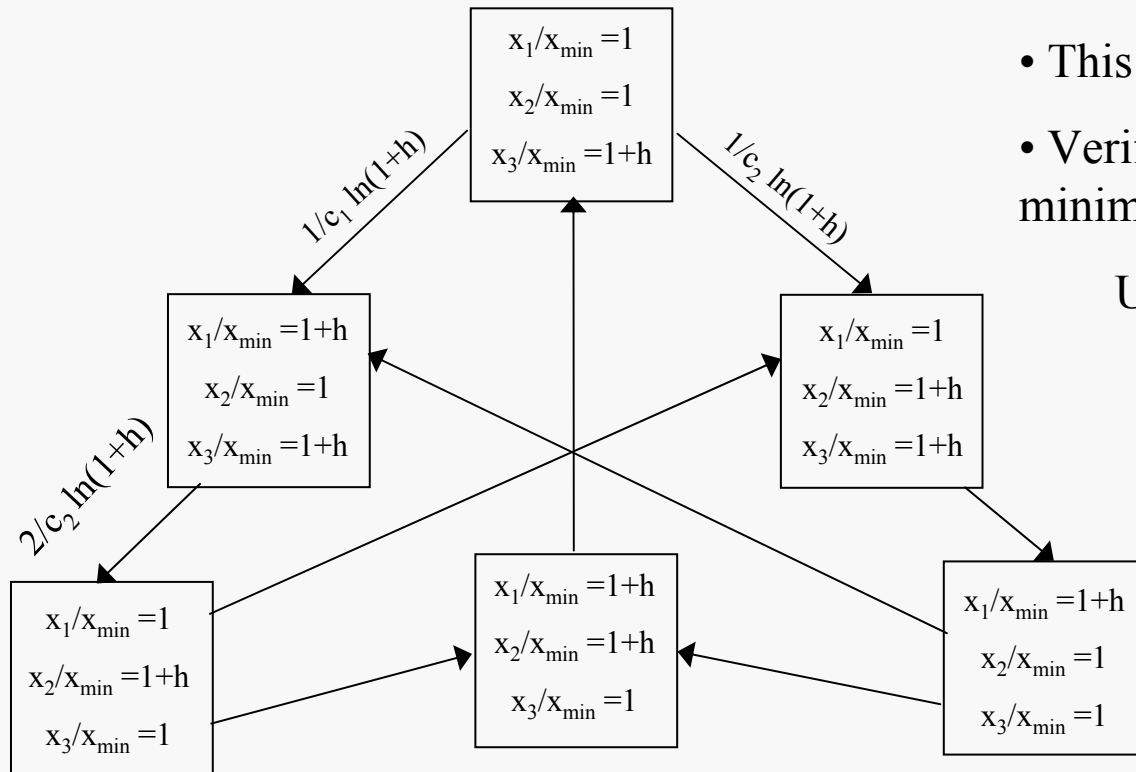
□ **Theorem:** \mathbf{R} is a switching simulation from A to $B \implies \text{ADT of } A \geq \text{ADT of } B$.

Linear Hysteresis switch



- Not initialized hybrid automaton
- Abstraction using switching simulation

Simple Abstraction



- This is in fact a *one-clock initialized*
- Verifying ADT reduces to finding minimum mean cost cycle.

Use e.g., Karp's algorithm.

$$R = \begin{cases} \pi(y.mode) = x.mode \wedge \\ \pi(y.mode) = j \Rightarrow \frac{x.\mu_j}{x.\mu_{\min}} = e^{c_j y.t} \wedge \\ \pi(y.mode) \neq j \Rightarrow \frac{x.\mu_j}{x.\mu_{\min}} = y.mode[i][j], i \in \{1,2\} \end{cases}$$

Optimization problem

$$\square N(\alpha) \leq N_0 + \text{dur}(\alpha)/T$$

$$\square S_T(\alpha) \equiv N(\alpha) - \text{dur}(\alpha) / T$$

$$\square \text{OPT}(T): \alpha^* \in \arg \max_{\alpha \in \text{execs}} S_T(\alpha)$$

If $S_T(\alpha^*)$ is bounded then T is ADT for \mathbf{A} ,

Otherwise, α^* an execution violating ADT T

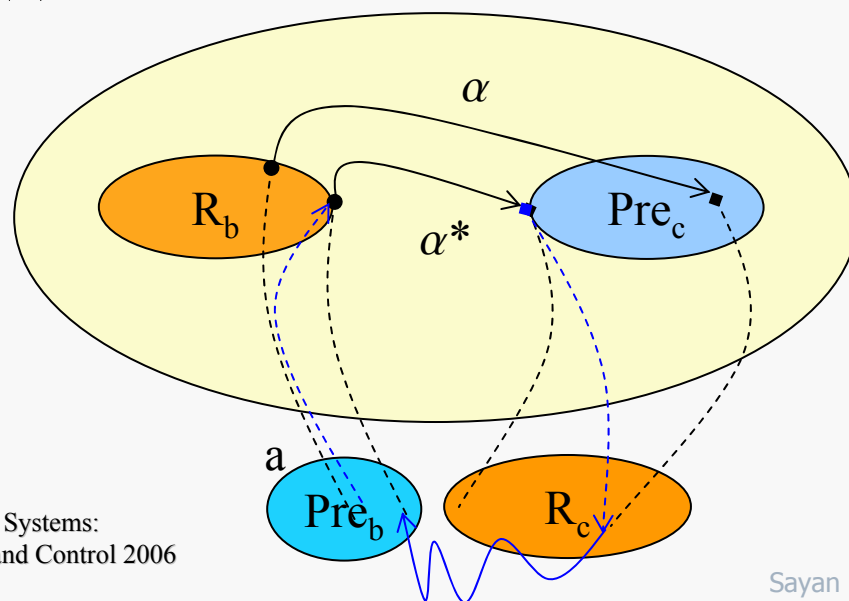
Optimization based approach

Theorem (part 1): If $\max_{\alpha \in \text{cycles}} S_T(\alpha) > 0$ then $\text{OPT}(T)$ is unbounded.

- If \exists a cycle with $S_T(\alpha) > 0$ then $\alpha . \alpha . \alpha \dots$ is an execution with unbounded extra switches.

Theorem (part 2): For initialized and rectangular A , $\text{OPT}(T)$ is unbounded only if $\max_{\alpha \in \text{cycles}} S_T(\alpha) > 0$.

- If $\text{OPT}(T)$ is unbounded, \exists execution α , $S_T(\alpha) > m^3$.
- $N(\alpha) > m^3 + \text{dur}(\alpha)/T$.
- \exists sequence of 3 modes that repeat in α , say a-b-c.
- Since A is rectangular and initialized, \exists cyclic α^* such that $S_T(\alpha^*) \geq S_T(\alpha)$.



MILP formulation

Mixed Integer Linear Program to find cycles with extra switches for initialized rectangular automata.

$$\text{Objective function: } S_{\tau_a} : \frac{K}{2} - \frac{1}{\tau_a} \sum_{i=0,2,\dots}^K t_i$$

$$\text{Mode: } \forall i \in \{0, 2, \dots, K\}, \sum_{j=1}^N m_{ij} = 1 \text{ and } \forall i \in \{1, 3, \dots, K-1\}, \sum_{j=1}^N \sum_{k=1}^N p_{ijk} = 1 \quad (1)$$

$$\text{Cycle: } \mathbf{x}_0 = \mathbf{x}_K \text{ and } \forall j \in \{1, \dots, N\}, m_{0j} = m_{Kj} \quad (2)$$

$$\text{Preconds: } \forall i \in \{1, 3, \dots, K-1\}, \sum_{j=1}^N \sum_{k=1}^N G[j, k] \cdot p_{ijk} \cdot \mathbf{x}_i \leq \sum_{j=1}^N \sum_{k=1}^N p_{ijk} \cdot g[j, k] \quad (3)$$

$$\text{Initialize: } \forall i \in \{1, 3, \dots, K-1\}, \sum_{j=1}^N \sum_{k=1}^N R[j, k] \cdot p_{ijk} \cdot \mathbf{x}_{i+1} \leq \sum_{j=1}^N \sum_{k=1}^N p_{ijk} \cdot r[j, k] \quad (4)$$

$$\text{Invariants: } \forall i \in \{0, 2, \dots, K\}, \sum_{j=1}^N A[j] \cdot m_{ij} \cdot \mathbf{x}_i \leq \sum_{j=1}^N m_{ij} \cdot a[j] \quad (5)$$

$$\text{Evolve: } \forall i \in \{0, 2, \dots, K\}, \mathbf{x}_{i+1} = \mathbf{x}_i + \sum_{j=1}^N c[j] \cdot m_{ij} \cdot t_i \quad (6)$$

Conclusions

- Using powerful existing tools (MILP) for verifying ADT, i.e., proving stability.
- Switching simulations for abstractions

Future work

- Probabilistic hybrid systems and stability in the stochastic setting, using Lyapunov function like techniques
- Explore other properties that are quantified over executions; liveness properties
- Finding switching simulations automatically ?