

A Compositional Algorithm for Parallel Model Checking of Polygonal Hybrid Systems

Gordon Pace¹ Gerardo Schneider²

¹Dept. of Computer Science and AI – University of Malta

²Dept. of Informatics – University of Oslo

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- 1 Introduction
 - Hybrid Systems
 - Polygonal Hybrid Systems (SPDIs)
 - Motivation
- 2 Phase Portrait of SPDIs
 - Controllability and Viability Kernels
- 3 Independent Questions and Parallelization
 - SPDI Decomposition
 - Unavoidable Kernels
 - Counting Subproblems
- 4 Parallel Algorithm for Reachability

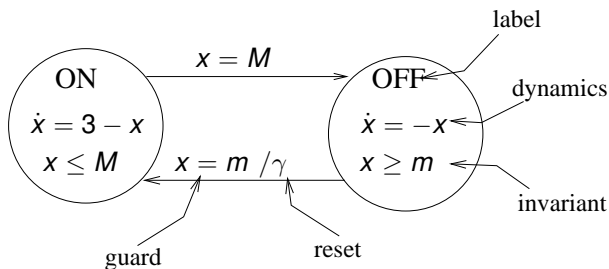


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Hybrid Systems

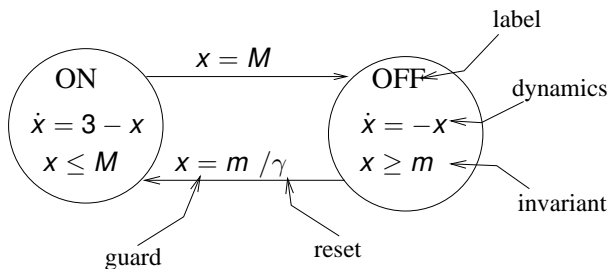
- Usual representation: Hybrid Automata



In general, we can have *differential inclusions* instead of differential equations

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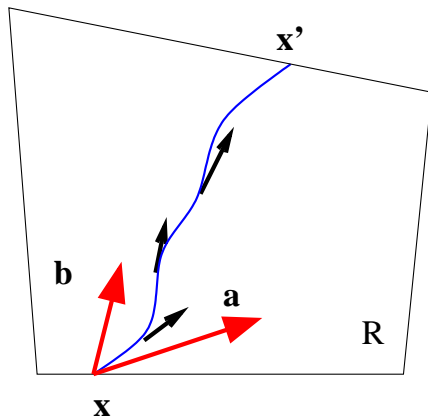
Polygonal Hybrid Systems (SPDIs)

- A finite partition of the plane into convex polygonal sets (regions)
- Dynamics given by the angle determined by two vectors: $\dot{x} \in \angle_{\mathbf{a}}^{\mathbf{b}}$



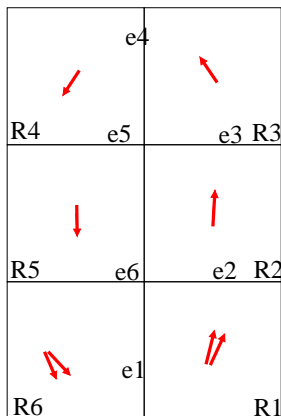
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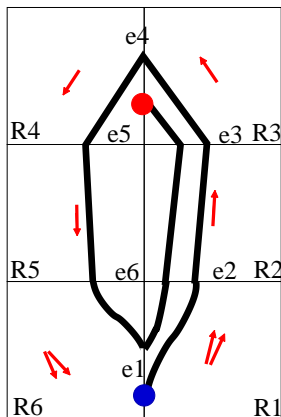
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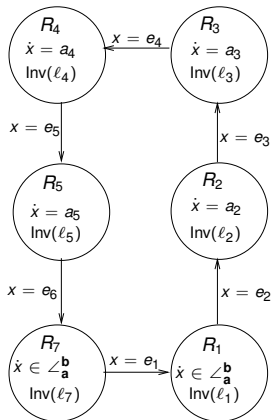
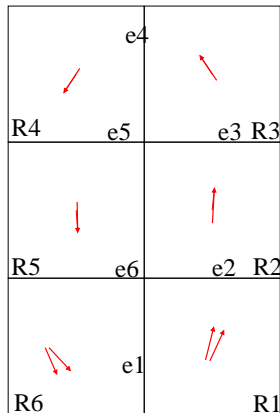
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Polygonal Hybrid Systems (SPDIs)

- An SPDI can be seen as a hybrid automaton



Polygonal Hybrid Systems (SPDIs)

Underlying Graph

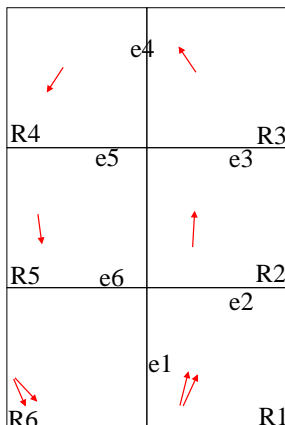
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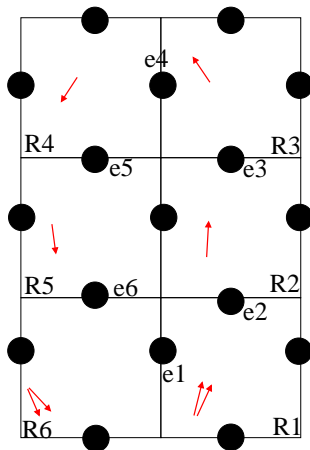
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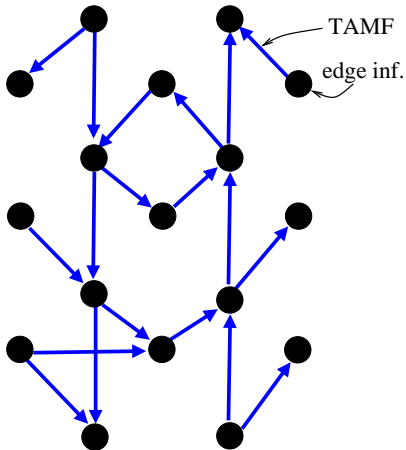
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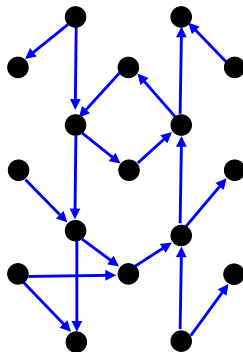
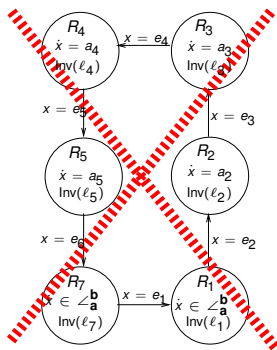
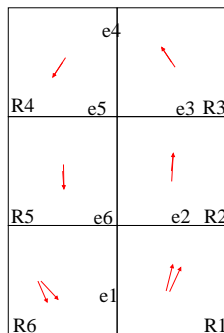
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Polygonal Hybrid Systems (SPDIs)

Three Views



- We will, however, use the geometrical representation in what follows instead for clarity of presentation



Known Results about SPDIs

- Reachability is decidable –in the plane
(based on Poincaré maps, finite charact. of simple cycles, acceleration, ...)
 - DFS algorithm (HSCC'01)
 - BFS algorithm (VMCAI'04)
 - Tool: SPeeDI (CAV'02)
- Reachability is undecidable –3-dim and higher (ICALP'94)
- For slight extensions in 2-dim reachability is an open question, for others is undecidable (CONCUR'02, FSTTCS'05)
- Phase portrait computation
 - Viability and controllability kernels (HSCC'02)
 - Invariance kernels (NJC'04)
 - Semi-separatrices (FORMATS'06)

Contributors: E. Asarin, O. Maler, V. Mysore, G. Pace, A. Pnueli, G. Schneider, S. Yovine



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- Application: Use of SPDIs for approximating non-linear differential equations
 - Triangulation of the plane: Huge number of regions
- Need to reduce the complexity ... without too much overhead
 - Static analysis to reduce the state space
 - **Parallelizing the reachability algorithm**



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- Reduction of memory and time requirements are the main reasons for seeking parallelization
 - In verification the main bottleneck is usually memory
- The challenge:

To partition the task among different processes keeping a balanced distribution of the use of memory and execution time... without a high communication cost

And, if possible

compositionally

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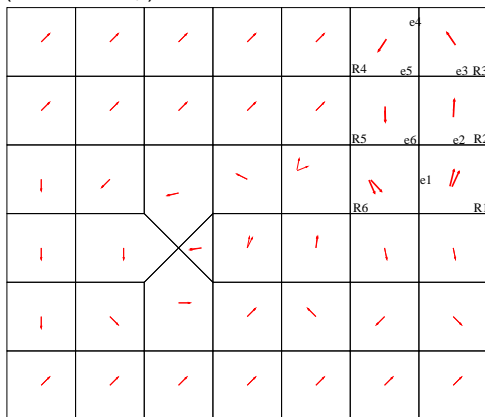


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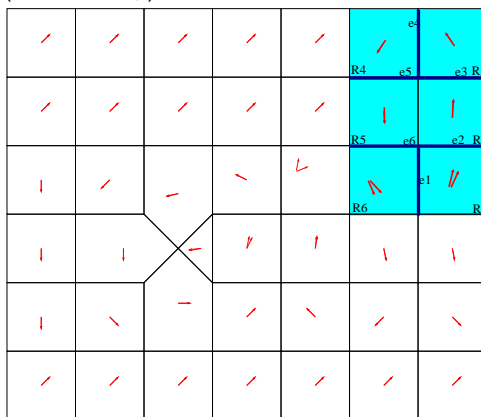
Few Preliminaries

- We only need to consider simple cycles
 - Given a sequence of non-repeating edges (except for the first and last edge) – e.g., $\sigma = e_1, \dots, e_k, e_1$
 - Consider the polygonal subset of the SPDI determined by such sequence (denoted K_σ)



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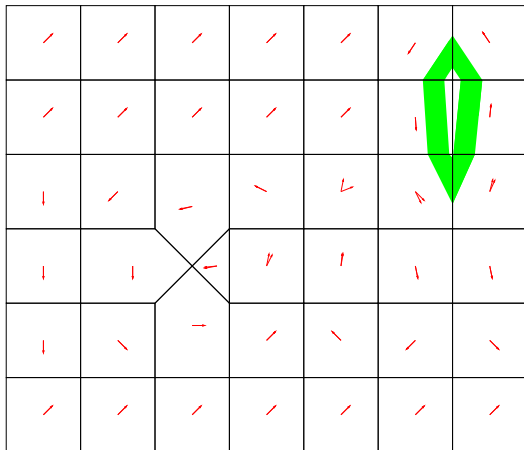
Controllability Kernels

- Given K_σ , its **controllability kernel** is the largest subset such that any two points are reachable from each other



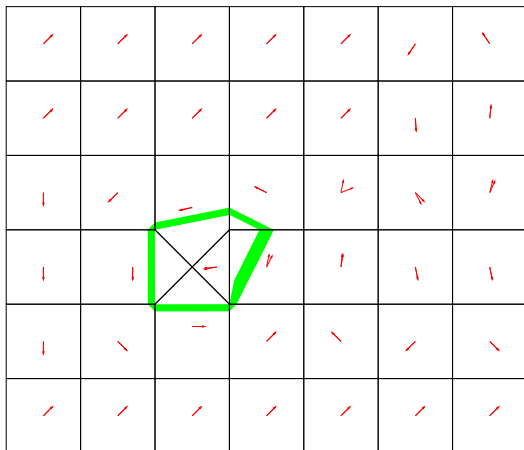
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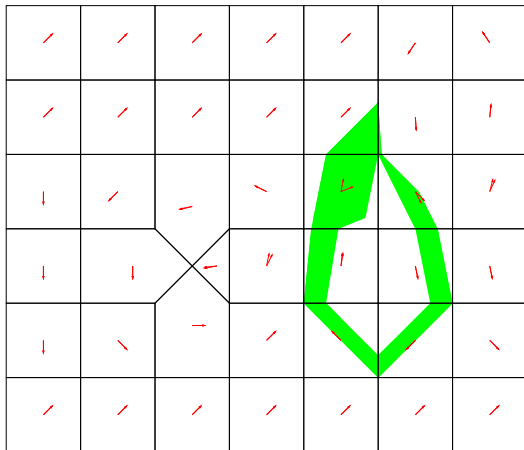
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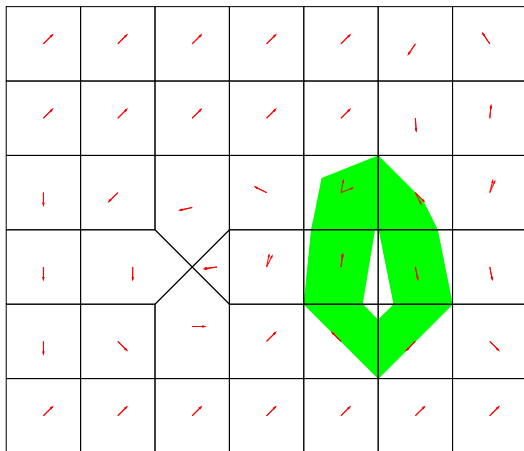
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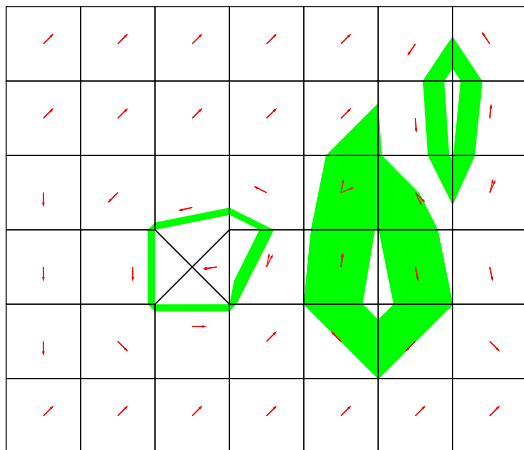
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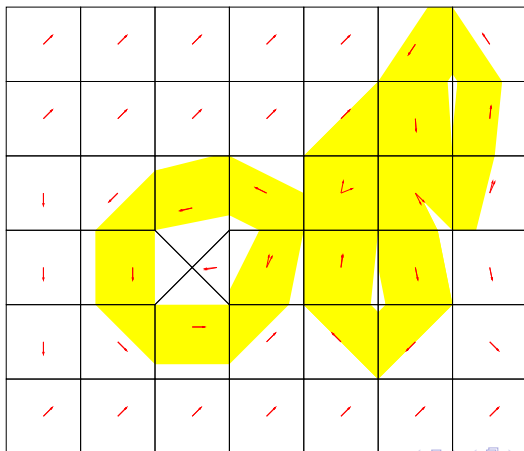
Viability Kernels

- Given K_σ , its **viability kernel** is the largest subset such that for any point in the set, there is at least one trajectory which remains in the set forever



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SPDI Decomposition

Given an SPDI and a reachability question, for each controllability kernel, we can:

- 1 Answer the reachability question without any further analysis;
- 2 Reduce the state space necessary for reachability analysis; or
- 3 Decompose the reachability question into two smaller, and independent reachability questions



1. Immediate Answer

- Two interesting properties:
 - Within the controllability kernel of a loop, any two points are mutually reachable
 - Any point on the viability kernel of the same loop can eventually reach the controllability kernel

Theorem 1

Given an SPDI \mathcal{S} , K_σ , and two points I and I' , if

- 1 $I \subseteq \text{Viab}(K_\sigma)$, and
- 2 $I' \subseteq \text{Cntr}(K_\sigma)$

then $\text{REACH}(\mathcal{S}, I, I')$.



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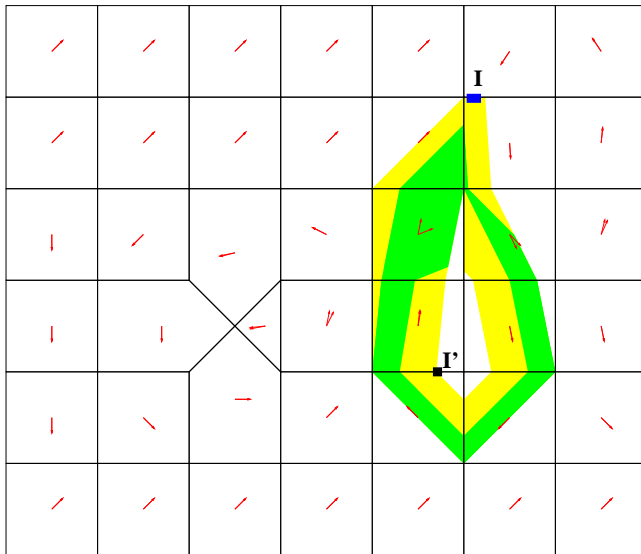
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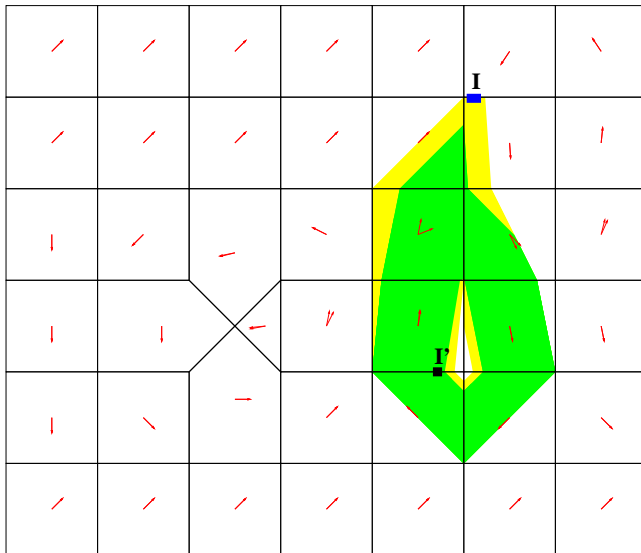
1. Immediate Answer

Example



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2. Reduction of the State-Space

Theorem 2

Given an SPDI S , two points I and I' and a controllability kernel $C = \text{Cntr}(K_\sigma)$, if

1 $I \subseteq C_{in}$, and

2 $I' \subseteq C_{in}$,

then $\text{REACH}(S, I, I')$ iff $\text{REACH}(S \setminus C_{out}, I, I')$.

Similarly, if

1 $I \subseteq C_{out}$, and

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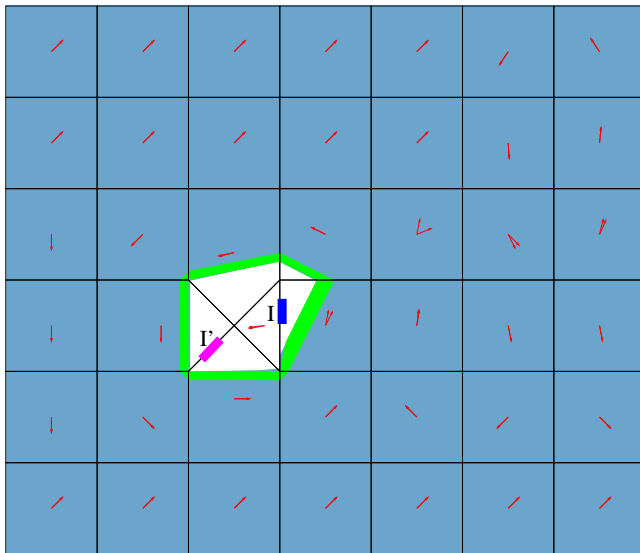
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2. Reduction of the State-Space

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3. Decomposition into Independent Questions

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Similarly, for $I \subseteq C_{out}$, and $I' \subseteq C_{in}$.



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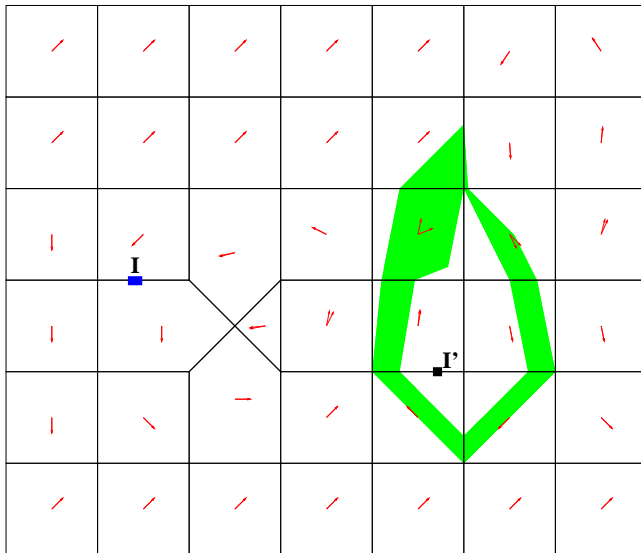
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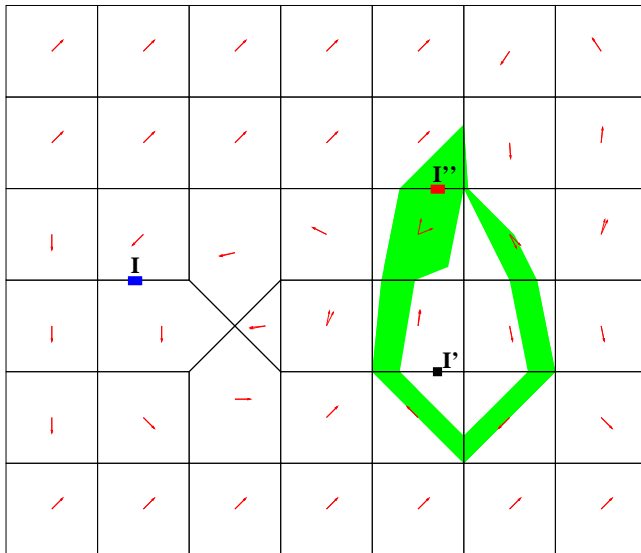
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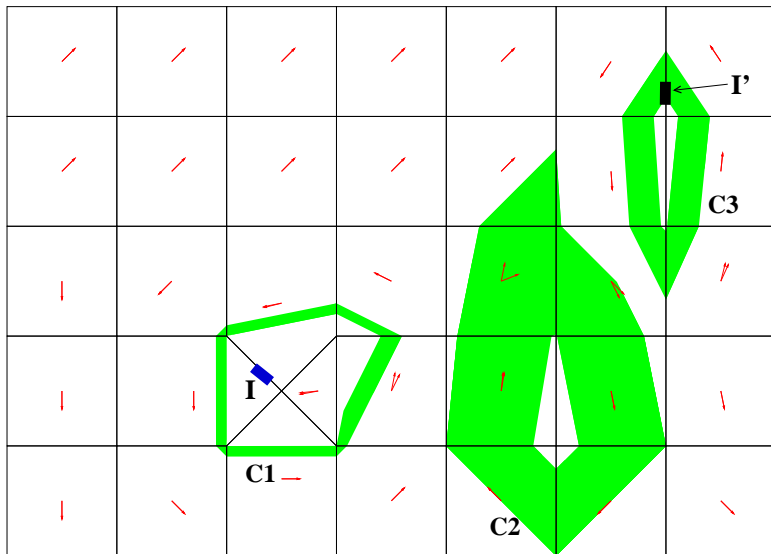


Definition

Given an SPDI \mathcal{S} and two points l and l' , we say that a controllability kernel $\text{Cntr}(K_\sigma)$ is **unavoidable** if any segment of line with extremes on points lying on l and l' intersects with both the edges of $\text{Cntr}^l(K_\sigma)$ and those of $\text{Cntr}^u(K_\sigma)$ an odd number of times (disregarding tangential intersections with vertices).

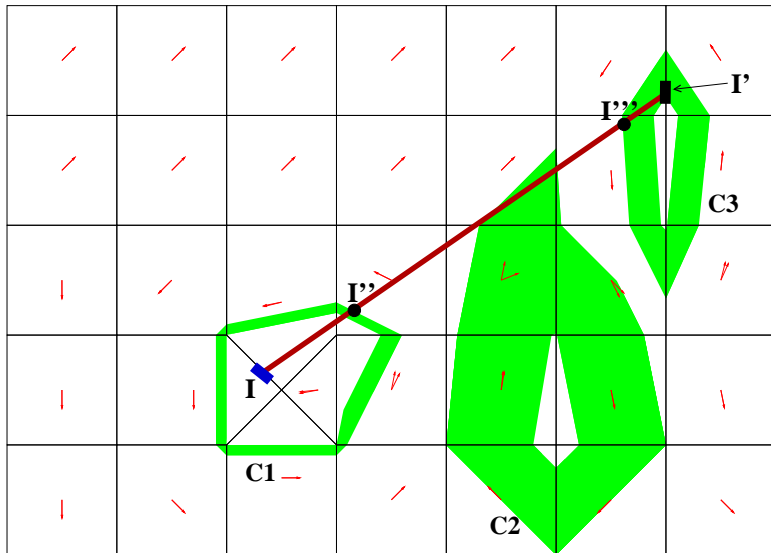
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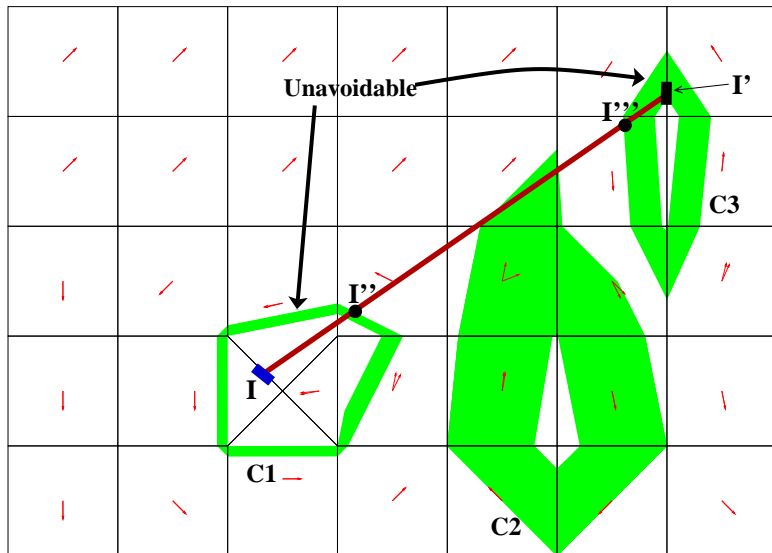
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Unavoidable Kernels

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Theorem

Given an SPDI \mathcal{S} , two points I and I' , and a controllability kernel $C = \text{Cntr}(K_\sigma)$, then C is an unavoidable kernel if and only if one of the following conditions holds

- $I \subseteq C_{in}$ and $I' \subseteq C_{out}$; or
- $I \subseteq C_{out}$ and $I' \subseteq C_{in}$.



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Counting Subproblems

Theorem (upper bound)

Given an SPDI \mathcal{S} and two points l and l' , the question $\text{REACH}(\mathcal{S}, l, l')$ can be split into no more than \mathbf{k} reachability questions, \mathbf{k} is the number of **mutually-disjoint controllability kernels**

Theorem (lower bound)

Given an SPDI \mathcal{S} and two points l and l' , the question $\text{REACH}(\mathcal{S}, l, l')$ can be split into at least $\mathbf{u}+1$ reachability questions, \mathbf{u} is the number of **mutually-disjoint unavoidable controllability kernels**



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Algorithm

```
function ReachPar( $\mathcal{S}$ ,  $l$ ,  $l'$ ) =  
  ReachParKernels ( $\mathcal{S}$ , ControllabilityKernels( $\mathcal{S}$ ),  $l$ ,  $l'$ )
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function ReachParKernels( $\mathcal{S}$ , [],  $l$ ,  $l'$ ) =  
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function ReachParKernels( $\mathcal{S}$ ,  $k:ks$ ,  $l$ ,  $l'$ ) =  
  if (ImmediateAnswer( $\mathcal{S}$ ,  $l$ ,  $l'$ )) then  
    True;  
  elsif (SameSideOfKernel( $\mathcal{S}$ ,  $k$ ,  $l$ ,  $l'$ )) then  
     $\mathcal{S\_I} := \mathcal{S} \setminus \text{EdgesOnOtherSideOf}(\mathcal{S}, k, l')$ ;  
    ReachParKernels( $\mathcal{S\_I}$ ,  $ks$ ,  $l$ ,  $l'$ );  
  else  
     $\mathcal{S\_I} := \mathcal{S} \setminus \text{EdgesOnOtherSideOf}(\mathcal{S}, k, l)$ ;  
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    parbegin  
       $r1 := \text{ReachParKernels}(\mathcal{S\_I}, ks, l, \text{viability}(k))$ ;  
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  return ( $r1$  and  $r2$ );
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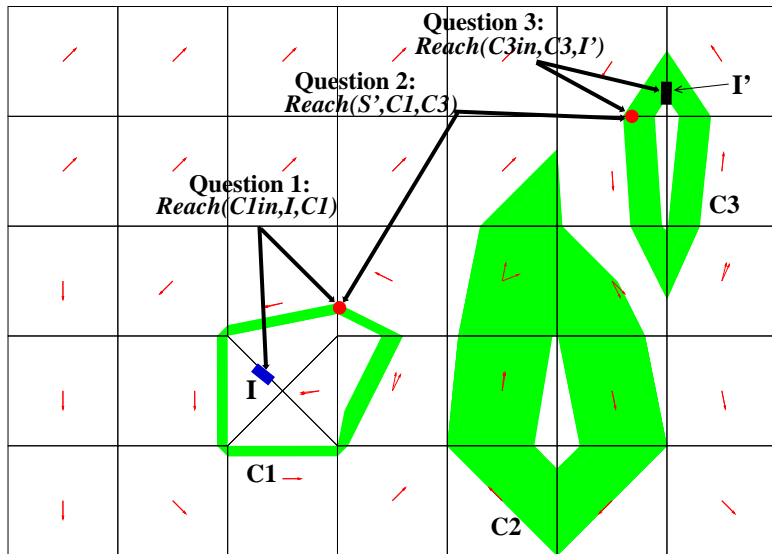
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  else {Theorem 3}  
     $\mathcal{S\_I} := \mathcal{S} \setminus \text{EdgesOnOtherSideOf}(\mathcal{S}, k, l)$ ;  
     $\mathcal{S\_I}' := \mathcal{S} \setminus \text{EdgesOnOtherSideOf}(\mathcal{S}, k, l')$ ;  
    parbegin  
       $r1 := \text{ReachParKernels}(\mathcal{S\_I}, ks, l, \text{viability}(k))$ ;  
       $r2 := \text{ReachParKernels}(\mathcal{S\_I}', ks, k, l')$ ;  
    parend;  
  return ( $r1$  and  $r2$ );
```



Parallel (Independent) Reachability Questions

Example



Theorem

Given an SPDI \mathcal{S} and two points $l \subseteq e$ and $l' \subseteq e'$,

$$\begin{aligned} & \text{REACH}(\mathcal{S}, l, l') \\ & \text{iff} \\ & \text{REACH}_{||}(\mathcal{S}, l, l'). \end{aligned}$$



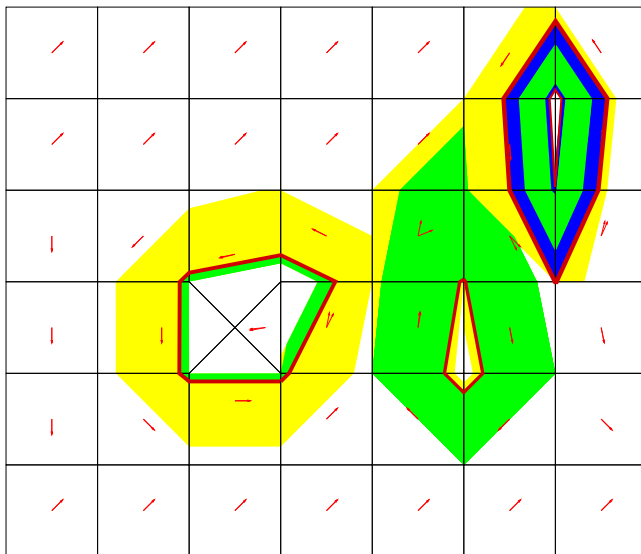
- A parallel algorithm for reachability analysis of polygonal hybrid systems
 - Compositional
 - Each parallel task is performed, in general in smaller independent state-spaces
 - No extra work needed to perform the computation of the kernels: identification and analysis of loops is performed in the first part of the reachability algorithm
 - The only extra work is the computation of unavoidable kernels
- Combination of techniques
 - The detection of *unavoidable* kernels may be done by using standard geometrical test (odd-parity test, used in computer graphics)
 - The analysis is then performed on the graph



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Thank you!



Extensions and Applications

- Not exact extensions to higher dimensions (undecidable)
 - Maybe use the idea for approximations
- Use of SPDIs for approximating non-linear differential equations on the plane
 - Approximation of phase portrait objects

Implementation

- Implementation in SPeeDI⁺



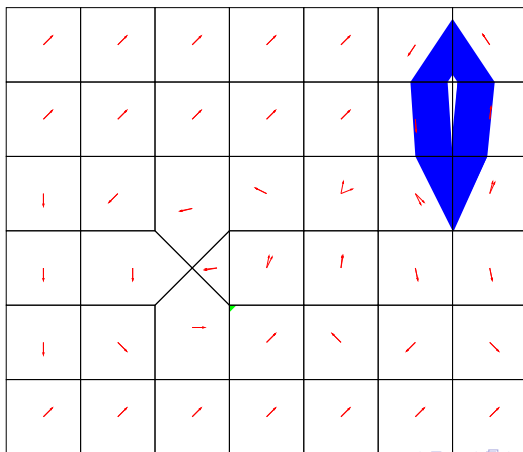
Invariance Kernels

- Given K_σ , its **invariance kernel** is the largest subset such that for any point x in the set, there is at least one trajectory starting in it and every trajectory starting in x is viable



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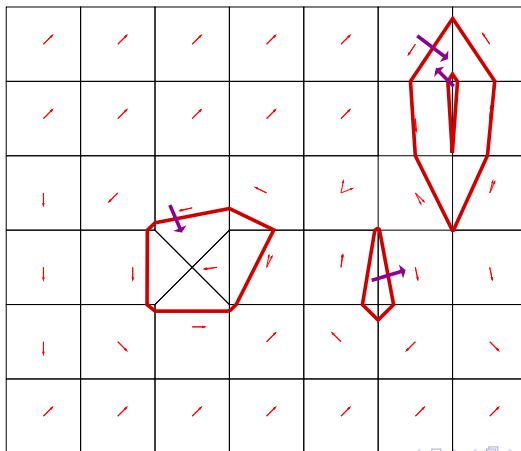
Semi-Separatrices

- A **semi-separatrix** is a closed curve dissecting the state space into two subsets such that one is reachable from the other but not vice-versa



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Based on properties of limit trajectories on simple cycles and the invariance kernel we have an algorithm for computing semi-separatrices

Theorem

The computation of semi-separatrices for SPDs is decidable