

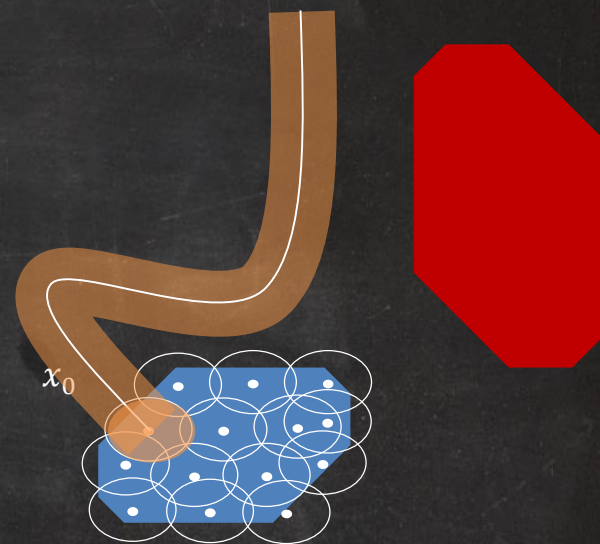


# **SIMULATION TO PROOFS IN C2E2**

**Parasara Sridhar Duggirala**

# A simple (often the only) strategy

- Given start  and target 
- Compute finite cover of initial set
- Simulate from the center  $x_0$  of each cover
- **Bloat** simulation so that bloated tube contains all trajectories from the cover
- Union = over-approximation of reach set
- Check intersection/containment with  $T$
- Refine



- How much to bloat?
- How to handle mode switches?

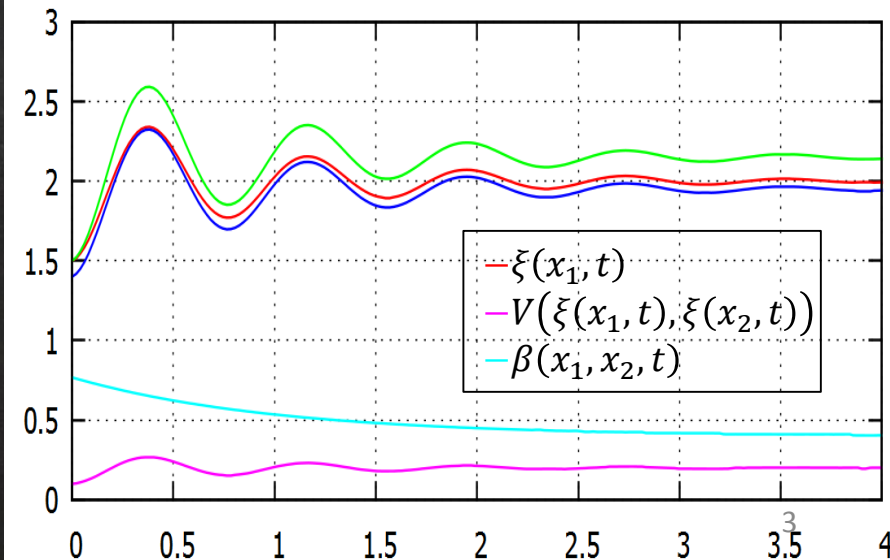
[Girard et al 2006],  
[Donze et al 2008],...  
(obviously incomplete)

# Discrepancy (Spirit of Loop Invariants)

**Definition.**  $\beta: \mathbb{R}^{2n} \times \mathbb{R}^{\geq 0} \rightarrow \mathbb{R}^{\geq 0}$  defines a **discrepancy** of the system if for any two states  $x_1$  and  $x_2 \in X$ , For any  $t$ ,

1.  $|\xi(x_1, t) - \xi(x_2, t)| \leq \beta(x_1, x_2, t)$  and
2.  $\beta \rightarrow 0$  as  $x_1 \rightarrow x_2$

```
x := 0
invariant x ≤ 10
until x ≥ 10
do
    x := x + 1
od
```





# Computing Discrepancy

If  $L$  is a Lipschitz constant for  $f(x,t)$  then  $|\xi(x_1, t) - \xi(x_2, t)| \leq e^{Lt} |x_1 - x_2|$ .

If  $\dot{x} = Ax$  Lyapunov function  $x^T M x$  that proves exponential stability, then  $|\xi(x_1, t) - \xi(x_2, t)| \leq K e^{\gamma t} |x_1 - x_2|$  where  $K = \text{Func}(M)$

Similar observation by [\[Deng et al 2013\]](#)

What about Nonlinear Systems?

# Computing Discrepancy

If  $M$  is a contraction metric, that is, a positive definite matrix such that  $\exists b_M > 0: J^T M + M J + b_M M \preceq 0$ , where  $J$  is the Jacobian for  $f$ , then  $\exists k, \delta > 0$  such that  $|\xi(x, t) - \xi(x', t)|^2 \leq k|x - x'|^2 e^{-\delta t}$  [Lohmiller & Slotine '98].

New algorithm: computes local discrepancy by estimating maximum eigenvalue of the Jacobian matrix over a neighborhood [Fan & Mitra 2014].

Inferring Contraction Metric from simulations [Balkan et al 2014]

What next?

# Simulations+Annotation $\rightarrow$ Reachtubes

**simulation**( $x_0, h, \epsilon, T$ ) of gives a sequence  $S_0, \dots, S_k$ :  
 $\text{dia}(S_i) \leq \epsilon$  & at any time  $t \in [ih, (i+1)h]$ , solution  
 $\xi(x_0, t) \in S_i$ .



**reachtube**( $S, \epsilon, T$ ) of  $\dot{x} = f(x)$  is a sequence  $R_0, \dots, R_k$   
such that  $\text{dia}(R_i) \leq \epsilon$  and from any  $x_0 \in S$ , for each time  
 $t \in [ih, (i+1)h]$ ,  $\xi(x_0, t) \in R_i$ .

$\langle S_0, \dots, S_k, \epsilon_1 \rangle \leftarrow \text{valSim}(x_0, T, f)$

For each  $i \in [k]$

$$\epsilon_2 \leftarrow \sup_{t \in T_i, x, x' \in B_\delta(x_0)} \beta(x_1, x_2, t)$$

$$R_i \leftarrow B_{\epsilon_2}(S_i)$$





# How to get completeness for hybrid systems?

Track & propagate *may* and *must* fragments of reachtube

$$\text{tagRegion}(R, P) = \begin{cases} \text{must} & R \subseteq P \\ \text{may} & R \cap P \neq \emptyset \\ \text{not} & R \cap P = \emptyset \end{cases}$$

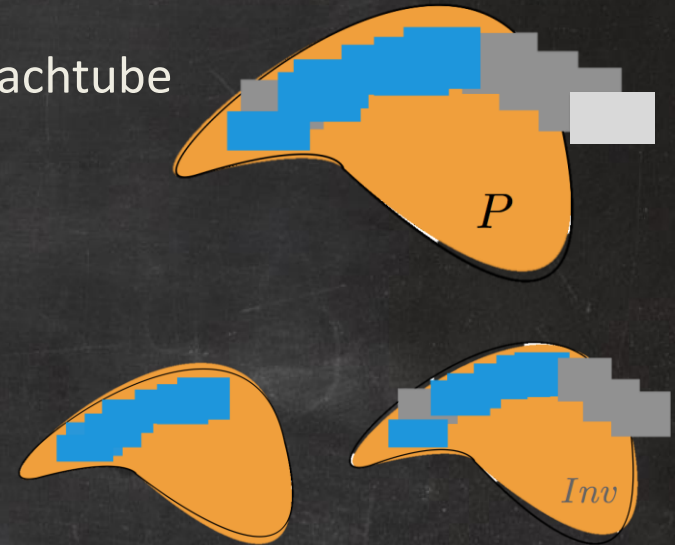
*invariantPrefix*( $\psi, S$ ) =

$\langle R_0, \text{tag}_0, \dots, R_m, \text{tag}_m \rangle$ , such that either

$\text{tag}_i = \text{must}$  if all the  $R'_j$ s before it are must

$\text{tag}_i = \text{may}$  if all the  $R'_j$ s before it are at least may

and at least one of them is not must



# Hybrid Reachtubes: Guards & Resets

*nextRegions*( $\varphi$ ) returns a set of tagged regions  $N$ .

$\langle R', tag' \rangle \in N$  iff  $\exists a, R_i$  such that  $R' = Reset_a(R_i)$  and:

$$R_i \subseteq Guard_a, tag_i = tag' = must$$

$$R_i \cap Guard_a \neq \emptyset, R_i \not\subseteq Guard_a, tag_i = must, tag' = may$$

$$R_i \cap Guard_a \neq \emptyset, tag_i = tag' = may$$





# Sound & Relatively Complete

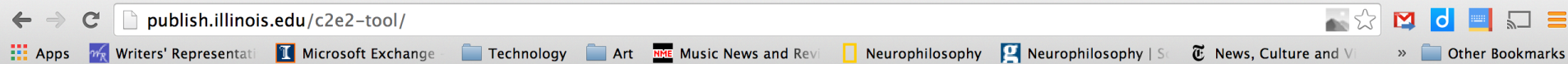
**Theorem.** (Soundness). If Algorithm returns safe or unsafe, then  $A$  is safe or unsafe.

**Definition** Given HA  $A = \langle V, Loc, A, D, T \rangle$ , an  **$\epsilon$ -perturbation** of  $A$  is a new HA  $A'$  that is identical except,  $\Theta' = B_\epsilon(\Theta)$ ,  $\forall \ell \in Loc, Inv' = B_\epsilon(Inv)$  (b)  $a \in A, Guard_a = B_\epsilon(Guard_a)$ .

$A$  is **robustly safe** iff  $\exists \epsilon > 0$ , such that  $A'$  is safe for  $U_\epsilon$  upto time bound  $T$ , and transition bound  $N$ . Robustly unsafe iff  $\exists \epsilon < 0$  such that  $A'$  is safe for  $U_\epsilon$ .

**Theorem.** (Relative Completeness) Algorithm always terminates whenever the  $A$  is either robustly safe or robustly unsafe.

# C2E2



## C2E2 Verification Tool

A Verification Tool for Simulink/Stateflow Models

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## Main

**Compare Execute Check Engineer (C2E2)** is a tool for verifying bounded-time invariant properties of Stateflow models. It supports models with nonlinear dynamics, discrete transitions, and sets of initial states. The invariant properties have to be specified by conjunctions of linear inequalities. Internally, C2E2 implements the simulation-based verification algorithms described in the sequence of publications Duggirala et al. [2013, 2014], Sukumar and Mitra [2011]. In a nutshell, it parses and transforms the Stateflow model to a mathematical representation, generates faithful numerical simulations of this model using a validated numerical simulator, bloats these simulations using user provided annotations to construct over-approximations of the bounded time reachable set, and finally, iteratively refines these over-approximations to prove the invariant or announce candidate counter examples. C2E2 has a GUI for loading and editing properties associated with Stateflow models, launching the verifier, and plotting 2D sections of the reach sets computed by the verifier. It saves the properties and the models in an internal HyXML format that can be later reloaded. The reach tubes computed for verification are

Part II

# TWO APPLICATIONS

Duggirala ◦ Wang ◦ Mitra ◦ Munoz ◦ Viswanathan (FM 2014)

Huang ◦ Fan ◦ Meracre ◦ Mitra ◦ Kiwatkowska (CAV 2014)



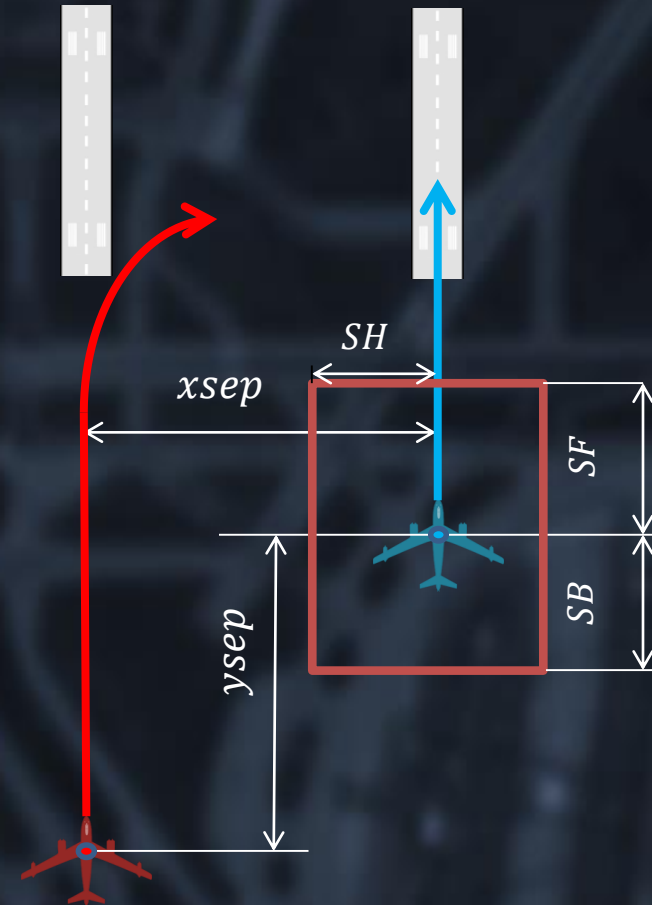
# SAPA-ALAS Parallel Landing Protocol

*Ownship* and *Intruder* approaching parallel runways with small separation

ALAS (at ownship) protocol is supposed to raise an alarm if within  $T$  time units the *Intruder* can violate safe separation based on 3 different projections

Verify  $\text{Alert} \leq_b \text{Unsafe}$  for different runway and aircraft scenarios

Scenario 1. With  $xsep \in [.11, .12]$  Nm  $ysep \in [.1, .21]$  Nm,  $\phi = 30^\circ$   $\phi_{max} = 45^\circ$   $vy_o = 136$  Nmph,  $vy_i = 155$  Nmph



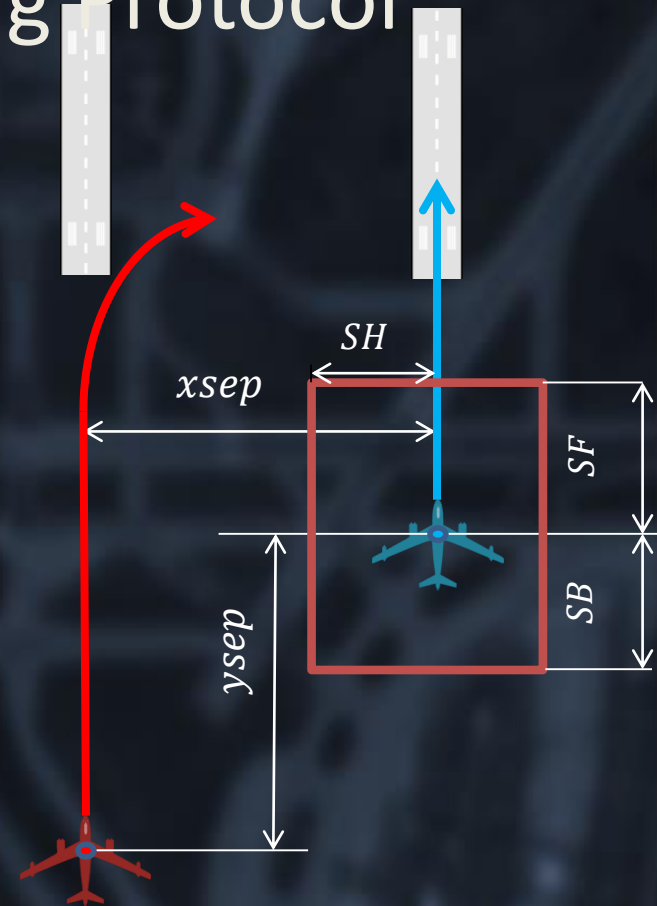
# SAPA-ALAS Parallel Landing Protocol

$Alert_i = \{x \mid \exists t \in [0, T], proj_i(x, t) \in Unsafe\}$ ,  
 where  $proj_i$  defined as solution of ODE  $\dot{x} = g_i(x, t)$

Use simulations and annotations of  $g_i$  to compute  
*must* intervals when  $x \in Alert_i$

$Alert \prec_b P_2$  is **satisfied** by Reachtube  $\psi$   
 if  $\forall I_2 \in Must(P_2) \cup May(P_2)$  there exists  $I_1 \in Must(Alert)$  such that  $I_1 < I_2 - b$

$Alert \prec_b P_2$  is **violated** by Reachtube  $\psi$   
 if  $\exists I_2 \in Must(P_2)$  for all  $I_1 \in Must(Alert) \cup May(Alert)$  such that  $I_1 > I_2 - b$



# Real-time Alerting Protocol

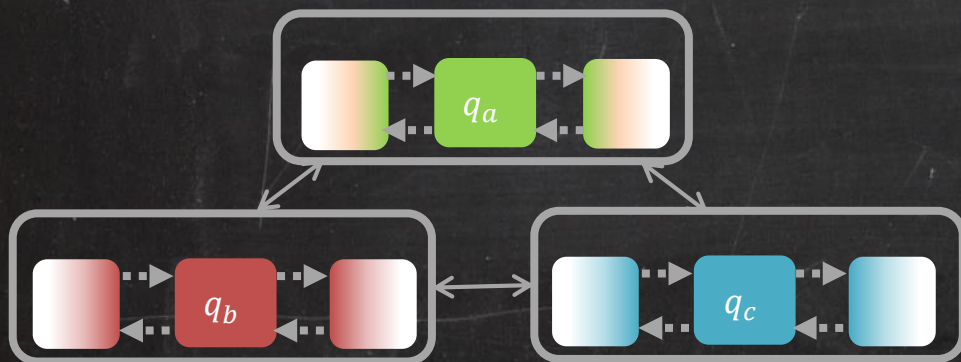
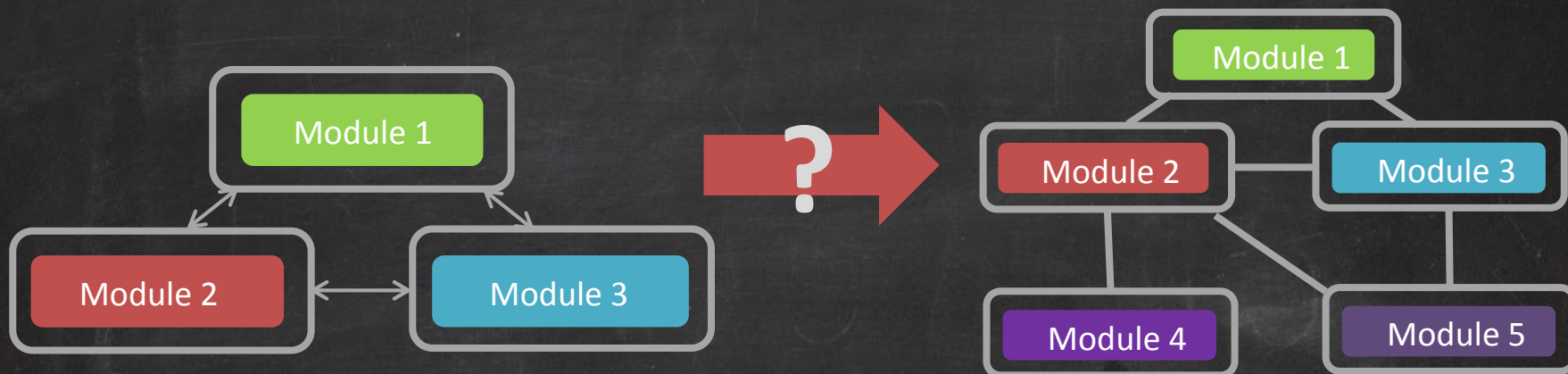
Sound & robustly completeness

C2E2 verifies interesting scenarios in reasonable time; shows that false alarms are possible; found scenarios where alarm may be missed

Scenario	Alert $\leq_4$ Unsafe	Running time (mins:sec)	Alert $\leq_7$ Unsafe
6	False	3:27	2.16
7	True	1:13	—
8	True	2:21	—
6.1	False	7:18	1.54
7.1	True	2:34	—
8.1	True	4:55	—
9	False	2:18	1.8
10	False	3:04	2.4
9.1	False	4:30	1.8
10.1	False	6:11	2.4

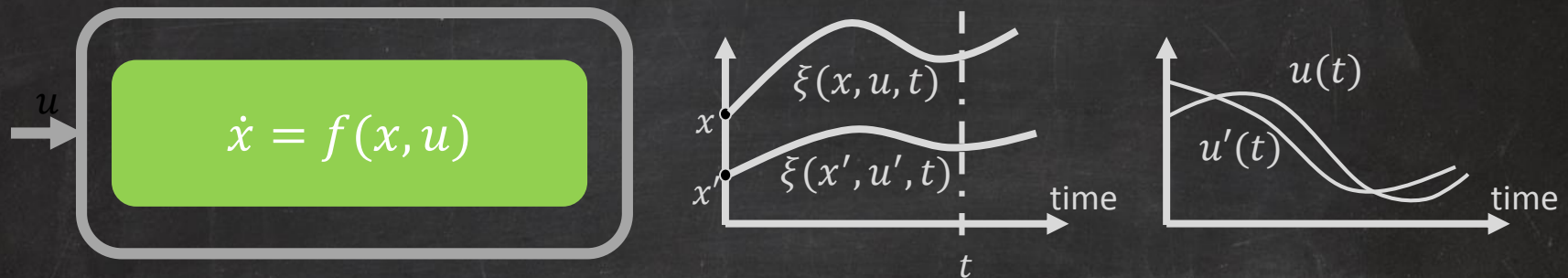


# Exploiting Modularity



$$\begin{aligned} \dot{x}_1 &= f_a(x_1, x_2, x_3) \\ \dot{x}_2 &= f_b(x_2, x_1, x_3) \\ \dot{x}_3 &= f_c(x_3, x_1, x_2) \end{aligned} \times L^N$$

# Input-to-State (IS) Discrepancy



Definition. **IS discrepancy** is defined by  $\beta$  and  $\gamma$  such that for any initial states  $x, x'$  and any inputs  $u, u'$ ,

$$|\xi(x, u, t) - \xi(x', u', t)| \leq \beta(x, x', t) + \int_0^t \gamma(|u(s) - u'(s)|) ds$$

$\beta \rightarrow 0$  as  $x \rightarrow x'$ , and  $\gamma \rightarrow 0$  as  $u \rightarrow u'$

# Reduced System $M(\delta_1, \delta_2, V_1, V_2)$

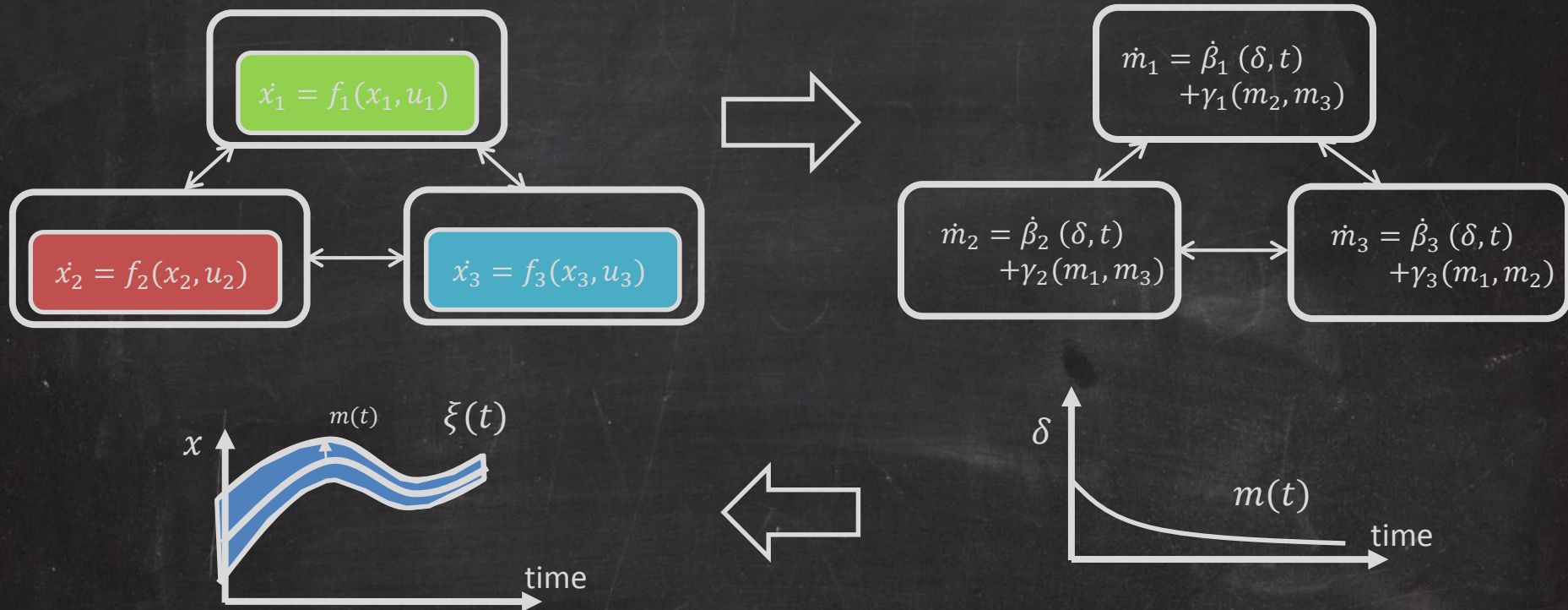
$$\dot{x} = f_M(x)$$

$$x = \langle m_1, m_2, clk \rangle$$

$$\begin{bmatrix} \dot{m}_1 \\ m_2 \\ clk \end{bmatrix} = f_M(x) = \begin{bmatrix} \dot{\beta}_1(\delta_1, clk) + \gamma_1(m_2) \\ \dot{\beta}_2(\delta_2, clk) + \gamma_2(m_1) \\ 1 \end{bmatrix}$$



# Bloating with Reduced Model



The bloated tube contains all trajectories start from the  $\delta$ -ball of  $x$ .

The over-approximation can be computed arbitrarily precise.

# Reduced $M$ gives effective Discrepancy of $A$

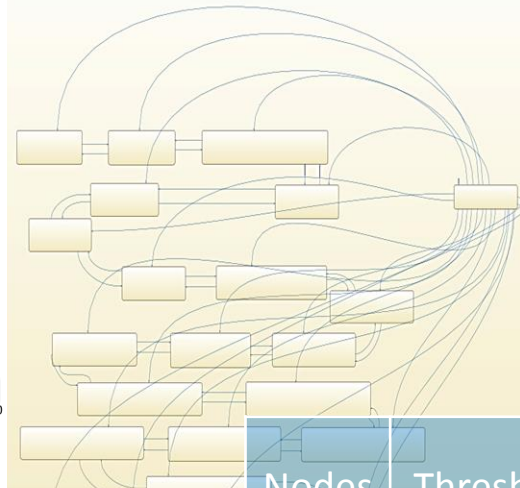
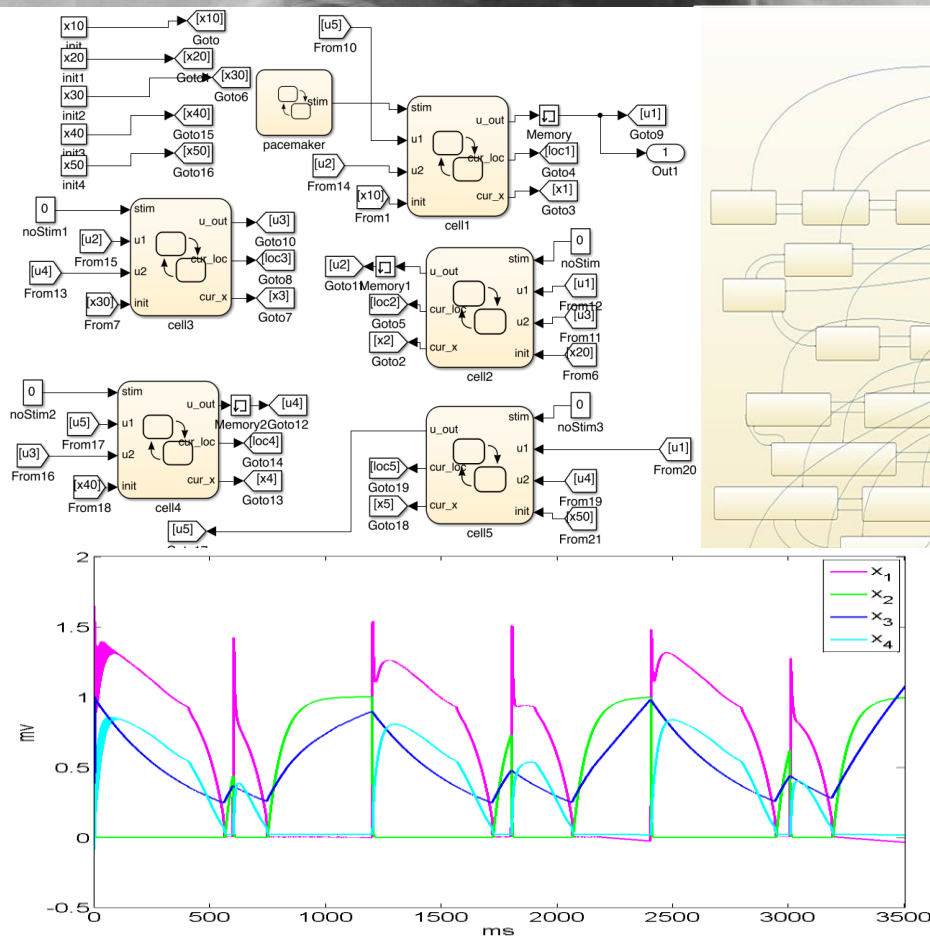
**Theorem.** For any  $\delta = \langle \delta_1, \delta_2 \rangle$ ,  $V = \langle V_1, V_2 \rangle$  and  $T$   
 $Reach_A(B_\delta(x), T) \subseteq \bigcup_{t \leq T} B_{\mu(t)}^V(\xi(x, t))$

**Theorem.** For any  $\epsilon > 0$  there exists  $\delta = \langle \delta_1, \delta_2 \rangle$  such that  
 $\bigcup_{t \leq T} B_{\mu(t)}^V(\xi(x, t)) \subseteq B_\epsilon(Reach_A(B_\delta(x), T))$

Here  $\mu(t)$  is the solution of  $M(\delta_1, \delta_2, V_1, V_2)$ .

# Pacemaker + Cardiac Network

Action potential remains in specific range  
No alternation of action potentials



```
state1
du:
u_dot=-0.0025000000000000*u+D*(u1+u2-2*u)/(h*h)+stim;
v_dot=-0.016666666666667*v+0.016666666666667;
w_dot=-0.0726392130750801*u-0.0050000000000000*w+0.0050000000000000;
s_dot=0.0325954614796371*u-0.3657376929266330*s+0.0078827602517302;
u_out=u;
cur_x[0]=u;
cur_x[1]=v;
cur_x[2]=w;
cur_x[3]=s;
cur_loc=1;
```

[u<0.0032252252252252] 2 [u>=0.0032252252252252]

```
state2
du:
u_dot=-0.0025934648787471*u+0.0000003014452846+D*(u1+u2-2*u)/(h*h)+stim;
v_dot=-0.016666666666667*v+0.016666666666667;
w_dot=-0.0726392130750801*u-0.0050000000000000*w+0.0050000000000000;
s_dot=0.0342238163406254*u-0.3657376929266330*s+0.0078775084405570;
u_out=u;
cur_x[0]=u;
cur_x[1]=v;
cur_x[2]=w;
cur_x[3]=s;
cur_loc=2;
```

[u>=0.0059] 1 [u<0.0059]

```
state3
du:
u_dot=-99.8500002249997323*u+0.5891000013299984+D*(u1+u2-2*u)/(h*h)+stim;
v_dot=-0.016666666666667*v+0.016666666666667;
w_dot=-0.0726392130750801*u-0.0050000000000000*w+0.0050000000000000;
s_dot=0.0000003317449342*u-0.3657376929266330*s+0.008079443998275;
u_out=u;
cur_x[0]=u;
cur_x[1]=v;
cur_x[2]=w;
cur_x[3]=s;
cur_loc=3;
```

Nodes	Thresh	Sims	Runtime(s)	Property
3	2	16	104.8	TRUE
3	1.65	16	103.8	TRUE
5	2	3	208	TRUE
5	1.65	5	281.6	TRUE
5	1.5	NA	63.4	FALSE
8	2	3	240.1	TRUE
8	1.65	73	2376.5	TRUE



# Summary and Outlook

- Tractable reachability of nonlinear hybrid models
  - scales reasonably with time horizon and precision
  - exponential dependence on initial set (plenty of room to exploit parallelism)
- Promising for synthesis of switching surfaces

# Challenges

- Theory to support nondeterministic models using decomposition into deterministic part and state-dependent uncertainty:
  - Use cases: advanced controller, adversary, failures
- Compositional inference of annotations of large models from known annotations of smaller blocks
  - Use case: direct support of Simulink models directly
- Abstraction refinement-based algorithm for synthesis
- Connect synthesis engine with a specific complex hardware platform, for example, a quadcopter or a bipedal robotic system