

# SAT-Reach : A Bounded Model Checker for Affine Hybrid Systems

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# Introduction

- Hybrid systems consist of both continuous and discrete dynamics.  
**Ex:** Autonomous car, Robots, Aircraft flight control system, etc.
- Hybrid systems are safety-critical.
- Traditional approach can't handle such systems.
- Bounded Model Checking (BMC) searches for a CE of length at most  $k$ .



**Figure:** Safety-critical systems.

# Preliminaries

## Definition

A *hybrid automaton* ( $\mathcal{H}$ ) is a six tuple  $(\mathcal{V}, \mathcal{X}, Inv, Init, Flow, Trans)$  where:

- $\mathcal{V} = \{v_0, \dots, v_\ell\}$  is a finite set of locations or modes of the  $\mathcal{H}$ .
- $\mathcal{X} = \{x_1, \dots, x_n\}$  is a finite set of real-valued variables of the  $\mathcal{H}$ .
- $Inv(v)$  be a invariant function that maps a location to a subset of  $\mathbb{R}^n$ .
- $Init(v)$  is a function called the initial set of the location  $v$ .
- $Flow(v, x)$  defines the evolution of real-valued variables  $x$  in  $v$ .
- Each transition  $\delta \in Trans$ , is a 4-tuple  $(v, \mathcal{G}, Asgn, v')$  where:
  - ▶  $v$  and  $v'$  is the source and target locations.
  - ▶  $\mathcal{G}$  and  $Asgn$  be the guard and assignment of the transition  $\delta$ .
- Affine hybrid system is a class of hybrid system.
  - ▶  $Flow(v, x) = A_v \cdot x + u$ ,  $u \in \mathcal{U}_v$  where  $A_v \in \mathbb{R}^{n \times n}$  and  $\mathcal{U}_v \subseteq \mathbb{R}^n$
  - ▶  $\mathcal{U}_v$ ,  $Init(v)$ ,  $Inv(v)$  and  $\mathcal{G}(\delta)$  are all convex sets and  $Asgn(\delta)$  is a linear transformation.

# Preliminaries...

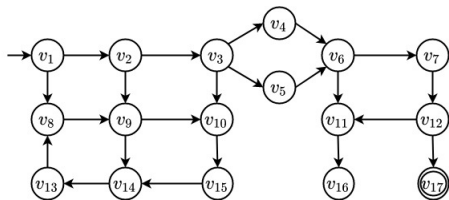
- A symbolic state of a hybrid automaton  $\mathcal{H}$  is a pair of  $(v, x) \in \mathcal{V} \times \mathbb{R}^n$
- Reachability analysis can be performed using two operators:
  - ▶  $post_c(v, x)$  denotes the set of reachable states from  $(v, x)$  by arbitrary timed transitions.
  - ▶  $post_d(v_i, x_i)$  denotes the set of reachable states from  $(v_i, x_i)$  by a discrete transition  $\delta$ .
- A path  $\pi$  is an alternating sequence of locations and transitions:

$$\pi = v_0, e_1, v_1, e_2, \dots, v_{unsafe}$$

- A path  $\pi$  is said to be feasible if the forbidden state is reachable.

# Motivating Example

- Let  $(v_1, \mathcal{C}_1)$  is the initial symbolic state and  $(v_{17}, \mathcal{C}_{17})$  is the forbidden symbolic state in the verification problem with bound of analysis 7.
- BFS/DFS-based exploration computes 49  $post_c$  operations in worst-case and 17 in the best case.



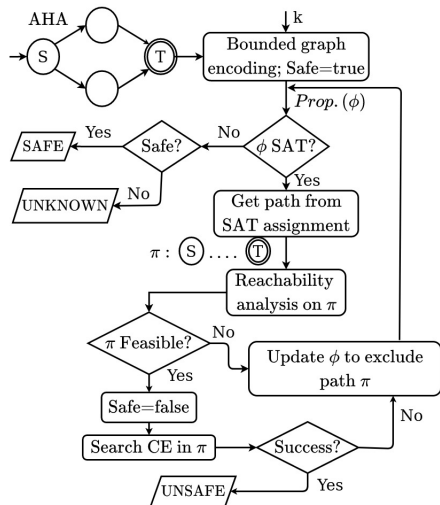
- SAT-based path-guided exploration computes only 13  $post_c$  operations in the worst case and 9 in the best case.

**Figure:** Discrete structure of an HA model.

- Our aim is to reduce the number of  $post_c$  computations so that we can deduce the safety of the given verification problem faster.

# Proposed Method

- **Input:** Affine Hybrid automata  $\mathcal{H}$  and bound of analysis  $k$ .
- **Output:** Terminates with one of the followings:
  - ▶ SAFE.
  - ▶ UNSAFE + Concrete CE.
  - ▶ UNKNOWN.
- It combines -
  - ▶ SAT-based path enumeration.
  - ▶ Pathwise Reachability analysis.
  - ▶ Search for CE.
- We propose -
  - ▶ Path pruning.
  - ▶ Reachability optimization.



**Figure:** SAT-assisted BMC procedure.

# SAT-based path enumeration

- **Goal:** Enumerate all paths from the AHA that satisfy the given configurations.
- Graph is encoded using two propositional logic formulas:
  - ▶  $\varphi_{\mathcal{H}}^k$  for retrieving a sequence of locations  $L$ .
  - ▶  $\Phi_{\mathcal{H}}^k(L)$  for retrieving a path  $\pi$ .
- Four basic constraints are used to get  $L$  :
  - ▶ **Initial constraint :**

$$\varphi_{Init}(\mathcal{V}_{Init}) := \bigvee_{v_i \in \mathcal{V}_{Init}} (\varphi_{Init}(v_i))$$

$$\text{where } \varphi_{Init}(v_0) := v_0^0 \wedge \varphi_{Excl}(v_0^0)$$

- ▶ **Exclusivity constraint:**

$$\varphi_{Excl}(v_i^j) := \left( v_i^j \implies \bigwedge_{v_m \in \mathcal{V} \wedge v_m \neq v_i} (\neg v_m^j) \right)$$

- ▶ **Transition constraint:**

$$\varphi_{Trans}(v_i^j) := \left( v_i^j \implies \bigvee_{(v_i, v_m) \in E} (v_m^{j+1}) \right)$$



# SAT-based path enumeration

► **Destination constraint:**

$$\varphi_{Dest}(\mathcal{V}_{unsafe}, j) := \bigvee_{v_i \in \mathcal{V}_{unsafe}} (v_i^j)$$

- Another constraint for retrieving a path  $\pi = v_0, e_1, v_1, e_2 \dots v_k$ .

► **Parallel constraint:**

$$\Phi_{\mathcal{H}}^k(L) = \bigwedge_{0 \leq i < (\text{len}(L)-1), 1 \leq j \leq k} (\Phi_{Para\_trans}(v_i, v_{i+1}, j))$$

where  $\Phi_{Para\_trans}(v_i, v_{i+1}, j) = \bigvee_{p \in Tid(v_i, v_{i+1})} (e_p^j)$

- **Negation constraint:**  $\Phi_{Neg}(\pi) := (\neg e_1^1 \vee \neg e_2^2 \vee \dots \vee \neg e_k^k)$

$$\varphi_{Neg}(L) := (\neg v_0^0 \vee \neg v_1^1 \vee \dots \vee \neg v_k^k)$$

- we will discuss some constraints on path pruning section.

# Reachability Analysis over a path

- Consider a path  $\pi = v_0, e_1, v_1, e_2 \dots v_{unsafe}$  returned by the previous routine.
- Goal: The path  $\pi$  is feasible or not.

## Definition

An *execution*  $\sigma$  of a hybrid automaton  $\mathcal{H}$  is an alternating sequence of timed and discrete transitions:

$$\sigma : (v_0, x_0) \xrightarrow{\tau_0} (v_0, y_0) \xrightarrow{\delta_0} (v_1, x_1) \xrightarrow{\tau_1}, \dots, \xrightarrow{\delta_{k-1}} (v_k, x_k) \xrightarrow{\tau_k} (v_k, y_k)$$

such that (1)  $x_0 \in \text{Init}(v_0)$ , (2)  $y_i \in \mathcal{G}(\delta_i)$ ,  $x_{i+1} = \text{Asgn}(\delta_i)(y_i)$  for every  $0 \leq i < k$ .

- A state  $(v, x)$  is reachable if there is an *execution*.
- Reachable states are computed for a location  $v_i$  by the union of convex sets:  $\Omega = \Omega_0, \Omega_1, \dots, \Omega_{N-1}$

# Reachability Analysis over a path

- We adopt the idea of computing reachable states from [1].
- The convex set  $\Omega_j$  is computed by the following formula over  $[j\Delta t, (j+1)\Delta t]$

$$\begin{aligned}\Omega_j &= e^{A(j\Delta t)}\Omega_0 \oplus \Psi_j \\ \Psi_{j+1} &= \Psi_j \oplus e^{A(j\Delta t)}\Psi_{\Delta t}\end{aligned}\tag{1}$$

- Reachable states that take the transition  $(\delta_i)$  must satisfy the

$$\begin{aligned}\Omega' &= \Omega \cap \mathcal{G}(\delta) \cap \text{Inv}(v_i) \\ \Omega_{new} &= \text{Asgn}(\delta)(\Omega') \cap \text{Inv}(v_{i+1})\end{aligned}\tag{2}$$

- This  $\Omega_{new}$  forms the initial set of the location  $v_{i+1}$ .

# Reachability Analysis algorithm

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**Input:**  $\pi = v_0, e_1, v_1, e_2, v_2, \dots, e_k, v_k$ , and hybrid automaton  $\mathcal{H}$ .

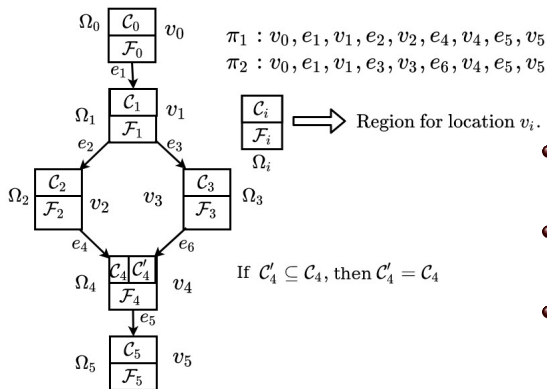
**Output:** Returns true with the path  $\pi$  when  $\pi$  is feasible, otherwise returns false with the smallest infeasible sub\_path.

**Initialization:**  $sub\_path \leftarrow v_0$ ;  $C_0 = Init(v_0)$

```
1: for  $i \leftarrow 0$  to  $k - 1$  do
2:    $\mathcal{F} = post_c(v_i, C_i)$ 
3:   if  $(i = k)$  then
4:     return  $\pi$ , true
5:   end if
6:    $sub\_path \leftarrow sub\_path.push(v_{i+1})$ 
7:   if  $(\mathcal{F} \cap Inv(v_i) \cap \mathcal{G}(e_{i+1}) \neq \emptyset)$  then
8:      $\mathcal{A} = Asgn(\delta(e_{i+1}))(\mathcal{F} \cap Inv(v_i) \cap \mathcal{G}(e_{i+1}))$ 
9:     if  $(\mathcal{A} \cap Inv(v_{i+1}) \neq \emptyset)$  then
10:       $C_{i+1} = \mathcal{A} \cap Inv(v_{i+1})$ 
11:    else
12:      return  $sub\_path$ , false
13:    end if
14:  else
15:    return  $sub\_path$ , false
16:  end if
17: end for
```

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# Reachability Optimization



- $\Omega_i$  is the union of  $C_i$  and  $F_i$ .
- $(v_i, C_i)$  is calculated using equ. 3.
- $F_i = post_c((v_i, C_i))$

**Figure:** Demonstration of our optimization idea.

$$(v_i, C_i) = post_d(post_c((v_{i-1}, C_{i-1})), (v_{i-1}, v_i)) \quad (3)$$

# Optimization Rules

$$\overline{(v_0, \mathcal{C}_0), \mathcal{C}_0 = \text{Init}(v_0)}$$

$$\frac{\text{initial-to-flow}[(v_i, \mathcal{C}_i)] = \emptyset}{\mathcal{F}_i = \text{post}_c((v_i, \mathcal{C}_i)), \text{initial-to-flow}[(v_i, \mathcal{C}_i)] = \mathcal{F}_i}$$

$$\frac{\text{initial-to-flow}[(v_i, \mathcal{C}_i)] \neq \emptyset}{\mathcal{F}_i = \text{initial-to-flow}[(v_i, \mathcal{C}_i)]}$$

$$\frac{\text{flow-trans-to-init}[(\mathcal{F}_i, \delta)] = \emptyset, \text{ where } \delta = (v_i, \mathcal{G}, \text{Asgn}, v_{i+1})}{(v_{i+1}, \mathcal{C}_{i+1}) = \text{post}_d(\mathcal{F}_i, (v_i, v_{i+1}))}$$

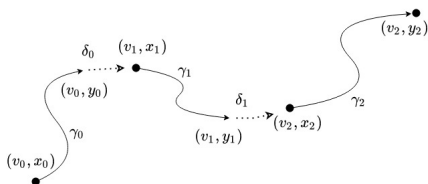
$$\frac{\text{flow-trans-to-init}[(\mathcal{F}_i, \delta)] \neq \emptyset, \text{ where } \delta = (v_i, \mathcal{G}, \text{Asgn}, v_{i+1})}{(v_{i+1}, \mathcal{C}_{i+1}) = \text{flow-trans-to-init}[(\mathcal{F}_i, \delta)]}$$

# Optimization Rules...

$$\frac{\begin{array}{l} \exists(v_{i+1}, \mathcal{C}'_{i+1}) \left[ (\text{initial-to-flow} [(v_{i+1}, \mathcal{C}'_{i+1})] \neq \emptyset \wedge (\mathcal{C}_{i+1} \subseteq \mathcal{C}'_{i+1})) \wedge \right. \\ \quad \left. \forall(v_{i+1}, \mathcal{C}^*_{i+1}) \left( (\text{initial-to-flow} [(v_{i+1}, \mathcal{C}^*_{i+1})] \neq \emptyset) \implies \right. \right. \\ \left. \left. \{ \{ (\mathcal{C}'_{i+1} \not\subseteq \mathcal{C}^*_{i+1}) \wedge (\mathcal{C}'_{i+1} \not\supseteq \mathcal{C}^*_{i+1}) \} \vee \{ (\mathcal{C}_{i+1} \subseteq \mathcal{C}^*_{i+1}) \implies (\mathcal{C}'_{i+1} \subseteq \mathcal{C}^*_{i+1}) \} \} \right) \right] \\ \hline \mathcal{C}_{i+1} = \mathcal{C}'_{i+1}, \text{flow-trans-to-init} [(\mathcal{F}_i, \delta)] = (v_{i+1}, \mathcal{C}_{i+1}) \end{array}}{} \quad \frac{\forall(v_{i+1}, \mathcal{C}'_{i+1}) \left[ (\text{initial-to-flow} [(v_{i+1}, \mathcal{C}'_{i+1})] \neq \emptyset \wedge (\mathcal{C}_{i+1} \not\subseteq \mathcal{C}'_{i+1})) \right]}{\text{flow-trans-to-init} [(\mathcal{F}_i, \delta)] = (v_{i+1}, \mathcal{C}_{i+1})}$$

# Searching for a CE

- Goal: Splicing trajectory segments to get a concrete CE.



**Figure:** An example of a segmented trajectory having three trajectory segments.

- We used trajectory splicing [2] algorithm to find a concrete counterexample.

## Definition (Segmented Trajectory)

A segmented trajectory ( $\Gamma$ ) of an automaton is a finite sequence of trajectory segments  $\gamma_i$  given as:

$$\Gamma = \left( \begin{array}{l} \gamma_0 : (v_0, x_0) \xrightarrow{\tau_0} (v_0, y_0) \\ \gamma_1 : (v_1, x_1) \xrightarrow{\tau_1} (v_1, y_1) \\ \vdots \\ \gamma_k : (v_k, x_k) \xrightarrow{\tau_k} (v_k, y_k) \end{array} \right) \quad (4)$$

where  $(v_i, x_i) \xrightarrow{\tau_i} (v_i, y_i)$  is a timed transition in the location  $v_i \in \mathcal{V}$ , for all  $0 \leq i \leq k$ .



## Searching for a CE

- Splicing these trajectory segments using a nonlinear optimization problem.

$$x_0, \dots, x_k, \tau_0, \dots, \tau_k \quad \sum_{i=0}^{k-1} \text{COST}(\gamma_i, \gamma_{i+1}) \quad (5)$$

subject to:

$$\text{COST}(\gamma_i, \gamma_{i+1}) = \text{dist}(\text{Asgn}(\delta_i)(y_i), x_{i+1}) \quad (6)$$

$$x_0 \in \text{Init}(v_0) \quad (7)$$

$$x_i \in \mathcal{C}'_i, \quad \forall i : 1 \leq i \leq k \quad (8)$$

$$y_i \in \mathcal{G}(\delta_i) \cap \mathcal{C}_i, \quad \forall i : 0 \leq i \leq k-1 \quad (9)$$

$$y_k \in \mathcal{C}_k \cap \mathcal{C}_{\text{unsafe}} \quad (10)$$

$$0 \leq \tau_i \leq T, \quad \forall i : 0 \leq i \leq k \quad (11)$$

- $\text{dist}()$  is the euclidean distance between end point of  $\gamma_i$  and starting point of  $\gamma_{i+1}$ .

# Path Pruning

- We prune the number of candidate paths using two *overall negation constraints*:
  - ▶ *overall negation constraint* for the set of paths.

$$\Phi_{Neg}^{\Pi} := \bigwedge_{\pi \in \Pi} (\Phi_{Neg}(\pi))$$

- $\Pi$  is a set of infeasible paths  $\pi$  that are not to be further enumerated.
- ▶ *overall negation constraint* for the set of sequences of locations.

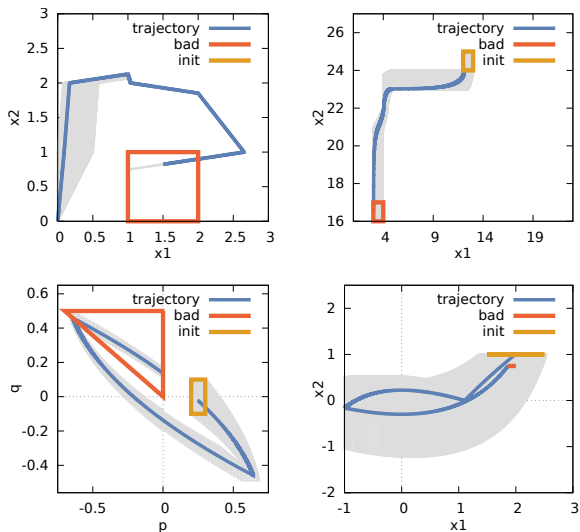
$$\varphi_{Neg}^{SL} := \bigwedge_{L \in SL} (\varphi_{Neg}(L))$$

- $SL$  is a set of sequence of locations  $L$  that are not to be further enumerated.

# Results for the unsafe instances

Benchmark	#Locs	#Dims	BMC Bnd (k)	DREACH Time (secs)			BFS-REACH				SAT-REACH					
				Time	#Paths	#Abs	Time (secs)			#postC	#Abs	Time (secs)			#Paths	#postC
							RA	Opt.	Fal.			RA	Opt.	Fal.		
Platoon	2	10	≤ 1	Timeout	1	1	4.29	0.54	4.83	2	1	4.09	0.53	4.62	1	2
Oscillator	4	3	≤ 3	0.96	1	1	0.15	0.10	0.25	4	1	0.19	0.10	0.29	1	4
F_oscillator_4	4	7	≤ 3	5.65	1	1	0.37	0.26	0.63	4	1	0.39	0.26	0.66	1	4
F_oscillator_8	4	11	≤ 3	22.32	1	1	0.66	1.1	1.76	4	1	0.69	1.12	1.81	1	4
F_oscillator_16	4	19	≤ 3	20.88	1	1	1.69	3.45	5.14	4	1	1.78	3.47	5.25	1	4
F_oscillator_32	4	35	≤ 3	128.4	1	1	7.82	15.82	23.64	4	1	7.77	15.88	23.65	1	4
F_oscillator_64	4	67	≤ 3	Timeout	1	1	-	-	UKW	4	1	-	-	UKW	1	4
Two_tank_U1	4	3	≤ 3	129.47	2	1	0.11	0.05	0.16	4	1	0.14	0.05	0.19	3	4
NAV_U1	9	4	≤ 6	1.68	22	1	1.16	0.14	1.30	(29)	1	0.27	0.16	0.43	4	(8)
NAV_U2	9	4	≤ 7	6.71	101	1	2.49	0.15	2.64	(46)	1	0.47	0.15	0.62	14	(18)
NAV_U3	9	5	≤ 3	0.87	1	1	1.78	0.91	2.69	(10)	1	0.28	0.14	0.42	1	(4)
NAV_U4	9	5	≤ 2	1.13	1	1	0.51	0.54	1.05	(4)	1	0.17	0.08	0.25	1	(3)
NAV_U5	27	6	≤ 6	91.57	34	1	1.95	0.3	2.25	(29)	1	0.53	0.31	0.84	7	(9)
NAV_U6	27	6	≤ 5	42.86	8	1	1.13	0.22	1.35	(17)	1	0.36	0.020	0.56	4	(6)
NAV_U7	81	7	≤ 1	26.7	1	1	0.09	0.03	0.12	2	1	0.10	0.02	0.12	1	2
NAV_U8	81	7	≤ 8	Timeout	307	1	11.13	3.52	14.65	(119)	1	1.8	3.44	4.62	34	(16)
NAV_U9	81	7	≤ 6	1376.71	103	1	2.08	1.53	3.61	(31)	1	0.47	1.44	1.91	4	(7)
NAV_U10	81	7	≤ 12	Timeout	337	0	-	-	Timeout	(3069)	1	2.57	11.90	14.47	90	(38)
NAV_U11	81	7	≤ 9	Timeout	266	1	46.65	10.46	57.11	(271)	1	1.27	7.16	8.43	36	(19)
NAV_U12	81	7	≤ 11	Timeout	297	5	2545	254.77	2800.09	(439)	2	2.94	74.26	77.20	103	(45)
NAV_U13	81	7	≤ 10	Timeout	277	1	171.69	8.05	179.74	(676)	2	1.83	66.85	68.68	57	(28)
NAV_U14	625	5	≤ 2	1.54	1	1	1.63	1.30	2.93	(5)	1	2.46	1.21	3.67	1	(3)
NAV_U15	625	5	≤ 12	OOM	-	0	-	-	Timeout	(1386)	46	-	-	Timeout	149	(409)
NAV_U16	625	5	≤ 9	Timeout	27	0	-	-	Timeout	(1385)	23	45.49	1409.79	1455.28	47	(147)
NAV_U17	625	5	≤ 10	Timeout	36	0	-	-	Timeout	(1397)	18	44.15	1104.14	1148.29	27	(104)
NAV_U18	625	7	≤ 10	30.42	1	1	3.32	14.63	17.95	(27)	1	4.27	14.23	18.5	1	(11)
NAV_U19	625	7	≤ 12	302.91	1	1	4.23	23.33	27.56	(33)	1	5.63	22.69	28.32	1	(13)
NAV_U20	625	7	≤ 13	Timeout	1	1	4.57	31.56	36.13	(36)	1	6.41	31.08	37.49	1	(14)
NAV_U21	625	7	≤ 15	1802.17	1	1	5.26	45.24	50.5	(42)	1	8.13	44.82	52.95	1	(16)
NAV_U22	625	7	≤ 17	Timeout	1	1	5.85	64.95	70.80	(48)	1	9.96	63.47	73.43	1	(18)
NAV_U23	625	7	≤ 18	Timeout	1	1	-	-	UKW	(54)	1	-	-	UKW	1	(19)
NAV_U1_P	9	4	≤ 6	1.16	28	1	1.30	0.15	1.45	(29)	1	0.31	0.15	0.46	9	(8)

# Generated Counterexample

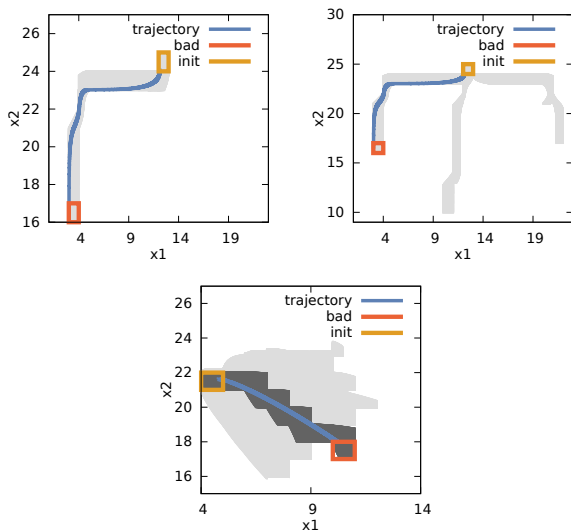


**Figure:** Counterexamples generated by SAT-REACH on different instances.

# Results for the safe instances

Benchmark	#Locs	#Dims	BMC Bound ( $k$ )	DREACH		BFS-REACH		SAT-REACH		
				Time (secs)	#Paths	Time (secs)	#postC	Time (secs)	#Paths	#postC
Two_tank_S1	4	3	$\leq 12$	137.09	458	0.72	(13)	0.53	8	(11)
NAV_S1	9	4	$\leq 10$	543.17	4650	31.15	(234)	3.09	110	(127)
ACCS03_1	9	9	$\leq 7$	Timeout	4	Timeout	(753)	659.16	5461	(5461)
ACCS03_2	9	9	$\leq 7$	Timeout	4	Timeout	(755)	664.73	5461	(5461)
NAV_S2	27	6	$\leq 6$	292.04	156	2.41	(33)	0.69	15	(16)
NAV_S3	27	6	$\leq 6$	634.72	312	2.41	(33)	0.69	21	(21)
NAV_S4	27	6	$\leq 19$	Timeout	1074	Timeout	(2060)	1107.29	8103	(5816)
NAV_S5	27	6	$\leq 19$	Timeout	1122	Timeout	(2064)	412.70	5019	(2700)
NAV_S6	81	7	$\leq 15$	Timeout	341	Timeout	(3072)	1616.98	10231	(8792)
NAV_S7	81	7	$\leq 12$	Timeout	327	Timeout	(3069)	6.03	254	(121)
NAV_S8	81	7	$\leq 15$	Timeout	279	Timeout	(3073)	2261.32	11741	(1013)
NAV_S9	81	7	$\leq 14$	Timeout	329	Timeout	(3062)	197.72	3417	(2927)
NAV_S10	81	7	$\leq 14$	Timeout	267	Timeout	(3062)	137.49	2667	(1655)
NAV_S11	81	7	$\leq 15$	Timeout	246	Timeout	(3064)	873.14	8114	(4591)
ACCS05_1	81	13	$\leq 4$	OOM	1	Timeout	(566)	458.84	4369	(4369)
ACCS05_2	81	13	$\leq 4$	OOM	1	Timeout	(565)	455.48	4369	(4369)
NAV_S12	625	5	$\leq 15$	OOM	0	Timeout	(1395)	158.79	336	(511)
NAV_S13	625	5	$\leq 15$	OOM	1	Timeout	(1396)	301.20	779	(671)
NAV_S14	625	5	$\leq 20$	OOM	0	Timeout	(1394)	137.56	68	(112)
NAV_S15	625	7	$\leq 16$	0.60	1	5.71	(47)	8.78	1	(12)
NAV_S16	625	7	$\leq 10$	0.275	1	3.53	(29)	3.77	1	(4)

# Explored Reachable States



**Figure:** Reachable region and CE for different instances in different tools.

# Comparison with Flow\*

Benchmarks	#Locs	#Dims	BMC Bound	Safety Result					
				FLOW*		SAT-REACH			Result
				Time (secs)	Result	Time (secs)			
RA	Opt	Total							
Platoon	2	10	1	0.0045	UNSAFE	4.04	0.51	4.56	UNSAFE
Oscillator	4	3	3	0.0004	UNSAFE	0.19	0.11	0.30	UNSAFE
F_oscillator_32	4	35	3	0.1900	UNSAFE	7.77	15.88	23.65	UNSAFE
F_oscillator_64	4	67	3	3.5920	UNSAFE	38.78	81.09	119.87	UNKNOWN
Two_tank_U1	4	3	3	0.0037	UNSAFE	0.13	0.05	0.18	UNSAFE
NAV_U2	9	4	7	0.6420	UNKNOWN	0.49	0.15	0.64	UNSAFE
NAV_U3	9	5	3	0.0010	UNSAFE	0.28	0.14	0.42	UNSAFE
NAV_U5	27	6	6	0.80.6293	UNKNOWN	0.47	0.30	0.77	UNSAFE
NAV_U10	81	7	12	170.4699	UNKNOWN	2.55	11.89	14.44	UNSAFE
NAV_U11	81	7	9	12.2957	UNKNOWN	1.28	7.13	8.41	UNSAFE
NAV_U12	81	7	11	64.6145	UNKNOWN	2.88	73.84	76.72	UNSAFE
NAV_U13	81	7	10	27.8765	UNKNOWN	1.75	66.65	68.40	UNSAFE
NAV_U14	625	5	2	16.3594	UNKNOWN	2.36	1.19	3.55	UNSAFE
NAV_U15	625	5	12	-	OOM	-	-	-	Timeout
NAV_U16	625	5	9	-	OOM	44.47	1407.59	1452.06	UNSAFE
NAV_U17	625	5	10	-	OOM	42.37	1102.84	1145.21	UNSAFE
NAV_U22	625	7	17	26.6224	UNKNOWN	9.46	60.43	69.79	UNSAFE
NAV_U23	625	7	18	26.5592	UNKNOWN	11.53	64.94	76.47	UNKNOWN
NAV_S1	9	4	10	2.2723	UNKNOWN	3.05	0	3.05	SAFE
NAV_S2	27	6	6	0.6325	UNKNOWN	0.65	0	0.65	SAFE
NAV_S3	27	6	6	0.6335	UNKNOWN	0.68	0	0.68	SAFE
NAV_S4	27	6	19	-	OOM	1057.82	0	1057.82	SAFE
NAV_S5	27	6	19	-	OOM	386.67	0	386.67	SAFE
NAV_S6	81	7	15	-	OOM	1547	0	1547	SAFE
NAV_S7	81	7	12	164.9963	UNKNOWN	5.82	0	5.82	SAFE

# Comparison with SpaceX

Benchmarks	#Locs	#Dims	#Trans	BMC Bound	Safety Result							
					SPACEEX			SAT-REACH				
					Time (secs)	#PostC	Result	Time (secs)			#PostC	Result
RA	Opt	Total										
Platoon	2	10	2	1	3.32	2	UNSAFE	4.04	0.51	4.56	2	UNSAFE
F_oscillator_32	4	35	4	3	1.80	4	UNSAFE	7.77	15.88	23.65	4	UNSAFE
F_oscillator_64	4	67	4	3	6.88	4	UNSAFE	38.78	81.09	119.87	4	UNKNOWN
Two_tank_U1	4	3	7	3	0.17	4	UNSAFE	0.13	0.05	0.18	4	UNSAFE
NAV_U1	9	4	24	6	0.26	23	UNSAFE	0.27	0.16	0.43	8	UNSAFE
NAV_U2	9	4	24	7	0.34	32	UNSAFE	0.49	0.15	0.64	18	UNSAFE
NAV_U3	9	5	20	3	0.85	14	UNSAFE	0.28	0.14	0.42	4	UNSAFE
NAV_U4	9	5	20	2	0.60	8	UNSAFE	0.17	0.08	0.25	3	UNSAFE
NAV_U5	27	6	108	6	0.39	25	UNSAFE	0.47	0.30	0.77	9	UNSAFE
NAV_U6	27	6	108	5	0.29	17	UNSAFE	0.36	0.20	0.56	6	UNSAFE
NAV_U10	81	7	432	12	42.40	1262	UNSAFE	2.55	11.89	14.44	38	UNSAFE
NAV_U11	81	7	432	9	7.05	262	UNSAFE	1.28	7.13	8.41	19	UNSAFE
NAV_U12	81	7	432	11	25.11	802	UNSAFE	2.88	73.84	76.72	45	UNSAFE
NAV_U13	81	7	432	10	12.87	480	UNSAFE	1.75	66.65	68.40	28	UNSAFE
NAV_U15	625	5	2392	12	1877.48	4181	UNSAFE	-	-	-	409	Timeout
NAV_U16	625	5	2392	9	341.12	935	UNSAFE	44.47	1407.59	1452.06	147	UNSAFE
NAV_U17	625	5	2392	10	580.80	1581	UNSAFE	42.37	1102.84	1145.21	104	UNSAFE
NAV_U22	625	7	227	17	3.73	50	UNSAFE	9.46	60.43	69.79	18	UNSAFE
NAV_U23	625	7	227	18	4.40	54	UNSAFE	11.53	64.94	76.47	19	UNKNOWN
Two_tank_S1	4	3	7	12	0.81	13	SAFE	0.53	0	0.53	11	SAFE
NAV_S1	9	4	24	10	0.82	76	SAFE	3.05	0	3.05	127	SAFE
ACCS03.1	9	9	36	7	10.62	70	SAFE	633.02	0	633.02	5461	SAFE
NAV_S3	27	6	108	6	0.38	25	SAFE	0.68	0	0.68	21	SAFE
NAV_S5	27	6	108	19	53.86	1683	SAFE	386.67	0	386.67	2700	SAFE
NAV_S7	81	7	432	12	3.25	136	SAFE	5.82	0	5.82	121	SAFE
NAV_S10	81	7	432	14	118.18	2669	SAFE	133.86	0	133.86	1655	SAFE
ACCS05.1	81	13	1296	4	336.36	299	SAFE	457.81	0	457.81	4369	SAFE
NAV_S12	625	5	2392	15	-	-	Timeout	158.70	0	158.70	511	SAFE
NAV_S13	625	5	2392	15	-	-	Timeout	300.88	0	300.88	671	SAFE
NAV_S14	625	5	2392	20	-	-	Timeout	135.60	0	135.60	112	SAFE



# Conclusion

- We demonstrate the BMC procedure for affine hybrid systems.
- Generates concrete counterexample faster than other existing procedures.
- We have shown the efficiency of our algorithm.
- In future, we plan to guide the paths so that SAT-REACH find a CE faster.
- <https://gitlab.com/Atanukundu/SAT-Reach>

# References

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Thank you for your attention!!  
Any questions?