

What's Decidable about Discrete Linear Dynamical Systems?

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Max Planck Institute for Software Systems

Joint work with: Toghrul Karimov, Shaul Almagor, Ventsi Chonev, Edon Kelmendi, Engel Lefauchaux, Florian Luca, Joris Nieuwveld, David Purser, João Sousa Pinto, Anton Varonka, Markus Whiteland, James Worrell, ...

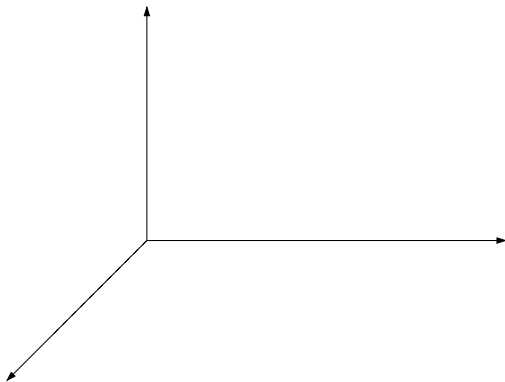
Theorietag Automaten und Formale Sprachen
Kaiserslautern, Oktober 2023

Reachability for discrete linear dynamical systems

Ambient space: \mathbb{R}^d (\mathbb{R}^3 in this example)

Starting point: $\mathbf{x} \in \mathbb{Q}^d$

Linear transformation: $\mathbf{M} \in \mathbb{Q}^{d \times d}$

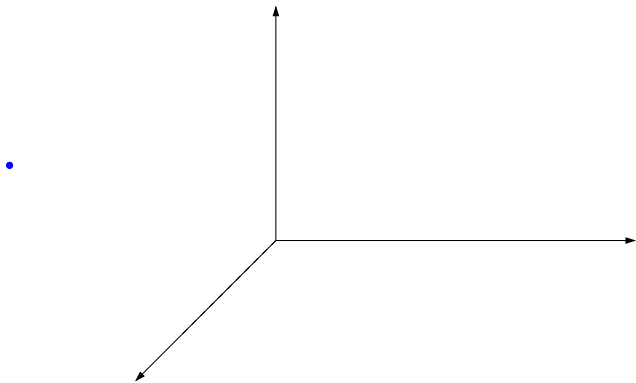


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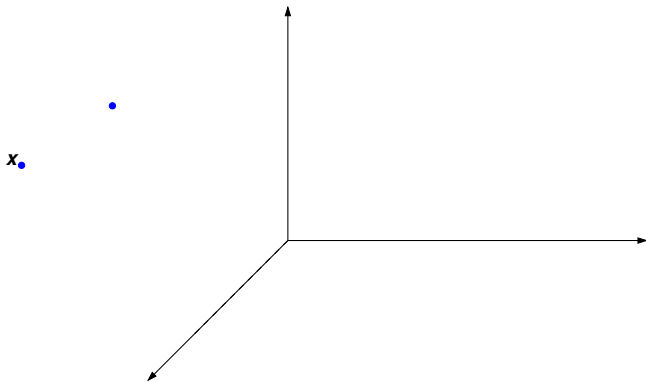
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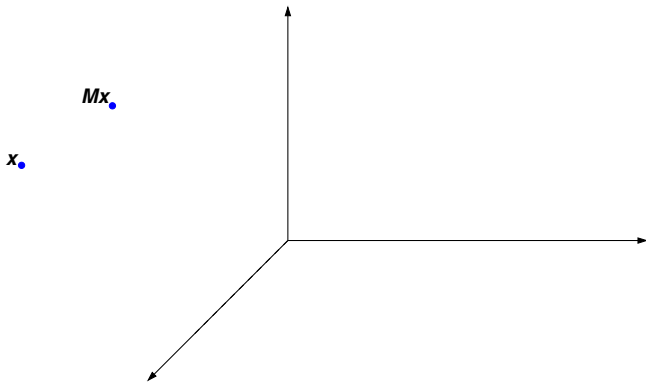


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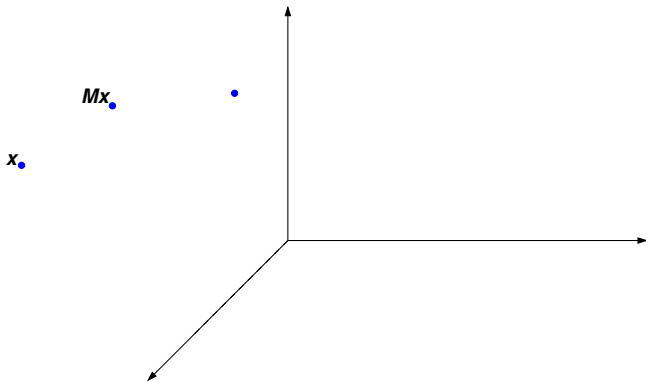


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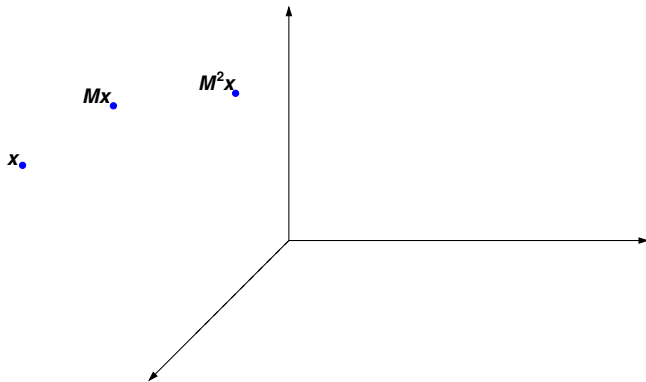


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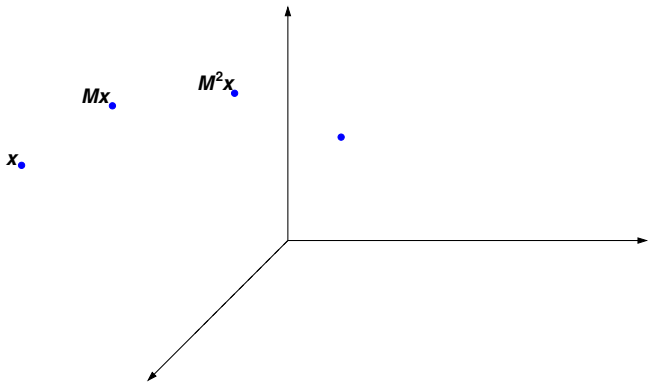


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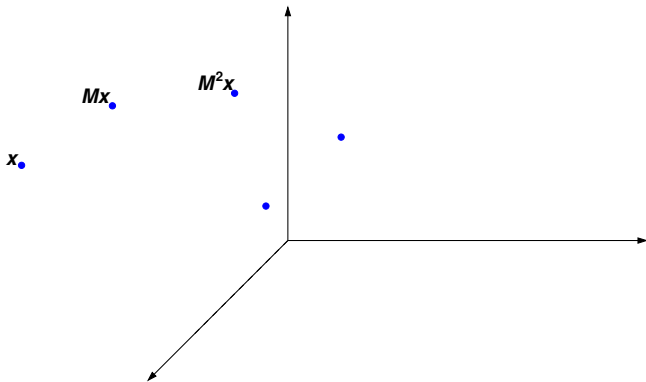


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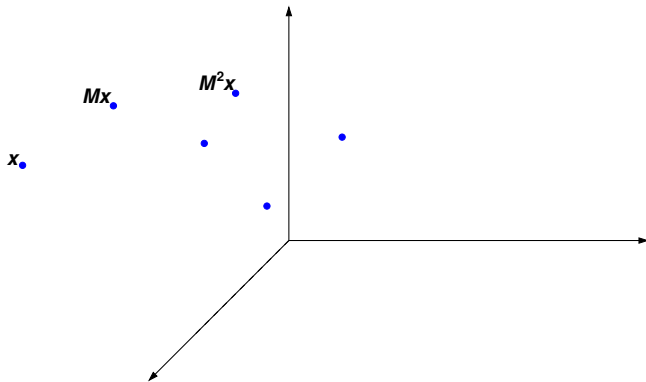


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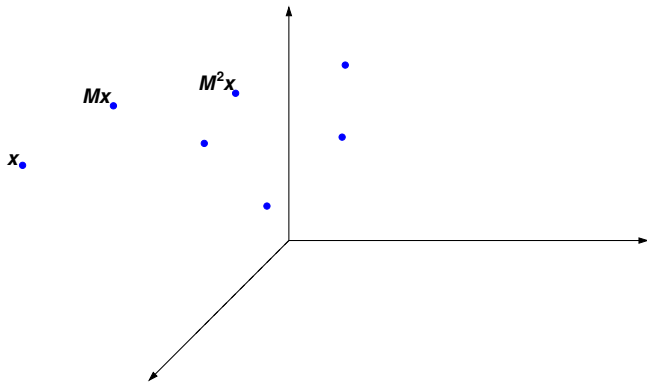


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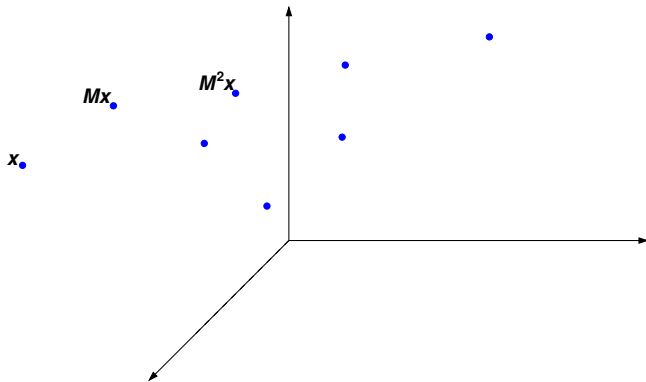


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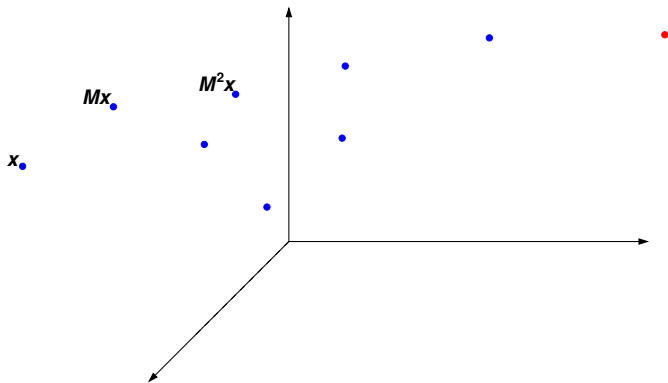


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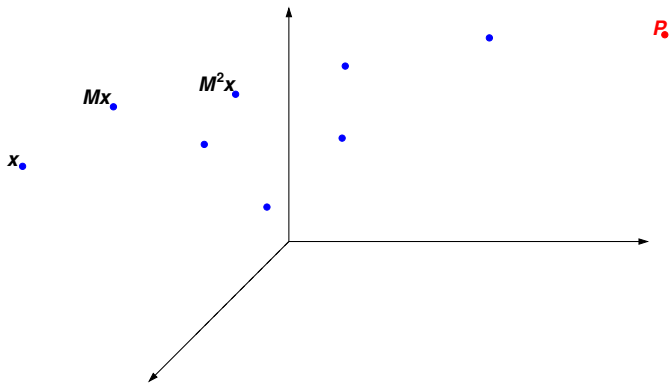


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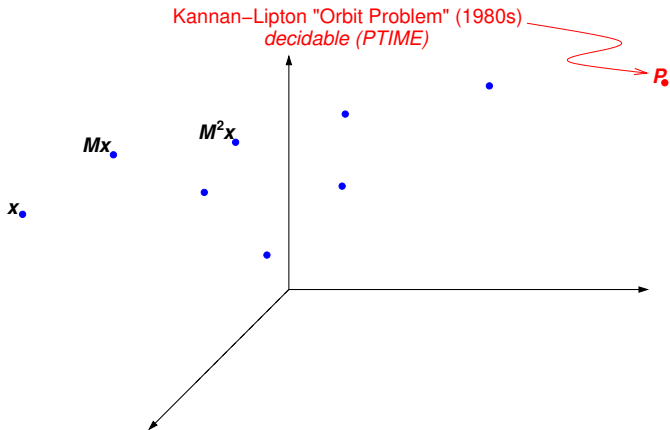


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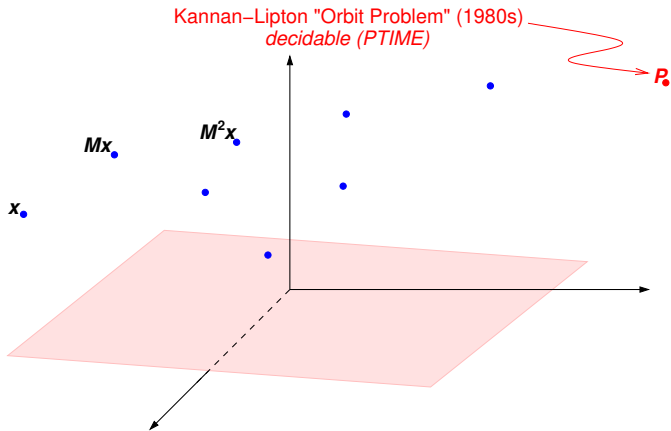


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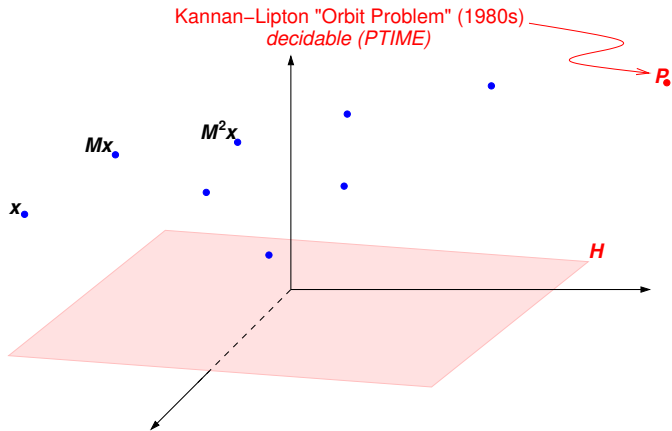


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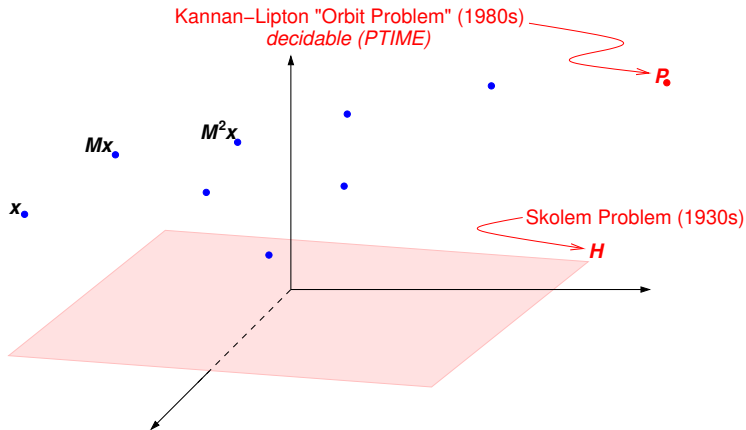


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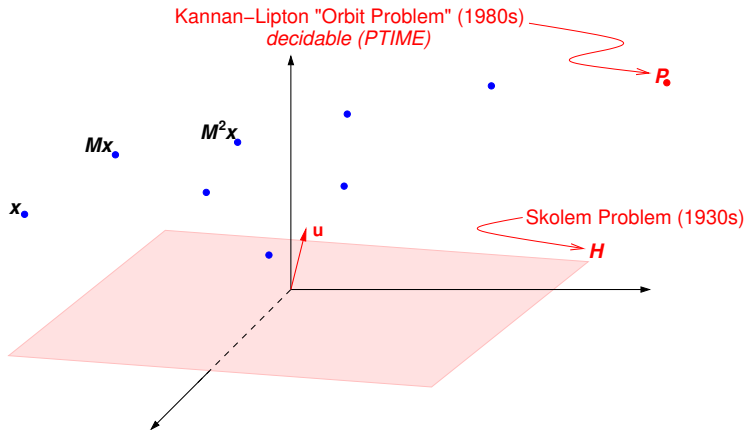


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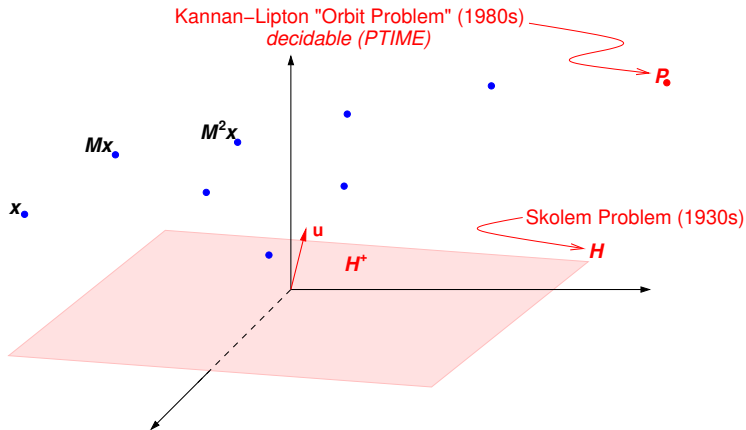


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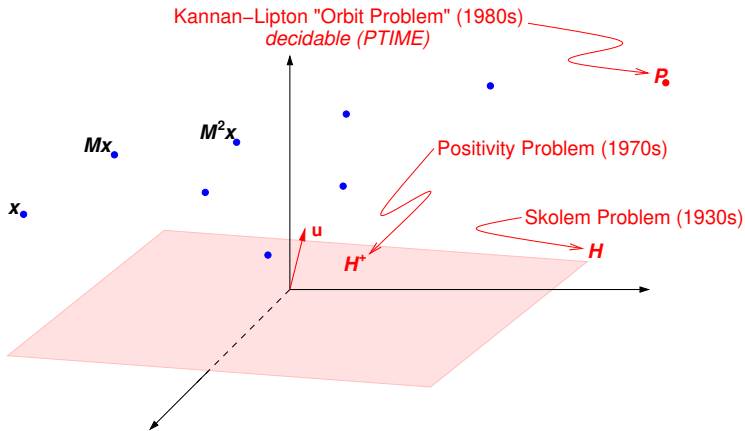


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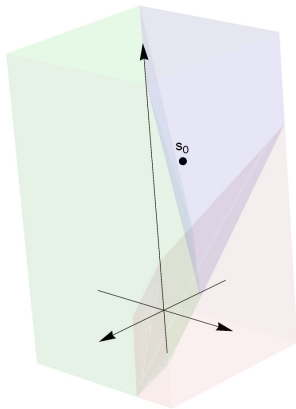
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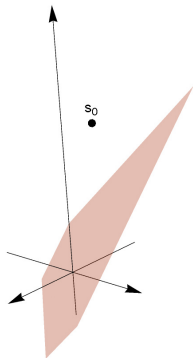
Semialgebraic partitions

Partition \mathbb{R}^d into



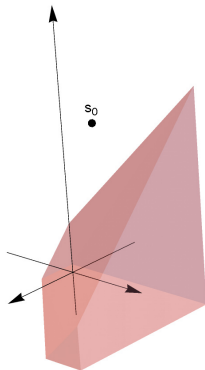
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Partition \mathbb{R}^d into S_1



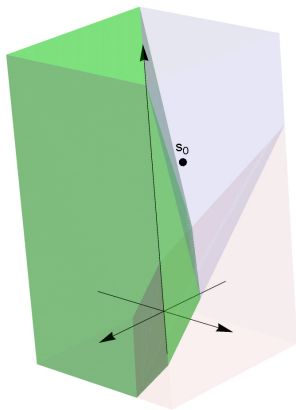
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Partition \mathbb{R}^d into S_1, S_2



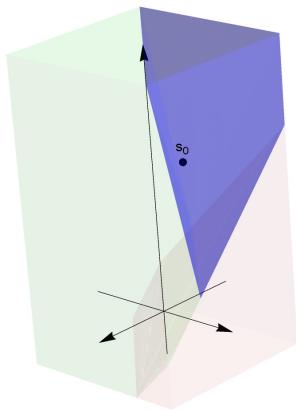
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Partition \mathbb{R}^d into S_1, S_2, S_3



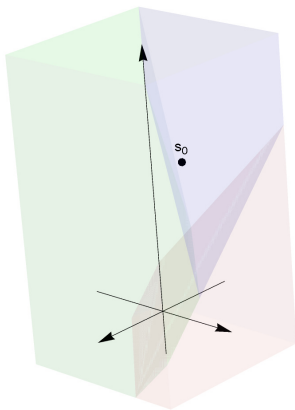
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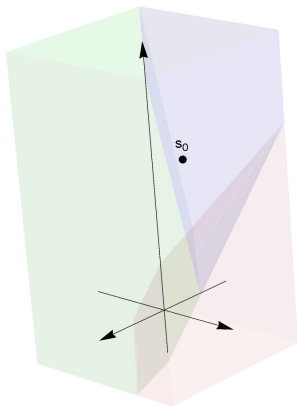
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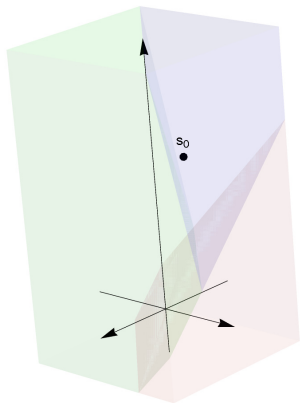
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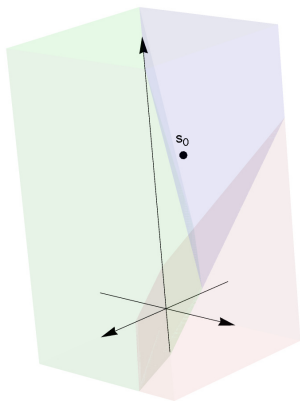
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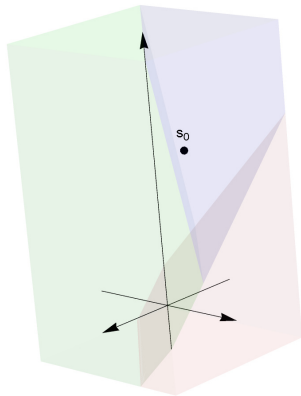
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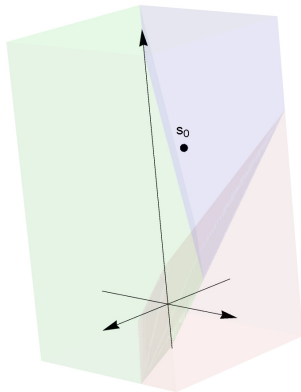
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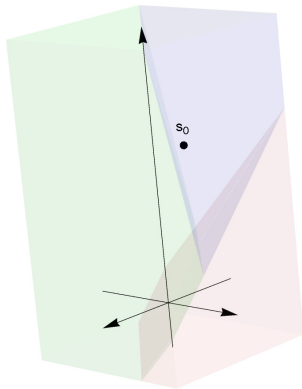
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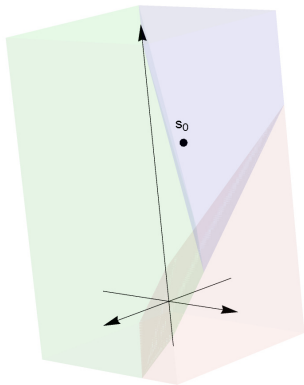
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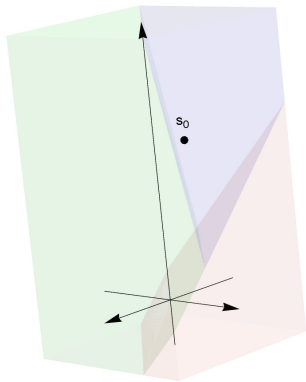
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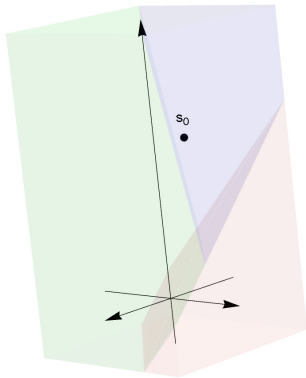
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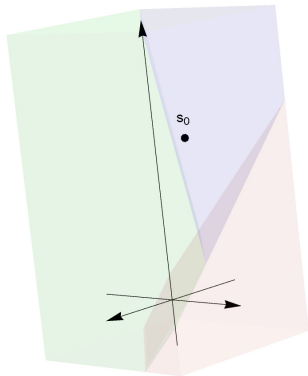
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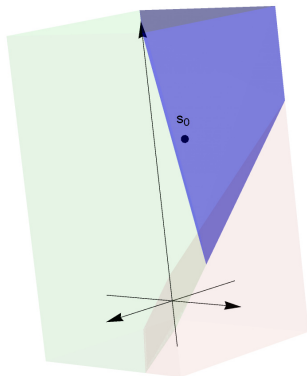
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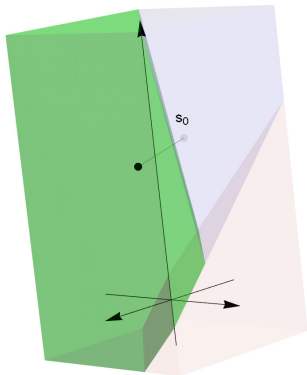
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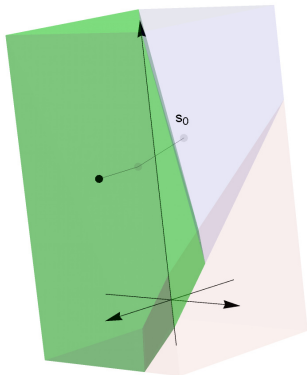
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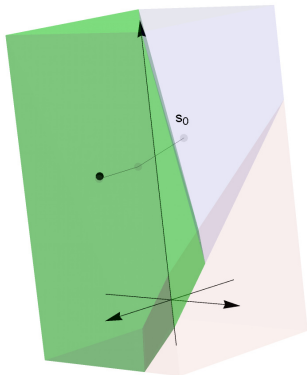
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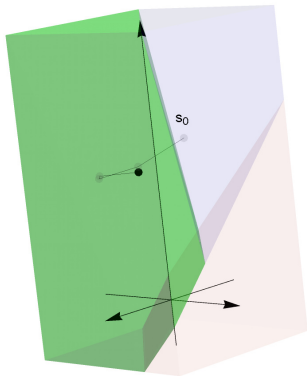
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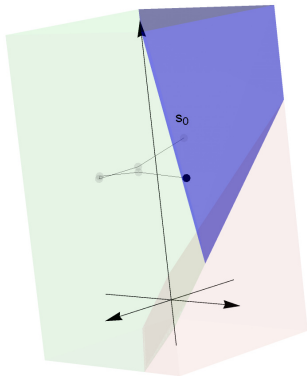
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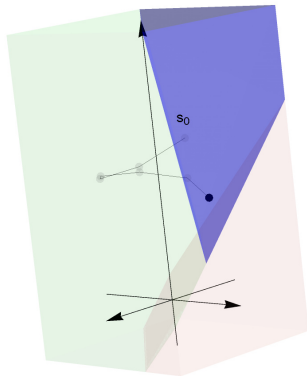
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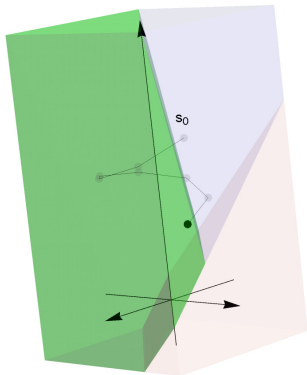
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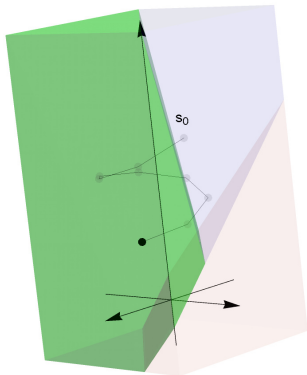
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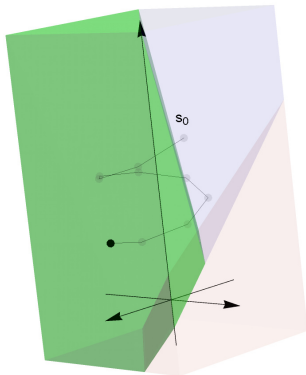
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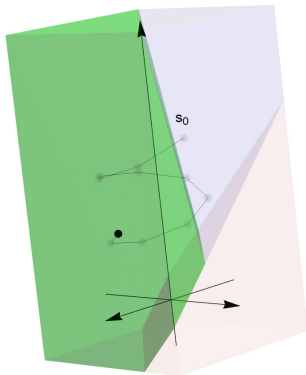
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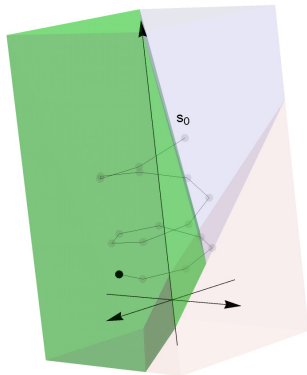
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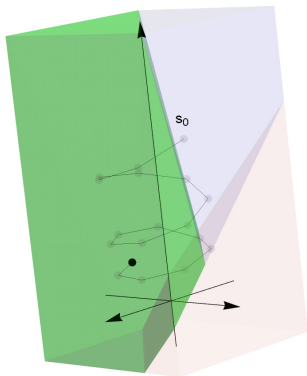
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Model checking discrete linear dynamical systems

$w =$  ...
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The Model-Checking Problem:

Given \mathcal{W} and a specification φ , decide if $\mathcal{W} \models \varphi$

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- Deciding ω -Regular Properties on Linear Recurrence Sequences
Almagor, Karimov, Kelmendi, O., Worrell, in *POPL* 2021
- What's Decidable about Linear Loops?
Karimov, Lefauchaux, O., Purser, Varonka, Whiteland, Worrell,
in *POPL* 2022
- The Power of Positivity
Karimov, Kelmendi, Nieuwveld, O., Worrell, in *LICS* 2023
- What's Decidable about Discrete Linear Dynamical Systems?
Karimov, Kelmendi, O., Worrell, in *Henzinger Festschrift* 2023

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- Several different classes of semialgebraic predicates

Model checking discrete linear dynamical systems

$\mathcal{W} =$  ...
generated by (M, s)

The Model-Checking Problem:

Given \mathcal{W} and a specification φ , decide if $\mathcal{W} \models \varphi$

We consider:

- Two different kinds of linear dynamical systems (M, s) :
 - arbitrary linear dynamical systems
 - *diagonalisable* linear dynamical systems
- Two different kinds of specification formalisms:
 - arbitrary MSO (fancy version of LTL)
 - *prefix-independent* MSO (denoted piMSO)
- Several different classes of semialgebraic predicates
- The use (or not) of *Skolem and/or Positivity oracles*

Quiz time! Prefix-independence

Which of the following specs are prefix-independent?

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Only (3) and (4)

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NO!

Classes of semialgebraic predicates

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Definition (\mathcal{S} : the semialgebraic sets)

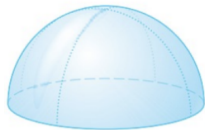
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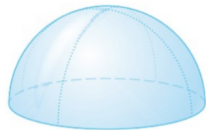
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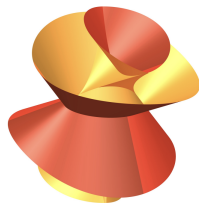
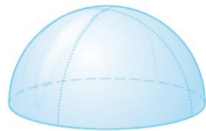
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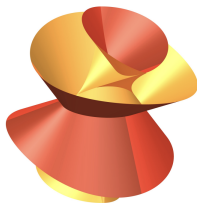
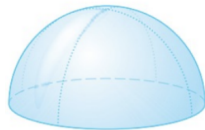
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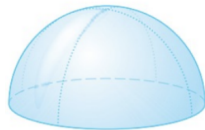


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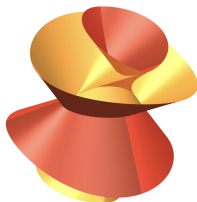
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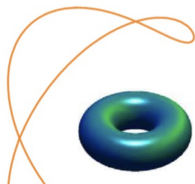
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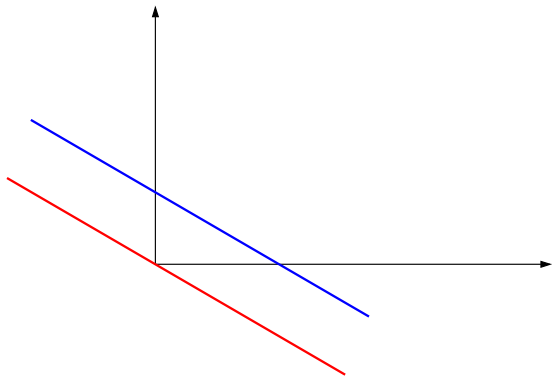


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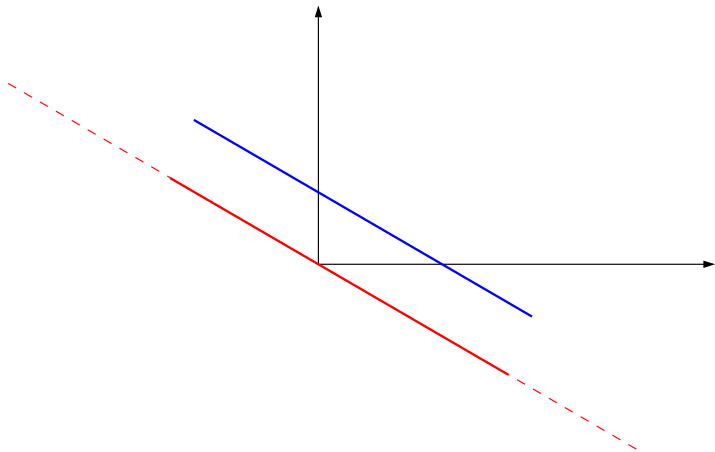
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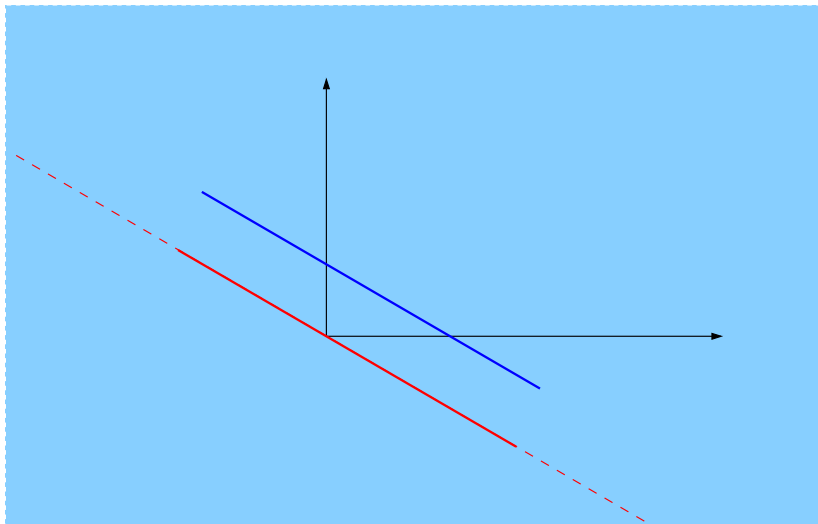
Examples in \mathbb{R}^2 : two line segments



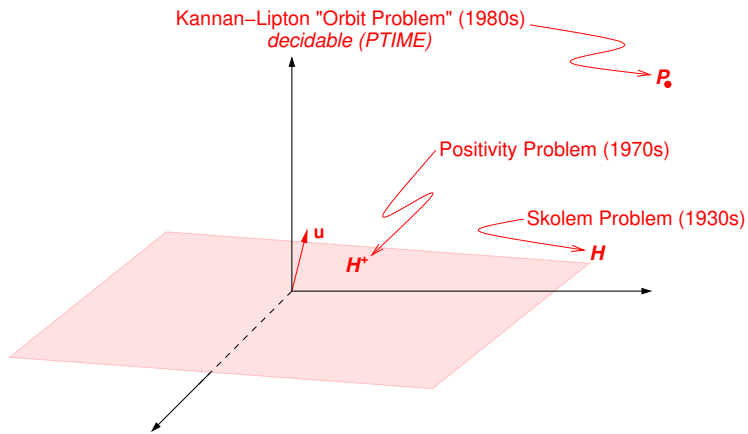
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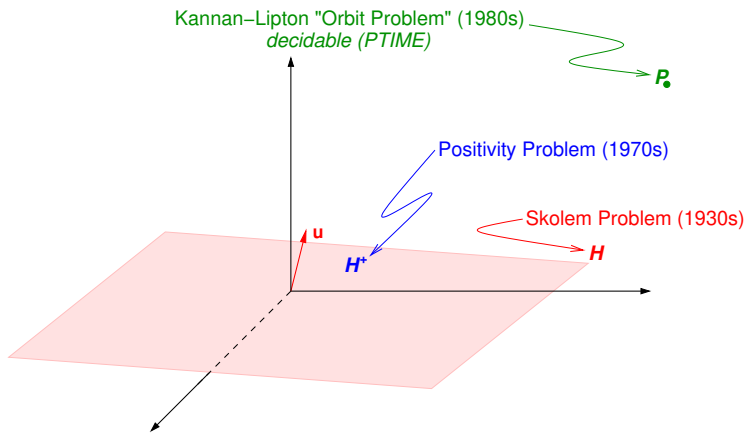
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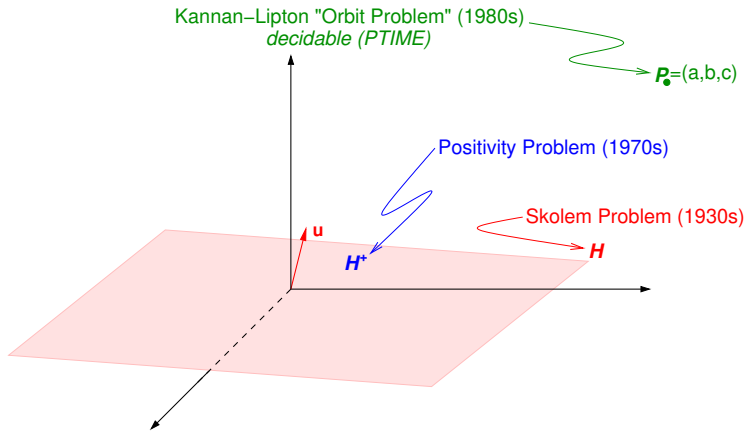
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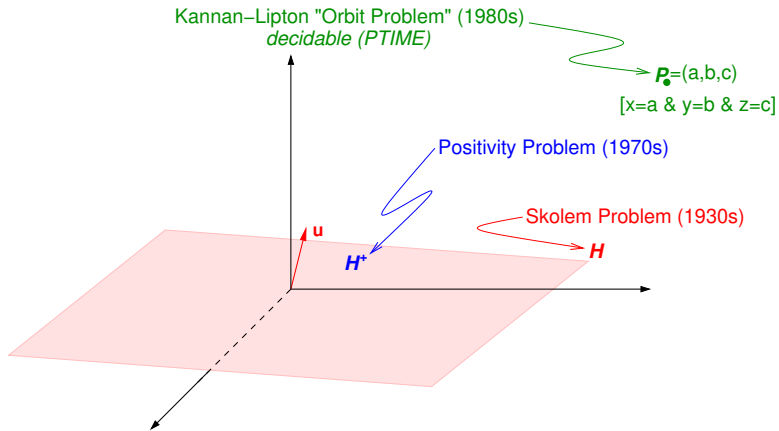
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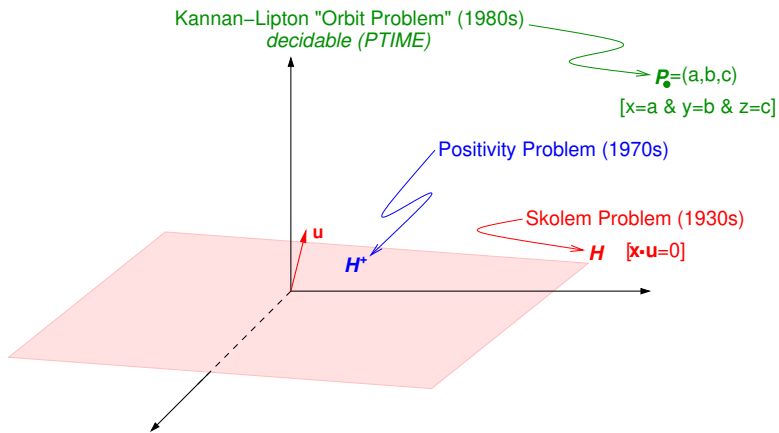
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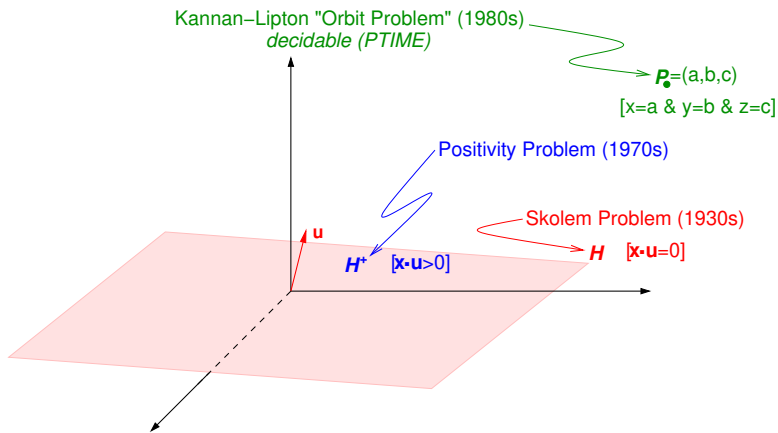
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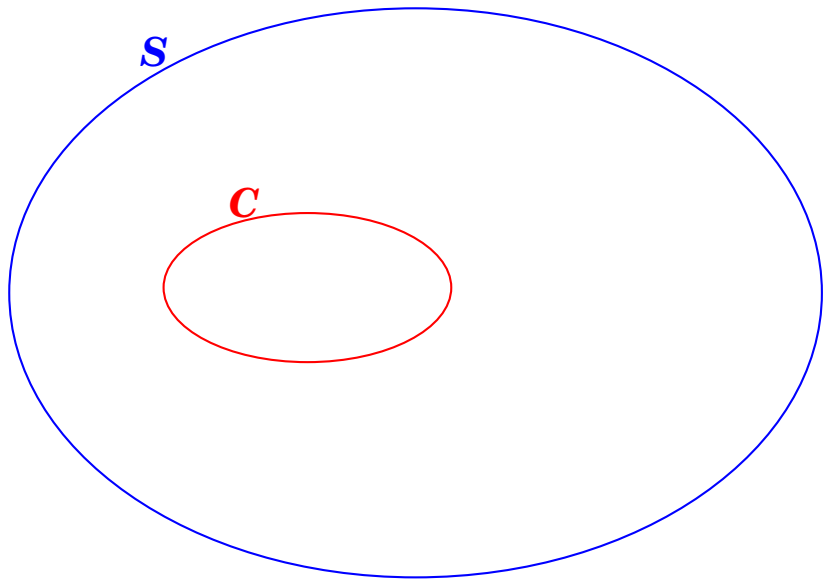


Classes of predicates: summary

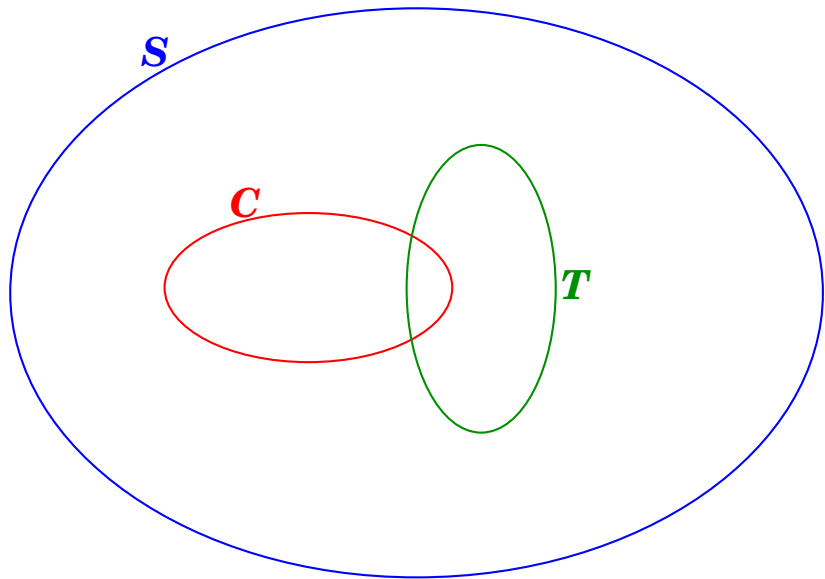


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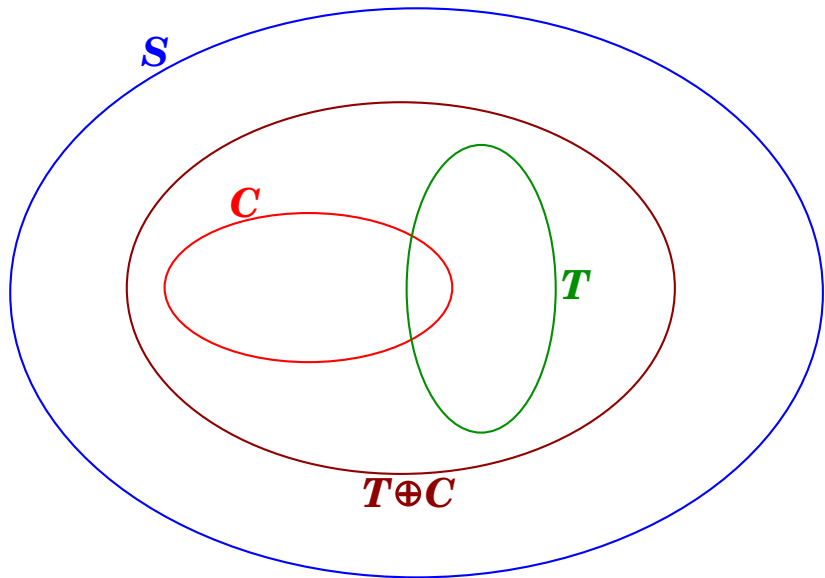
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Model checking discrete linear dynamical systems

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	arbitrary LDS	diagonalisable LDS
MSO		
π MSO		

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Moreover, our **unconditional decidability** algorithm
can produce *correctness certificates*!

Decidability of MSO and extensions

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This is open! But appears very difficult, e.g.

$$\forall x . \exists y > x . P(y) \wedge P(y + 2)$$

Theorem (Semënov, 1984)

If P is **effectively almost-periodic**, then $MSO(P)$ is decidable.



Decidability of MSO and extensions

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A word w is **(effectively) almost-periodic** if for every finite word u , we can bound the gaps between consecutive occurrences of u in w :

$\leq D$ $\leq D$

$abbb$ $aabababababba$ bbb $ababbababab$ bbb $abababb$ bbb $ababababbb$ \dots

$\leq D$ $\leq D$

The diagram illustrates the concept of an effectively almost-periodic word. It shows a sequence of words: $abbb$, $aabababababba$, bbb , $ababbababab$, bbb , $abababb$, bbb , $ababababbb$, and so on. Brackets above and below the sequence indicate that the gaps between consecutive occurrences of the word $u = bbb$ are bounded by a constant D . Specifically, the first two brackets above the sequence are labeled $\leq D$, and the last two brackets below the sequence are also labeled $\leq D$.

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What about $MSO(P_1, P_2, \dots, P_k)$?

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Much (ongoing) work on this central question! By e.g., Elgot, Rabin, Carton, Thomas, Rabinovich, Fijalkow, Paperman, ...

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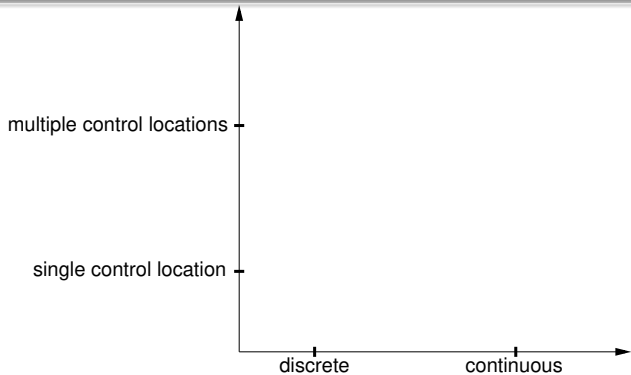
Corollary

Let (M, s) be a linear dynamical system in ambient space \mathbb{R}^d , and let $S_1, \dots, S_k \subseteq \mathbb{R}^d$ be tame semialgebraic predicates.

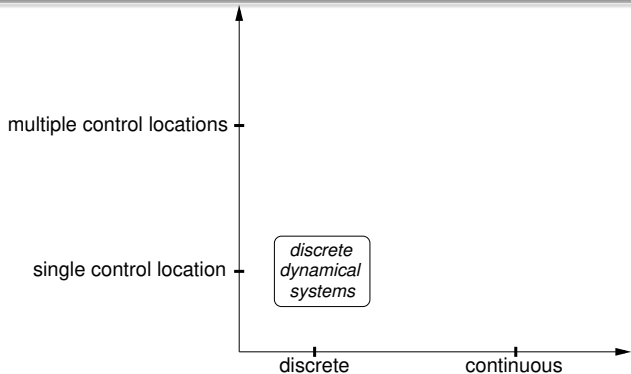
Let $P_1, \dots, P_k \subseteq \mathbb{N}$ be the set of visiting times of the orbit of (M, s) in S_1, \dots, S_k respectively.

Then $\text{MSO}(P_1, \dots, P_k)$ is decidable.

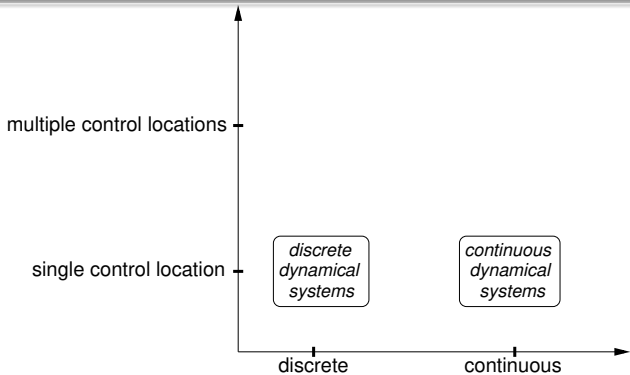
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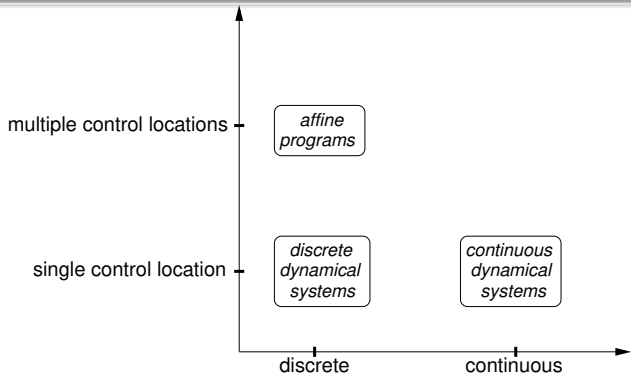
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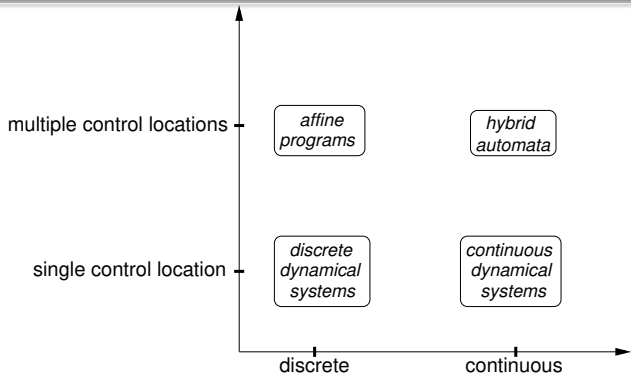
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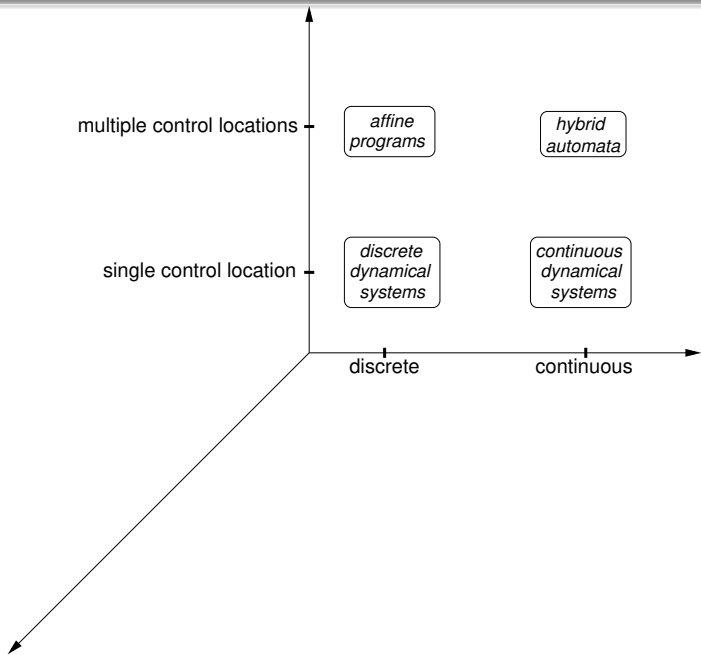
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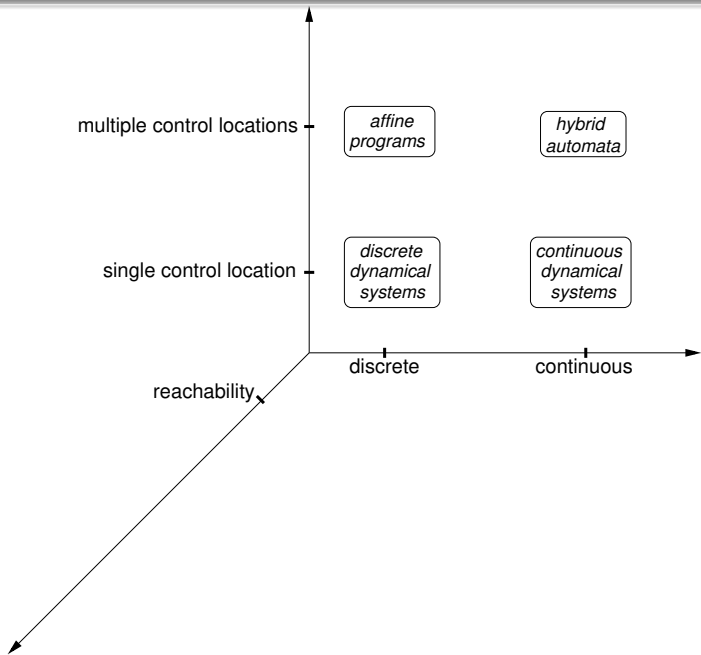
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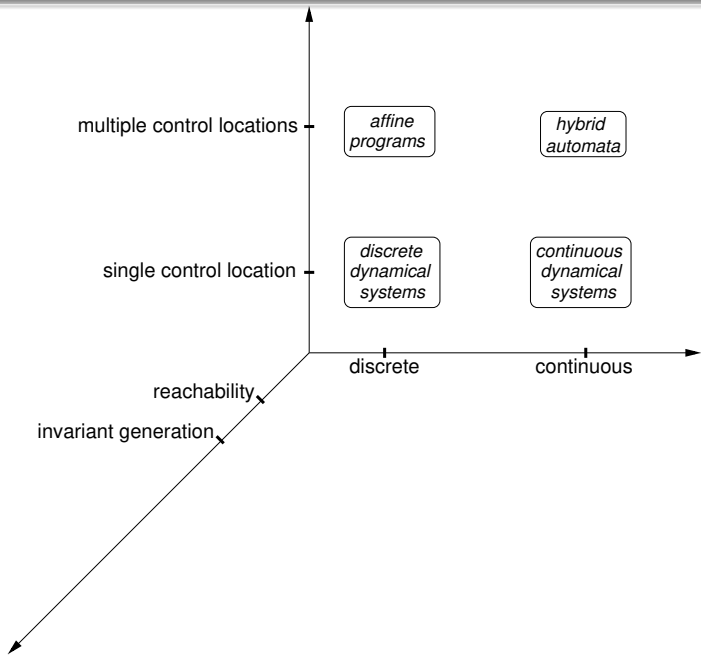
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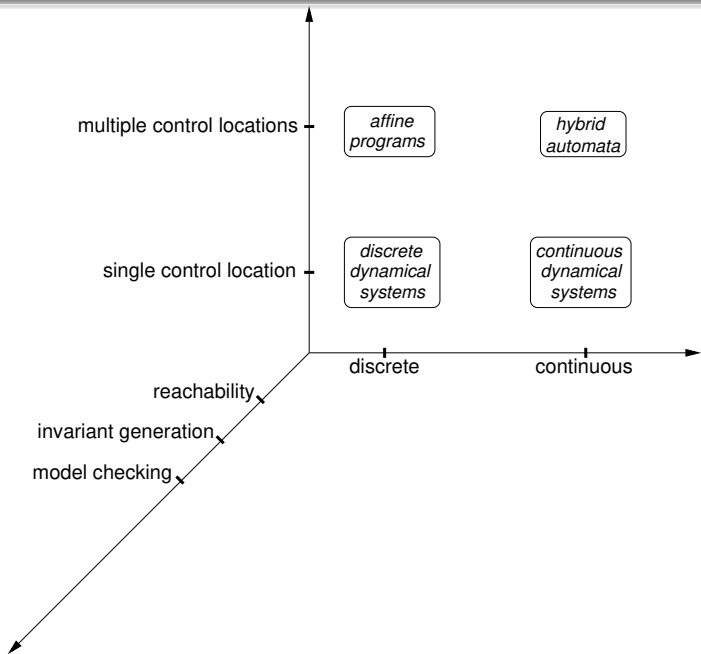
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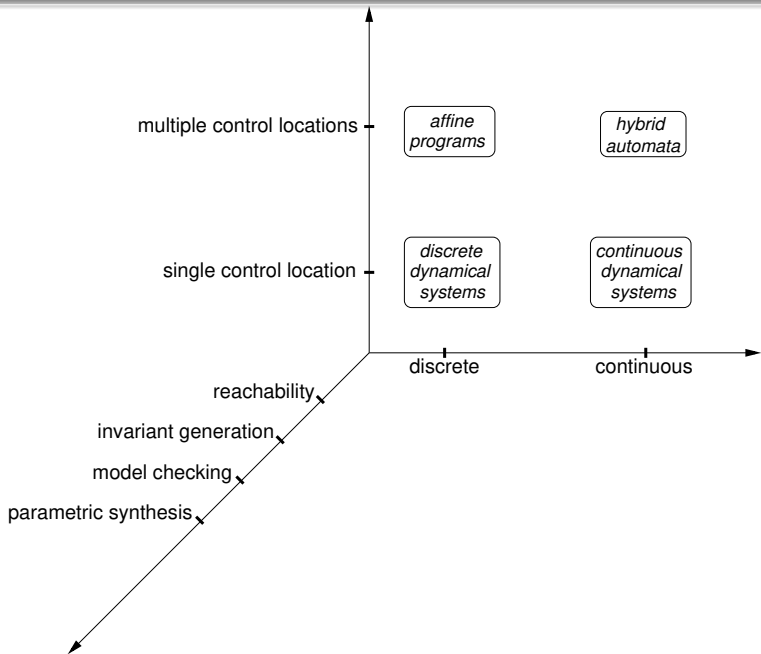
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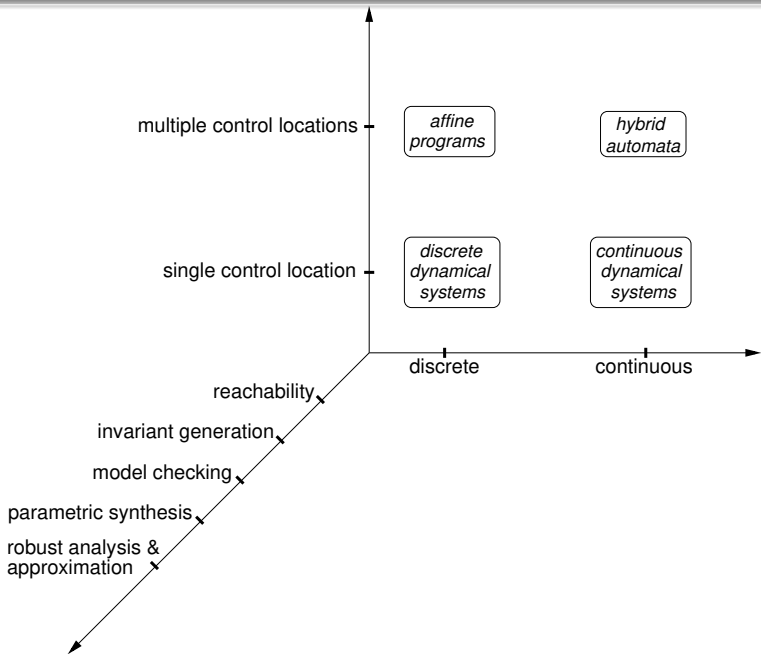
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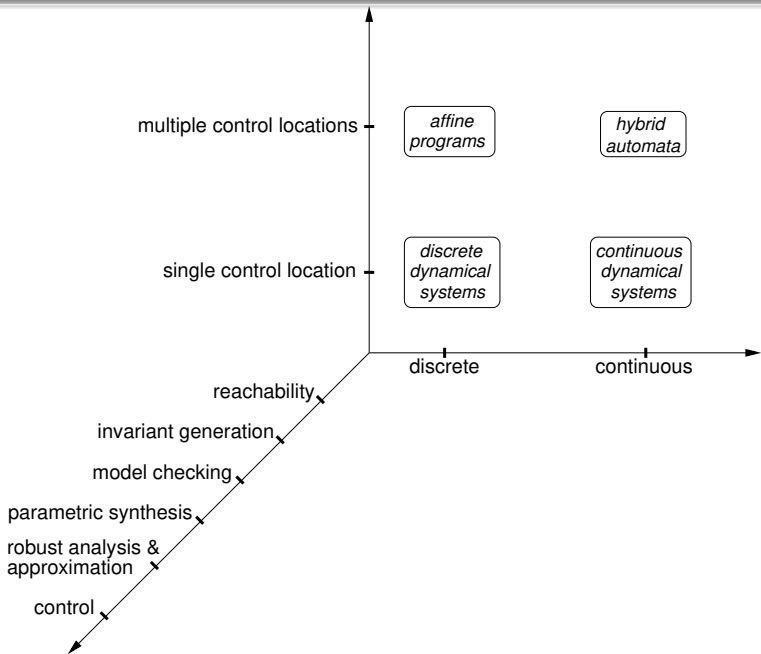
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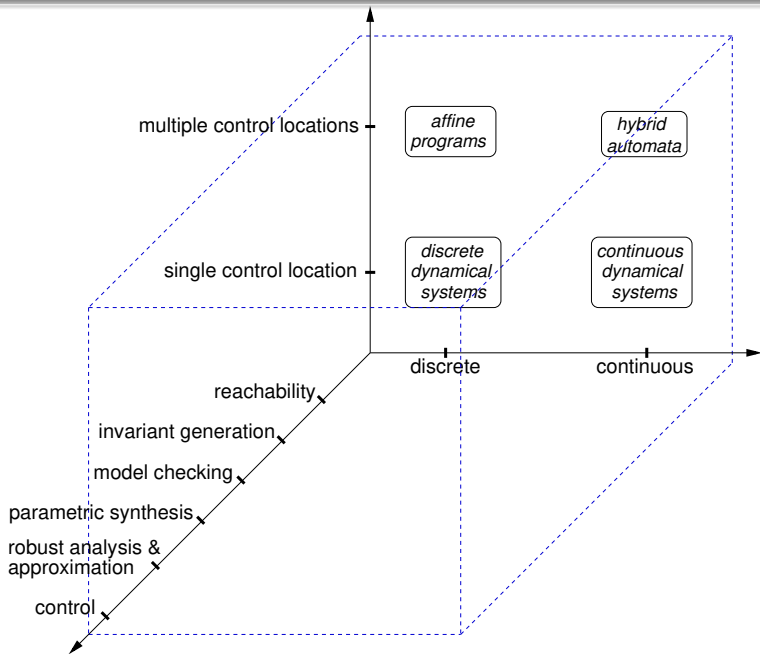
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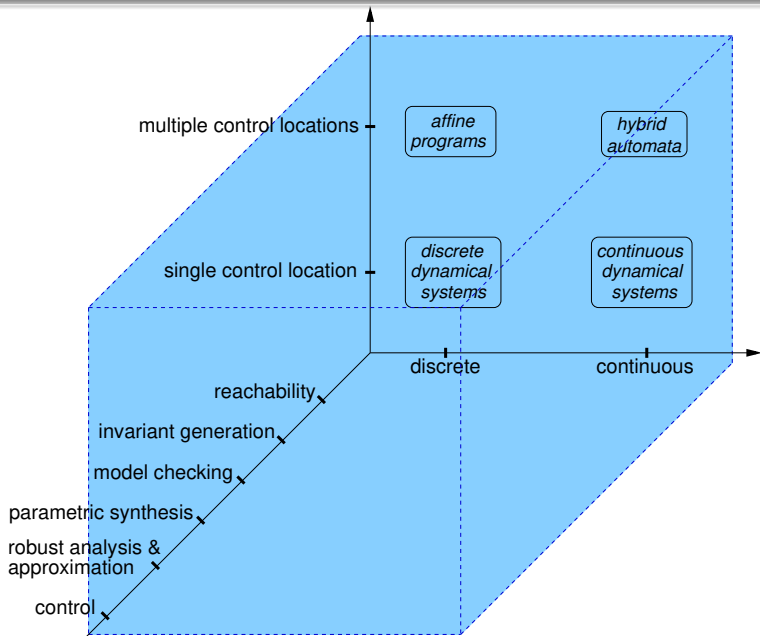
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