Algorithmic Analysis of Polygonal Hybrid Systems

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- Hybrid Systems: interaction between discrete and continuous behaviors
- Examples: thermostat, automated highway systems, air traffic management systems, robotic systems, chemical plants, etc.



Model: Hybrid Automata





























- A partition of the plane into convex polygonal regions
- A constant differential inclusion for each region

$$\dot{x} \in \angle_{\mathbf{a}}^{\mathbf{b}}$$
 if $\mathbf{x} \in R_i$





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- The "swimmer" is a hybrid system
- Hybrid Automata?



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- The "swimmer" is a hybrid system
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We will use the "geometric" representation instead of the hybrid automata



Overview of the presentation

- Motivation and Contributions
- Algorithm for Reachability Problem (SPDIs)
- Implementation SPeeDI
- Algorithm for Phase Portrait construction (SPDIs)
- Other 2 dim Hybrid Systems
 - Between Decidability and Undecidability
 - Undecidability results
- Summary of Results and Perspectives



Motivation and Contributions



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Motivation and Contributions Challenge





Motivation and Contributions Contributions (Reachability)





Motivation and Contributions Scientific Context (Phase Portrait)

- Phase Portrait for PCDs
- Numerical algorithms for computing Viability Kernels



Motivation and Contributions

Contributions (Phase Portrait)

- Phase Portrait for SPDIs
 - Viability Kernel
 - Controllability Kernel



Reachability Analysis for SPDIs



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The Reachability Problem for SPDIs





The Reachability Problem for SPDIs



Reachability problem: Is there a trajectory from x_0 to x_f ?



Solving the Reachability Problem

1. From trajectories to simplified trajectories


















1. Simplification of trajectories





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1. Simplification of trajectories



Theorem: If there is an arbitrary trajectory between two points then it always exists a straightened non–crossing trajectory between them



Solving the Reachability Problem

- 1. From trajectories to simplified trajectories
- 2. From simplified trajectories to signatures



2. Abstraction into signatures



 $\sigma = e_1 e_2 e_3 \dots e_5 e_6 e_7 \dots e_{13} e_6 e_7 e_8 e_{15}$



Solving the Reachability Problem

- 1. From trajectories to simplified trajectories
- 2. From simplified trajectories to signatures
- 3. From signatures to *factorized signatures*



For $\sigma = e_1 e_2 e_3 \dots e_5 e_6 e_7 \dots e_{13} e_6 e_7 e_8 e_{15}$



We obtain the representation: $\sigma = e_1 e_2 e_3 (e_4 e_1 e_2 e_3)^2 e_5 e_6 e_7 e_8 (e_9 \cdots e_{13} e_6 e_7 e_8)^2 e_{15}$



5. Canonical Factorization of Signatures

Representation Theorem: Any edge signature $\sigma = e_1, e_2, \ldots, e_n$ can be represented as

$$\sigma = r_1(s_1)^{k_1} r_2(s_2)^{k_2} \dots r_n(s_n)^{k_n} r_{n+1}$$



5. Canonical Factorization of Signatures

Representation Theorem: Any edge signature $\sigma = e_1, e_2, \ldots, e_n$ can be represented as

$$\sigma = r_1(s_1)^{k_1} r_2(s_2)^{k_2} \dots r_n(s_n)^{k_n} r_{n+1}$$

• Properties:

- r_i is a seq. of pairwise different edges;
- s_i is a simple cycle;
- r_i and r_j are disjoint
- s_i and s_j are different

Proof based on topological properties of the plane



Solving the Reachability Problem

- 1. From trajectories to simplified trajectories
- 2. From simplified trajectories to signatures
- 3. From signatures to factorized signatures
- 4. From factorized signatures to types of signatures



Abstraction: Any edge signature

$$\sigma = r_1(s_1)^{k_1} r_2(s_2)^{k_2} \dots r_n(s_n)^{k_n} r_{n+1}$$

belongs to a type

$$type(\sigma) = r_1, s_1, r_2, s_2, \dots, r_n, s_n, r_{n+1}$$



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$$type(\sigma) = r_1, s_1, r_2, s_2, \dots, r_n, s_n, r_{n+1}$$

In the previous example:

 $type(\sigma) = e_1e_2e_3, e_4e_1e_2e_3, e_5e_6e_7e_8, e_9\cdots e_{13}e_6e_7e_8, e_{15}$



Abstraction: Any edge signature

$$\sigma = r_1(s_1)^{k_1} r_2(s_2)^{k_2} \dots r_n(s_n)^{k_n} r_{n+1}$$

belongs to a type

$$type(\sigma) = r_1, s_1, r_2, s_2, \dots, r_n, s_n, r_{n+1}$$

Prop. The set of types of signatures is finite



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Solving the Reachability Problem

- 1. From trajectories to simplified trajectories
- 2. From simplified trajectories to signatures
- 3. From signatures to factorized signatures
- 4. From factorized signatures to types of signatures
- 5. Analysis of each type of signature (computing successors)



Computing Successors (for σ)

One step ($\sigma = e_1 e_2$)





Several steps ($\sigma = e_1 e_2 e_3$)





Several steps ($\sigma = e_1 e_2 e_3 e_4 e_5$)





Computing Successors (for σ)

One cycle ($\sigma = s = e_1 e_2 \cdots e_8 e_1$)





Computing Successors (for σ)

One cycle ($\sigma = s = e_1 e_2 \cdots e_8 e_1$)



 $I^* = \mathsf{Succ}^*_{\sigma}(x) = [l^*, u^*] \cap e_1$





 e_1

 e_8

T'

 e_{13}

 e_2

 e_3

 e_6

 e_9

 e_{10}

 e_{12}

 e_{11}

Computing Successors

Lemma: Successors have the form

 $\operatorname{Succ}_{\sigma}(l, u) = [a_1l + b_1, a_2u + b_2] \cap J \text{ if } [l, u] \subseteq S$

Lemma: Fixpoint equations

$$[a_1l^* + b_1, a_2u^* + b_2] = [l^*, u^*]$$

can be explicitly solved (without iterating). We have that (I = [l, u]):

$$\mathsf{Succ}^*_\sigma(I) = [l^*, u^*] \cap J$$



Reachability Algorithm

for each type of signature τ do check whether $Reach_{\tau}(x_0, x_f)$

To test whether $Reach_{\tau}(x_0, x_f)$ for

$$\tau = r_1(s_1)^* \cdots (s_n)^* r_{n+1}$$

Compute $Succ_r$ Accelerate $(Succ_s)^*$



Reachability: Main Result

- The capability of computing fixpoints for simple cycles (acceleration)
- The set of types of signatures is finite

Reachability is decidable for SPDI



SPeeDI: a Tool for SPDIs



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- We have implemented the reachability algorithm for SPDIs: SPeeDI (joint work with Gordon Pace)
- Language: Haskell



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Animate





Animate





Animate



Phase Portrait of SPDIs



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Phase Portrait: a picture of important objects of a dynamical system



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Phase Portrait: a picture of important objects of a dynamical system





Phase Portrait: a picture of important objects of a dynamical system





Phase Portrait: a picture of important objects of a dynamical system




Phase Portrait

Phase Portrait: a picture of important objects of a dynamical system





Viab(σ): Is the greatest set of initial points of trajectories which can cycle forever in σ



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Example: $\sigma = e_1 e_2 \dots e_8 e_1$





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Theorem: $Viab(\sigma) = \overline{Pre}_{\sigma}(Dom(Succ_{\sigma}))$



Controllability Kernel

 $Cntr(\sigma)$: Is the greatest set of mutually reachable points via trajectories that remain in the cycle



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Controllability Kernel

 $Cntr(\sigma)$: Is the greatest set of mutually reachable points via trajectories that remain in the cycle

Example: $\sigma = e_1 e_2 \dots e_8 e_1$



Theorem: $Cntr(\sigma) = (\overline{Succ}_{\sigma} \cap \overline{Pre}_{\sigma})(\mathcal{C}_{\mathcal{D}}(\sigma))$



Algorithm: phase portrait for SPDIs

for each simple cycle σ do Compute Viab (σ) (viability kernel) Compute Cntr (σ) (controllability kernel)



Algorithm: phase portrait for SPDIs

for each simple cycle σ **do** Compute Viab (σ) (*viability kernel*) Compute Cntr (σ) (*controllability kernel*)

Both kernels are exactly computed by non-iterative algorithms!



Properties of the Kernels

Theorem: Any viable trajectory in σ converges to $Cntr(K_{\sigma})$



- Controllability Kernel: 'Weak' analog of limit cycle
- Viability Kernel: Its 'local" attraction basin



Convergence Properties

Every trajectory with infinite signature without self-crossings converges to the controllability kernel of some simple edge-cycle





Between Decidable and Undecidable



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More complex 2-dim systems

What happens if ...

- ... we allow jumps?
- ... the PCD is on a 2-dim surface/manifold?
- ...?



More complex 2-dim systems

What happens if ...

- ... we allow jumps?
- ... the PCD is on a 2-dim surface/manifold?
- ...?

Answer: Reachability is equivalent to a well known open problem



1-dim Piecewise Affine Maps (PAMs): $f : \mathbb{R} \to \mathbb{R}, f(x) = a_i x + b_i \text{ for } x \in I_i$



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Example: Torus





Example: Torus







Example: Torus







Example: Torus







Example: Torus







Example: Torus





Example: Torus





Reachability?

Theorem: $PCD_{2m} \equiv PAM$



Hierarchical PCDs (HPCD)





Hierarchical PCDs (HPCD)



Reachability?

Theorem: HPCD \equiv PAM



Undecidable 2-dim Systems



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Undecidability Results

- HPCDs with One Counter (HPCD $_{1c}$)
- HPCDs with Infinite Partition ($HPCD_{\infty}$)
- Origin-dependent rate HPCDs (HPCD_x)



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Undecidability Results

- HPCDs with One Counter (HPCD $_{1c}$)
- HPCDs with Infinite Partition ($HPCD_{\infty}$)
- Origin-dependent rate HPCDs (HPCD_x)

Reachability? UNDECIDABLE!

Theorem:

 $HPCD_{1c}, HPCD_{\infty} \text{ and } HPCD_{x}$ simulate Turing machines



Summary of Results



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Summary of Results

PCD ---- **SPDI**

A - - - - B "A is a particular case of B"



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A - - - - B "A is a particular case of B"



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$$A - - - - B$$
 "A is a particular case of B"



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A - - - - B "A is a particular case of B"





A \longrightarrow B "A is simulated by B"





A - - - - B "A is a particular case of B"

A \longrightarrow B "A is simulated by B"





A - - - - B "A is a particular case of B"

 $A \longrightarrow B$ "A is simulated by B"



Perspectives

- SPDI to approximate non-linear differential equations
- Conditions for decidability of PCDs on 2-dim manifolds
- Application of the *geometric* method to higher dimensions
- Extension of SPeeDI: algorithm for viability and controllability kernels
- SPeeDI: "Topological" optimizations



Merci! Gracias! Obrigado! (Brasil Penta-Campeão!) Thank you!



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Theorem de Poincaré-Bendixson

A non-empty compact limit set of C^1 planar dynamical system that contains no equilibrium points is a close orbit.



Comparison with HyTech

Example:





Comparison with HyTech

Final Point	HyTech	SPeeDI	Reachable
199	overflow	0.05 sec	Yes
200	overflow	0.05 sec	No
201	overflow	0.01 sec	No
210	overflow	0.05 sec	No
5	0.04 sec	0.05 sec	No
20	0.07 sec	0.05 sec	No
$\frac{200}{9}$	0.10 sec	0.05 sec	Yes
$\frac{201}{9}$	overflow	0.03 sec	Yes
$\frac{199}{9}$	0.07 sec	0.04 _{Algorithmic Anal}	ysis of Polygonal Hybrid Syste





K_{σ}





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Composition of TAMFs

TAMFs are closed under composition: For

$$\mathcal{F}_1(x) = F_1(\{x\} \cap S_1) \cap J_1$$

and

$$\mathcal{F}_2(x) = F_2(\{x\} \cap S_2) \cap J_2$$

we have that

$$\mathcal{F}_2 \circ \mathcal{F}_1(x) = \mathcal{F}_{F',S',J'}(x)$$

with $F' = F_2 \circ F_1,$ $J' = J_2 \cap F_2(J_1 \cap S_2)$ and $S' = S_1 \cap F_1^{-1}(J_1 \cap S_2)$



Reachability Algorithm (Example)



- Type of signature: $\sigma = (e_1 \cdots e_8)^*$
- Successor for the loop $s = e_1 \dots e_8$:

$$\begin{aligned} \mathsf{Succ}_s(l, u) &= \left[\frac{l}{2} - \frac{1}{20}, \frac{u}{2} + \frac{23}{60}\right] \cap \left(\frac{1}{5}, 1\right) \\ & \text{if } \left[l, u\right] \subseteq (0, 1) \end{aligned}$$



Reachability Algorithm (Example)

- Fixpoint equation: $Succ_{e_1...e_8}(I^*) = I^*$
- Solution: $I^* = [l^*, u^*] = [\frac{1}{5}, \frac{23}{30}]$
- Hence: $\operatorname{Succ}_{e_1...e_8}(x_0) \subseteq \left[\frac{1}{5}, \frac{23}{30}\right]$

















 $\mathsf{Viab}(K) = A \cup B$

- *M* is a *viability domain* if $\forall x \in M, \exists$ at least one trajectory ξ , starting in x and remaining in *M*
- Viab(K): *Viability kernel* of K is the largest viability domain M contained in K



Viability Kernel for SPDIs

• We can easily compute the Viability Kernel for one cycle, which is a polygon



Viability Kernel for SPDIs

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Viability Kernel for SPDIs

• We can easily compute the Viability Kernel for one cycle, which is a polygon



• **Theorem:** $Viab(K_{\sigma}) = \overline{Pre}_{\sigma}(Dom(Succ_{\sigma}))$











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 $\operatorname{Cntr}(K) = A$

• *M* is *controllable* if $\forall x, y \in M$, \exists a trajectory segment ξ starting in x that reaches an arbitrarily small neighborhood of y without leaving *M*

• Controllability kernel of K, denoted Cntr(K), is the largest controllable subset of K



Controllability Kernel for SPDIs





Controllability Kernel for SPDIs



Theorem: Cntr(K_σ) = (Succ_σ ∩ Pre_σ)(C_D(σ))
(We know how to compute the special interval
C_D(σ) = [l, u])



PAM simulate HPCD





HPCD simulate PAM





RA_{1cl1mc} equivalent to PAM





RA_{2cl} equivalent to PAM







RA_{1sk1sl} equivalent to PAM





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(b)

From RA_{1sk1sl} to LA_{st}





where $b_i = C_i + B_i a_i$ and $b_j = C_j + B_j a_j$



PCD_{2m} simulate PAM_{inj}





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$HPCD_{1c}$ simulate TM



 PCD_i

 $PCD'_i; PCD''_i$



$\mathrm{HPCD}_{\mathrm{1c}}$ simulate TM

TM-state q_i :







