

On the optimal reachability problem in weighted timed games

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Based on former works with Thomas Brihaye, Kim G. Larsen, Nicolas Markey, etc...
And on recent work with Samy Jaziri and Nicolas Markey



Outline

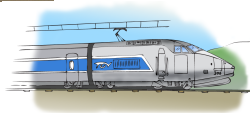
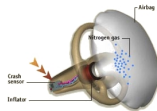
- 1 Introduction
- 2 Overview of "old" results
 - Weighted timed automata
 - Timed games
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- 3 Some recent developments
 - Undecidability of the value problem
 - Approximation of the optimal cost
 - Back to the undecidability
- 4 Conclusion

Time-dependent systems

- We are interested in **timed systems**

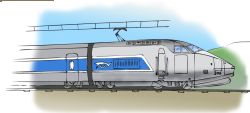
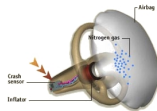
Time-dependent systems

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Time-dependent systems

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- ... and in their **analysis** and **control**

An example: The task graph scheduling problem

Compute $D \times (C \times (A + B)) + (A + B) + (C \times D)$ using two processors:

P_1 (fast):



time	
+	2 picoseconds
×	3 picoseconds

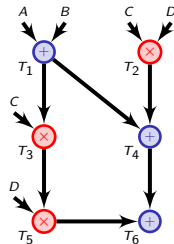
energy	
idle	10 Watt
in use	90 Watts

P_2 (slow):



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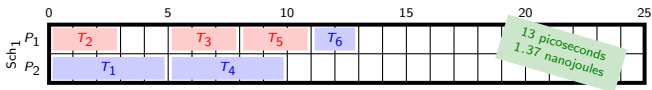
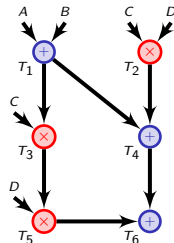
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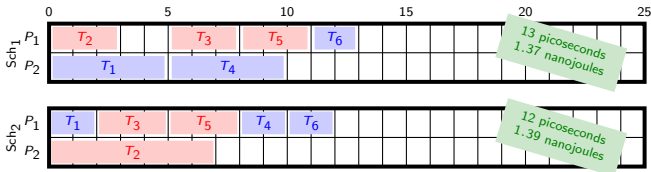
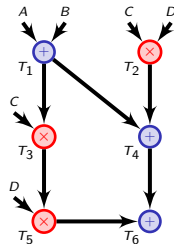
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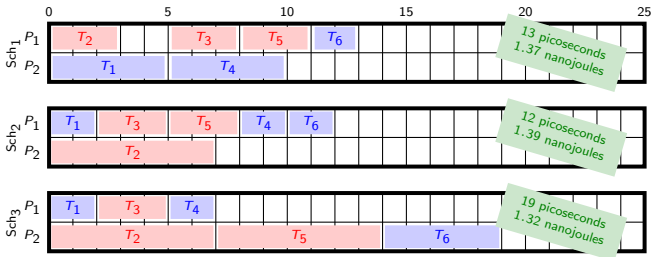
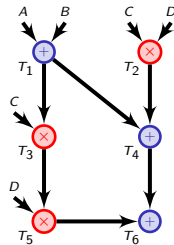
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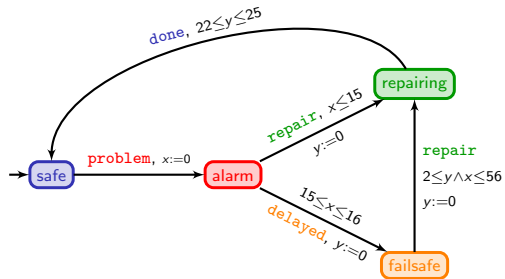


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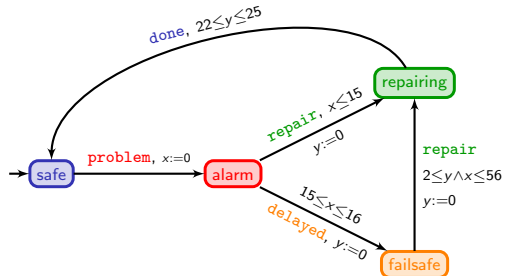
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The model of timed automata



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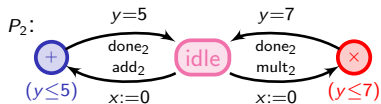
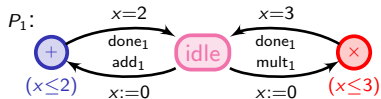


	safe	$\xrightarrow{23}$	safe	$\xrightarrow{\text{problem}}$	alarm	$\xrightarrow{15.6}$	alarm	$\xrightarrow{\text{delayed}}$	failsafe	
x	0		23		0		15.6		15.6	...
y	0		23		23		38.6		0	
	failsafe	$\xrightarrow{2.3}$	failsafe	$\xrightarrow{\text{repair}}$	repairing	$\xrightarrow{22.1}$	repairing	$\xrightarrow{\text{done}}$	safe	
...	15.6		17.9		17.9		40		40	
	0		2.3		0		22.1		22.1	

Modelling the task graph scheduling problem

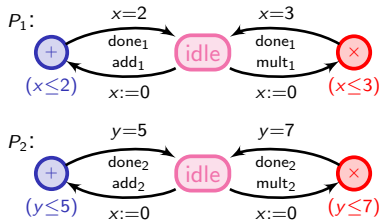
Modelling the task graph scheduling problem

- Processors

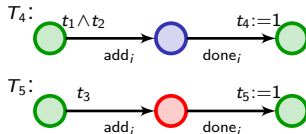


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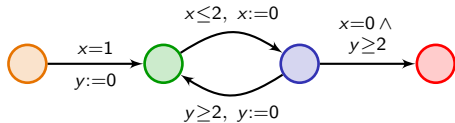


- Tasks

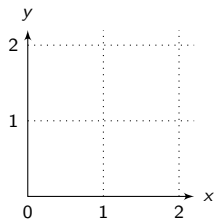
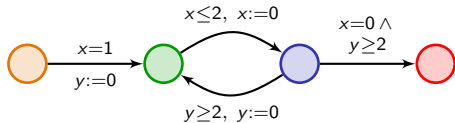


A schedule is a path in the product automaton

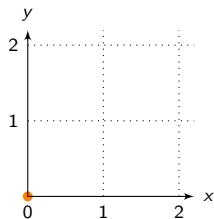
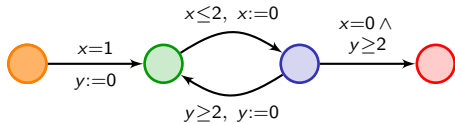
Analyzing timed automata



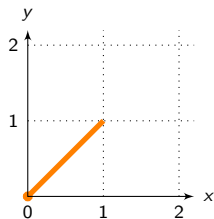
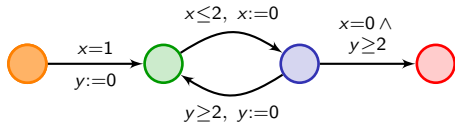
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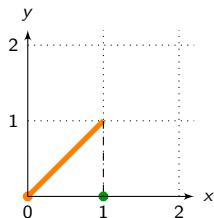
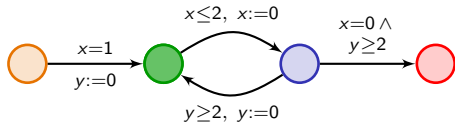
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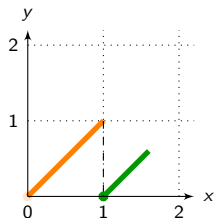
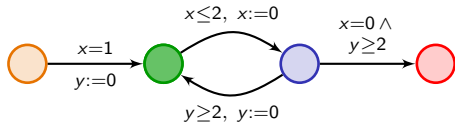
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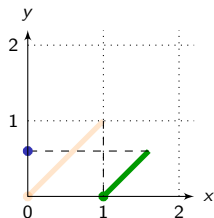
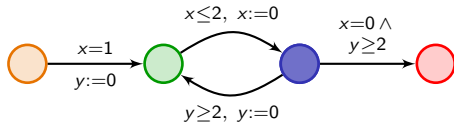
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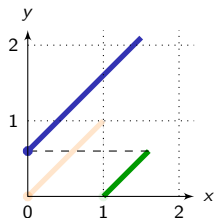
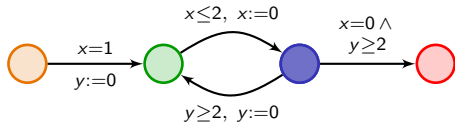
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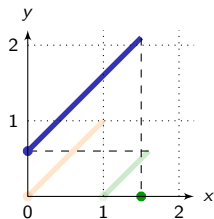
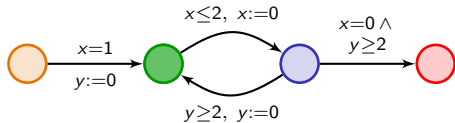
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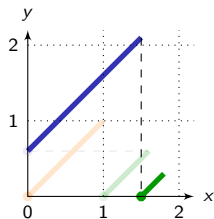
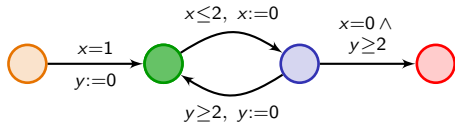
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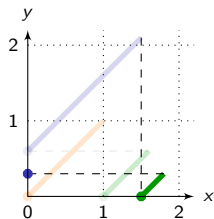
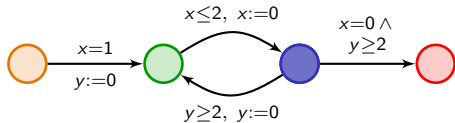
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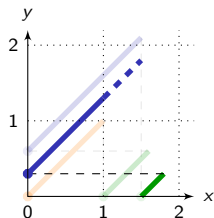
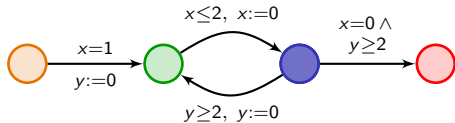
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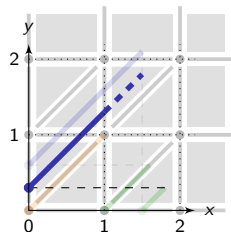
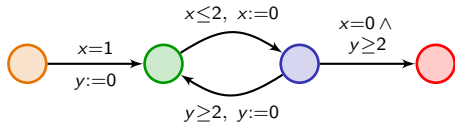
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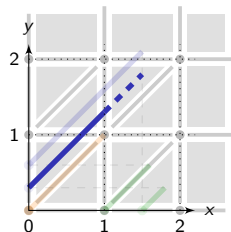
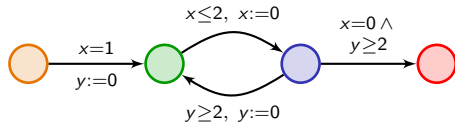
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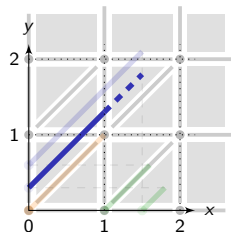
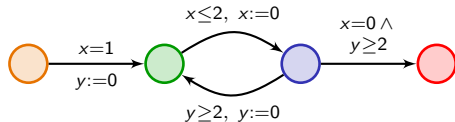


Theorem [AD94]

Reachability in timed automata is decidable (as well as many other important properties). It is PSPACE-complete.

- Technical tool: region abstraction

Analyzing timed automata



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- Technical tool: region abstraction
- Efficient symbolic technics based on zones, implemented in tools

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- 2 **Overview of "old" results**
 - Weighted timed automata
 - Timed games
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- A possible solution: use **hybrid automata**
 - a discrete control (the mode of the system)
 - + continuous evolution of the variables within a mode

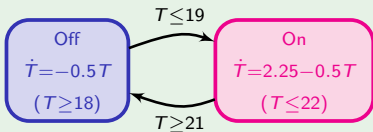
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The thermostat example



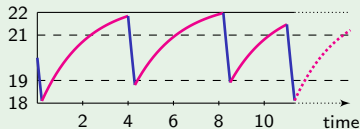
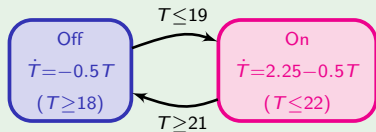
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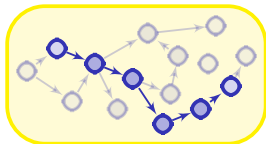
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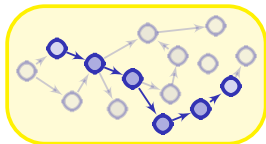
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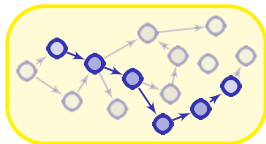


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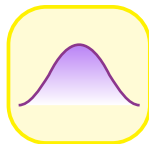


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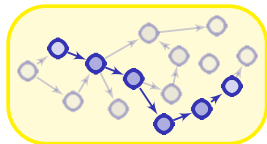
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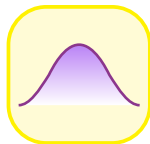
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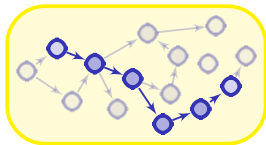


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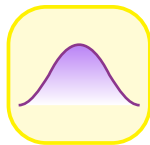


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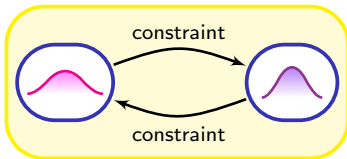
Ok... but?



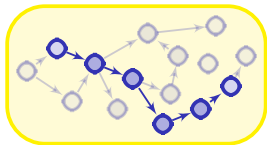
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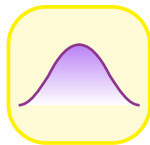
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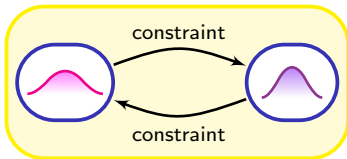
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Easy...



Hard!

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Theorem [HKPV95]

The reachability problem is **undecidable** in hybrid automata. Even for the simplest, the so-called stopwatch automata (clocks can be stopped).

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- An alternative: **weighted/priced timed automata** [ALP01,BFH+01]
 - \leadsto hybrid variables do not constrain the system
 - hybrid variables are **observer** variables

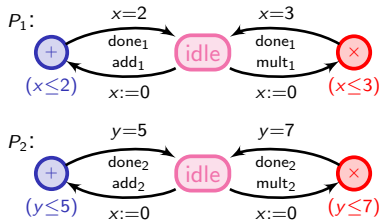
[HKPV95] Henzinger, Kopke, Puri, Varaiya. What's decidable about hybrid automata? (*SToC'95*).

[ALP01] Alur, La Torre, Pappas. Optimal paths in weighted timed automata (*HSCC'01*).

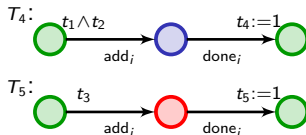
[BFH+01] Behrmann, Fehnker, Hune, Larsen, Pettersson, Romijn, Vaandrager. Minimum-cost reachability in priced timed automata (*HSCC'01*).

Modelling the task graph scheduling problem

- Processors

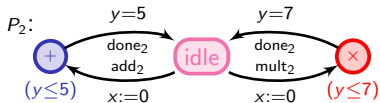
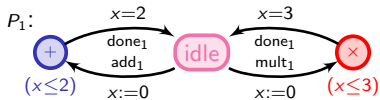


- Tasks

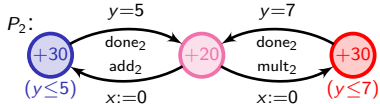
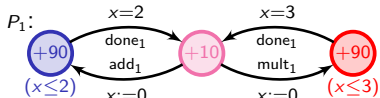


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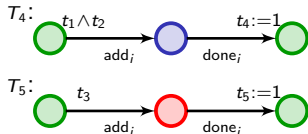
- Processors



- Modelling energy

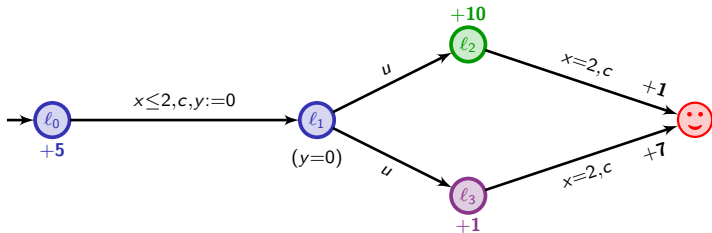


- Tasks



A good schedule is a path in the product automaton with a low cost

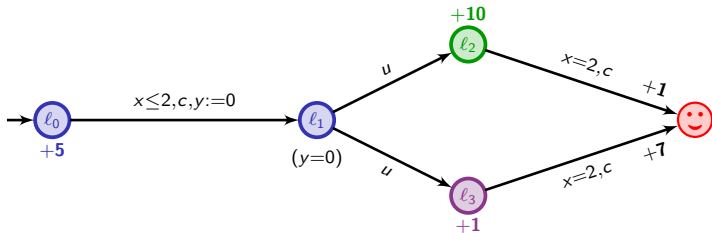
Weighted/priced timed automata [ALP01,BFH+01]



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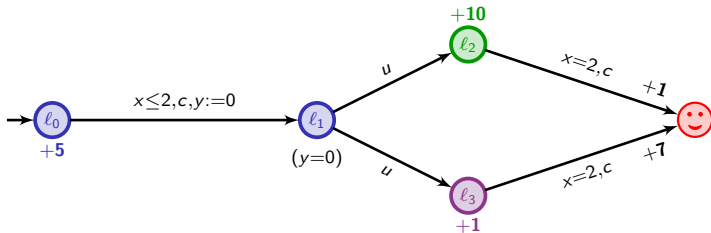


	l_0	$\xrightarrow{1.3}$	l_0	\xrightarrow{c}	l_1	\xrightarrow{u}	l_3	$\xrightarrow{0.7}$	l_3	\xrightarrow{c}	😊
x	0		1.3		1.3		1.3		2		
y	0		1.3		0		0		0.7		

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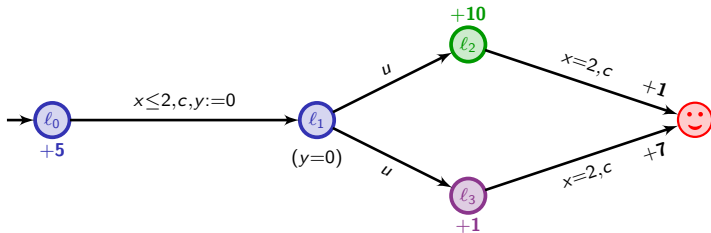
	l_0	$\xrightarrow{1.3}$	l_0	\xrightarrow{c}	l_1	\xrightarrow{u}	l_3	$\xrightarrow{0.7}$	l_3	\xrightarrow{c}	😊
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cost :

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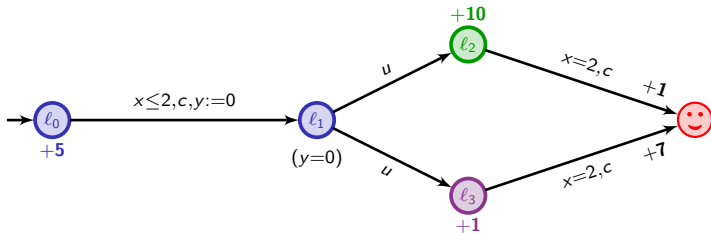
	l_0	$\xrightarrow{1.3}$	l_0	\xrightarrow{c}	l_1	\xrightarrow{u}	l_3	$\xrightarrow{0.7}$	l_3	\xrightarrow{c}	😊
x	0		1.3		1.3		1.3		2		
y	0		1.3		0		0		0.7		

cost : 6.5

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Weighted/priced timed automata [ALP01,BFH+01]

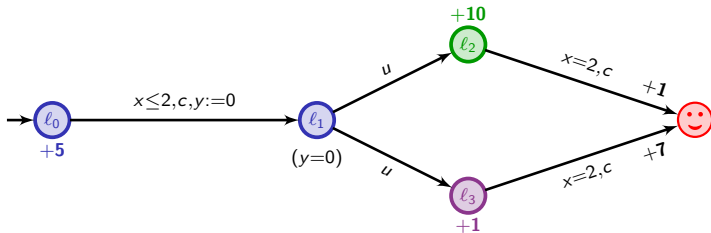


	l_0	$\xrightarrow{1.3}$	l_0	\xrightarrow{c}	l_1	\xrightarrow{u}	l_3	$\xrightarrow{0.7}$	l_3	\xrightarrow{c}	😊
x	0		1.3		1.3		1.3		2		
y	0		1.3		0		0		0.7		
cost :			6.5	+	0						

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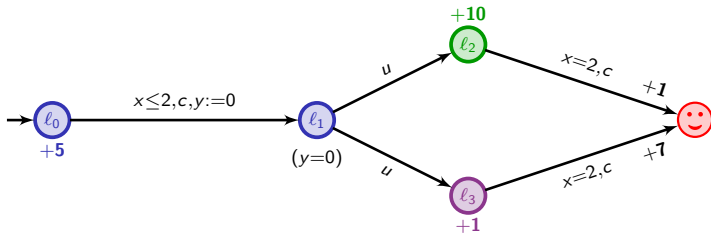


	l_0	$\xrightarrow{1.3}$	l_0	\xrightarrow{c}	l_1	\xrightarrow{u}	l_3	$\xrightarrow{0.7}$	l_3	\xrightarrow{c}	😊
x	0		1.3		1.3		1.3		2		
y	0		1.3		0		0		0.7		
cost :		6.5	+	0	+	0					

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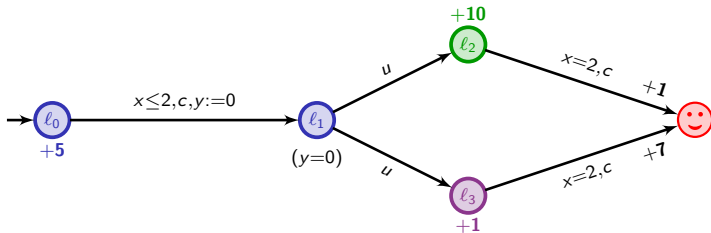


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x	0		1.3		1.3		1.3		2		
y	0		1.3		0		0		0.7		
cost :		6.5	+	0	+	0	+	0.7			

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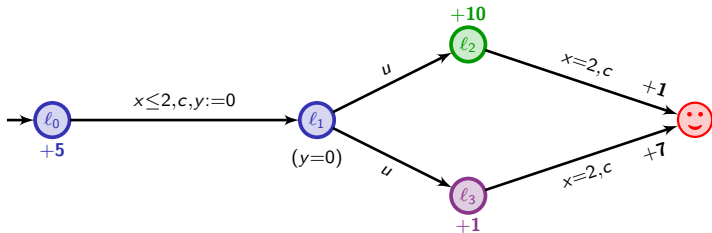


	l_0	$\xrightarrow{1.3}$	l_0	\xrightarrow{c}	l_1	\xrightarrow{u}	l_3	$\xrightarrow{0.7}$	l_3	\xrightarrow{c}	😊
x	0		1.3		1.3		1.3		2		
y	0		1.3		0		0		0.7		
cost :		6.5	+	0	+	0	+	0.7	+	7	

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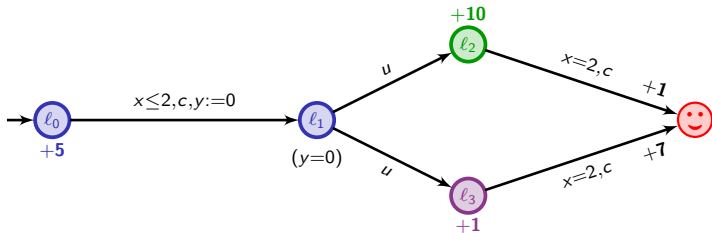


	l_0	$\xrightarrow{1.3}$	l_0	\xrightarrow{c}	l_1	\xrightarrow{u}	l_3	$\xrightarrow{0.7}$	l_3	\xrightarrow{c}	😊
x	0		1.3		1.3		1.3		2		
y	0		1.3		0		0		0.7		
cost :		6.5	+	0	+	0	+	0.7	+	7	= 14.2

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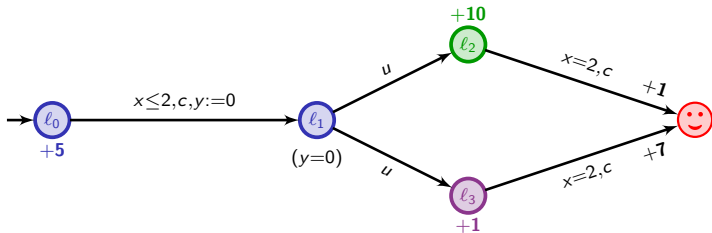


Question: what is the optimal cost for reaching 😊?

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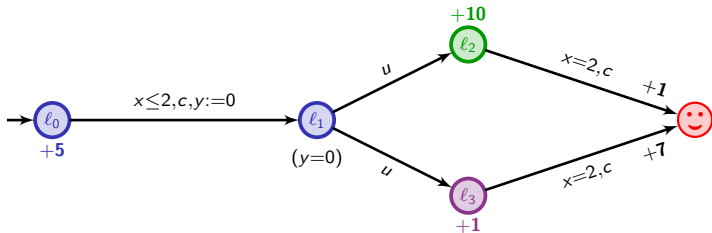
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$$5t + 10(2 - t) + 1$$

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Weighted/priced timed automata [ALP01,BFH+01]



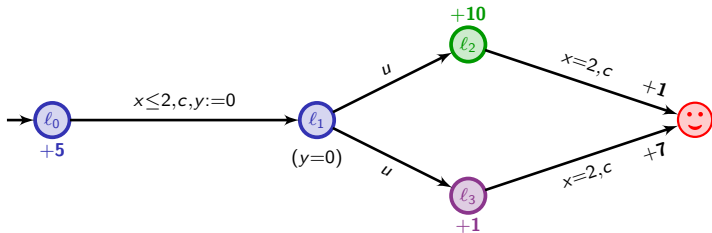
Question: what is the optimal cost for reaching 😊?

$$5t + 10(2 - t) + 1, \quad 5t + (2 - t) + 7$$

[ALP01] Alur, La Torre, Pappas. Optimal paths in weighted timed automata (HSCC'01).

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Weighted/priced timed automata [ALP01,BFH+01]



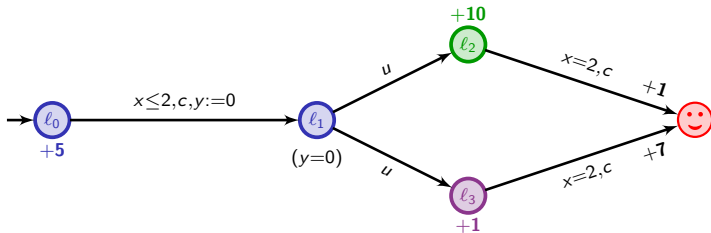
Question: what is the optimal cost for reaching 😊?

$$\min (5t + 10(2 - t) + 1 , 5t + (2 - t) + 7)$$

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Weighted/priced timed automata [ALP01,BFH+01]



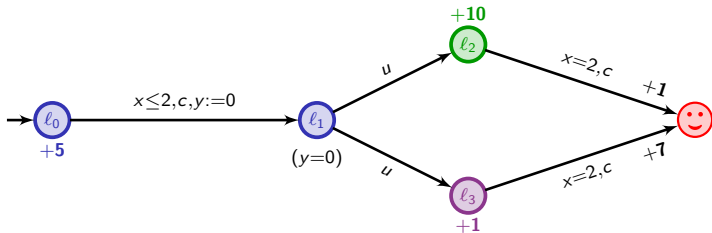
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$$\inf_{0 \leq t \leq 2} \min (5t + 10(2 - t) + 1 , 5t + (2 - t) + 7) = 9$$

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Weighted/priced timed automata [ALP01,BFH+01]



Question: what is the optimal cost for reaching 😊?

$$\inf_{0 \leq t \leq 2} \min (5t + 10(2 - t) + 1 , 5t + (2 - t) + 7) = 9$$

~> *strategy:* leave immediately l_0 , go to l_3 , and wait there 2 t.u.

[ALP01] Alur, La Torre, Pappas. Optimal paths in weighted timed automata (HSCC'01).

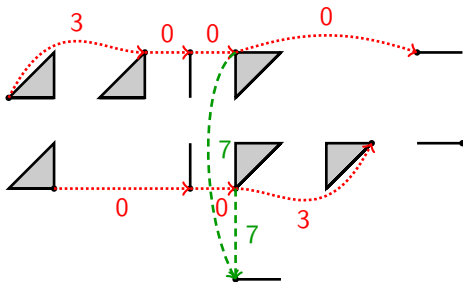
[BFH+01] Behrmann, Fehnker, Hune, Larsen, Pettersson, Romijn, Vaandrager. Minimum-cost reachability in priced timed automata (HSCC'01).

Optimal-cost reachability

Theorem [ALP01,BFH+01,BBBR07]

In weighted timed automata, the optimal cost is an integer and can be computed in PSPACE.

- Technical tool: a refinement of the regions, the corner-point abstraction



[ALP01] Alur, La Torre, Pappas. Optimal paths in weighted timed automata (*HSCC'01*).

[BFH+01] Behrmann, Fehnker, Hune, Larsen, Pettersson, Romijn, Vaandrager. Minimum-cost reachability in priced timed automata (*HSCC'01*).

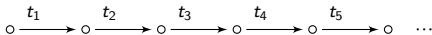
[BBBR07] Bouyer, Brihaye, Bruyère, Raskin. On the optimal reachability problem (*Formal Methods in System Design*).

From timed to discrete behaviours

Optimal reachability as a linear programming problem

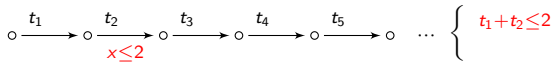
From timed to discrete behaviours

Optimal reachability as a linear programming problem



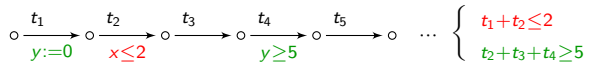
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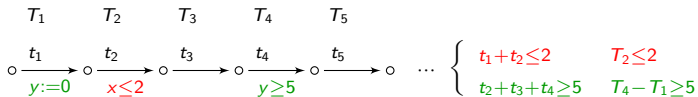
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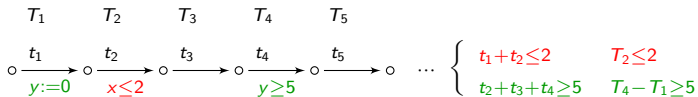
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From timed to discrete behaviours

Optimal reachability as a linear programming problem



Lemma

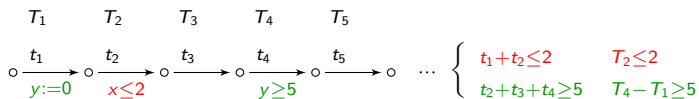
Let Z be a bounded zone and f be a function

$$f : (T_1, \dots, T_n) \mapsto \sum_{i=1}^n c_i T_i + c$$

well-defined on \bar{Z} . Then $\text{inf}_Z f$ is obtained on the border of \bar{Z} with integer coordinates.

From timed to discrete behaviours

Optimal reachability as a linear programming problem



Lemma

Let Z be a bounded zone and f be a function

$$f : (T_1, \dots, T_n) \mapsto \sum_{i=1}^n c_i T_i + c$$

well-defined on \bar{Z} . Then $\text{inf}_Z f$ is obtained on the border of \bar{Z} with integer coordinates.

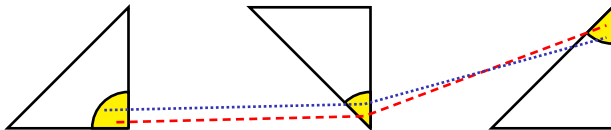
\rightsquigarrow for every finite path π in \mathcal{A} , there exists a path Π in \mathcal{A}_{cp} such that

$$\text{cost}(\Pi) \leq \text{cost}(\pi)$$

[Π is a "corner-point projection" of π]

From discrete to timed behaviours

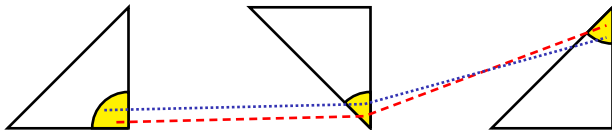
Approximation of abstract paths:



For any path Π of \mathcal{A}_{cp} ,

From discrete to timed behaviours

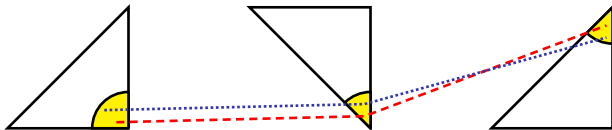
Approximation of abstract paths:



For any path Π of \mathcal{A}_{cp} , for any $\varepsilon > 0$,

From discrete to timed behaviours

Approximation of abstract paths:

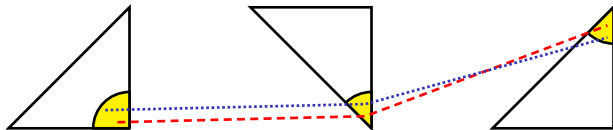


For any path Π of \mathcal{A}_{cp} , for any $\varepsilon > 0$, there exists a path π_ε of \mathcal{A} s.t.

$$\|\Pi - \pi_\varepsilon\|_\infty < \varepsilon$$

From discrete to timed behaviours

Approximation of abstract paths:



For any path Π of \mathcal{A}_{cp} , for any $\varepsilon > 0$, there exists a path π_ε of \mathcal{A} s.t.

$$\|\Pi - \pi_\varepsilon\|_\infty < \varepsilon$$

For every $\eta > 0$, there exists $\varepsilon > 0$ s.t.

$$\|\Pi - \pi_\varepsilon\|_\infty < \varepsilon \Rightarrow |\text{cost}(\Pi) - \text{cost}(\pi_\varepsilon)| < \eta$$

Note on the corner-point abstraction

It is a very interesting abstraction, that can be used in several other contexts:

- for mean-cost optimization [BBL04,BBL08]
- for discounted-cost optimization [FL08]
- for all concavely-priced timed automata [JT08]
- for deciding frequency objectives [BBBS11,Sta12]
- ...

[BBL04] Bouyer, Brinksma, Larsen. Staying Alive As Cheaply As Possible (*HSCC'04*).

[BBL08] Bouyer, Brinksma, Larsen. Optimal infinite scheduling for multi-priced timed automata (*Formal Methods in System Designs*).

[FL08] Fahrenberg, Larsen. Discount-optimal infinite runs in priced timed automata (*INFINITY'08*).

[JT08] Judziński, Trivedi. Concavely-priced timed automata (*FORMATS'08*).

[BBBS11] Bertrand, Bouyer, Brihaye, Stainer. Emptiness and universality problems in timed automata with positive frequency (*ICALP'11*).

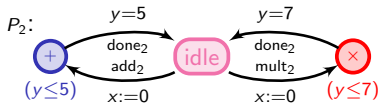
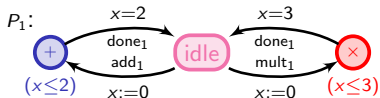
[Sta12] Stainer. Frequencies in forgetful timed automata (*FORMATS'12*).

Outline

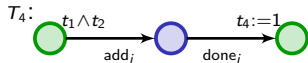
- 1 Introduction
- 2 Overview of "old" results
 - Weighted timed automata
 - **Timed games**
 - Weighted timed games
- 3 Some recent developments
 - Undecidability of the value problem
 - Approximation of the optimal cost
 - Back to the undecidability
- 4 Conclusion

Modelling the task graph scheduling problem

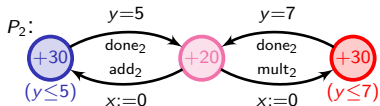
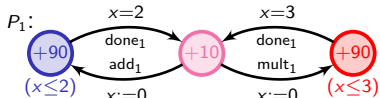
- Processors



- Tasks

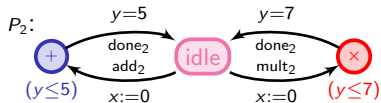
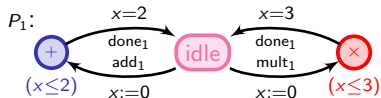


- Modelling energy

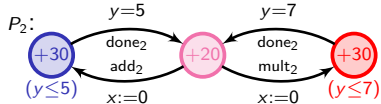
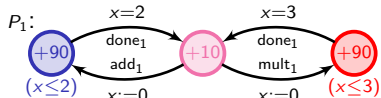


Modelling the task graph scheduling problem

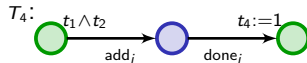
Processors



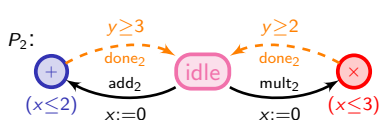
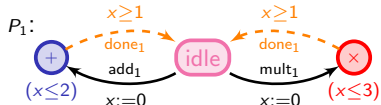
Modelling energy



Tasks

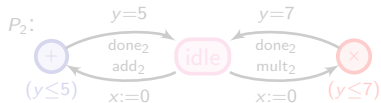
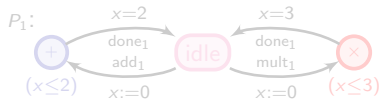


Modelling uncertainty

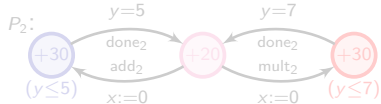
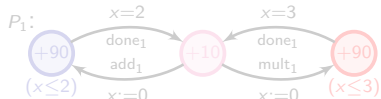


Modelling the task graph scheduling problem

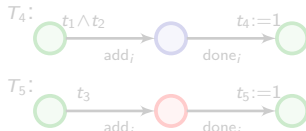
- Processors



- Modelling energy

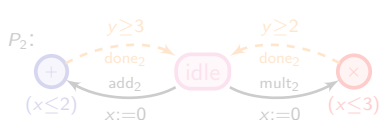
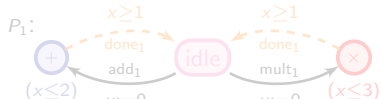


- Tasks



A (good) schedule is a strategy in the product game (with a low cost)

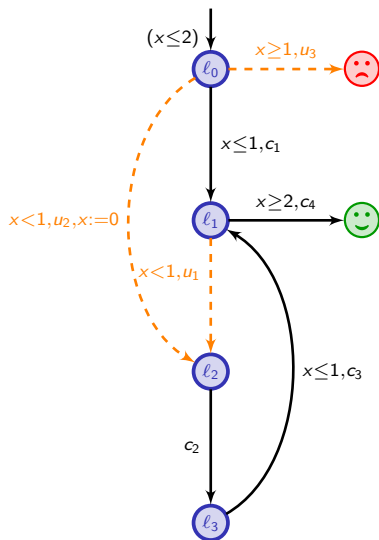
- Modelling uncertainty



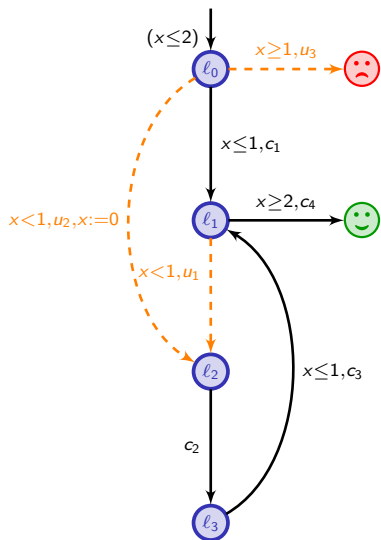
An example of a timed game

Rule of the game

- Aim: avoid 😞 and reach 😊



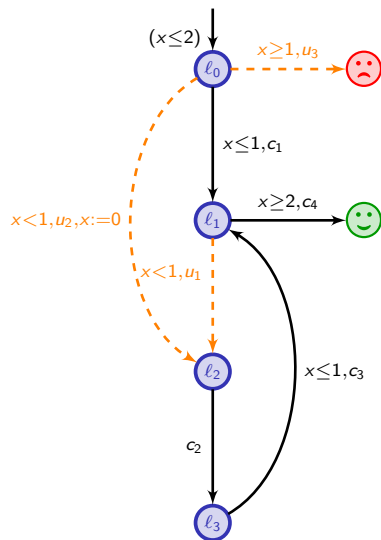
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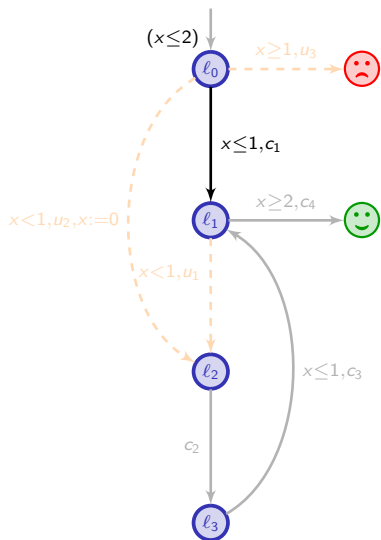


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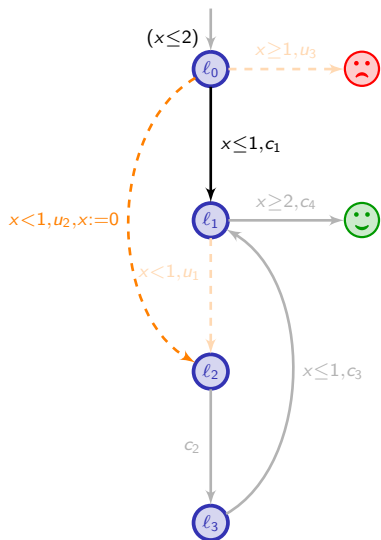
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- from $(l_0, 0)$, play $(0.5, c_1)$

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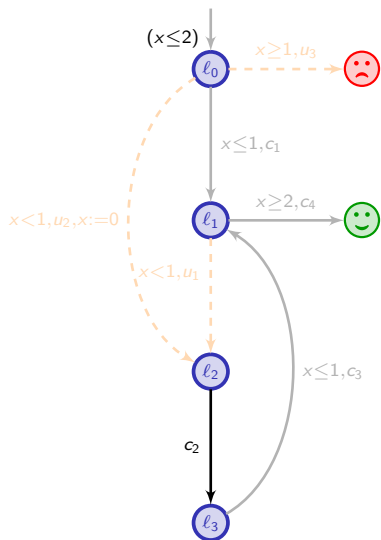
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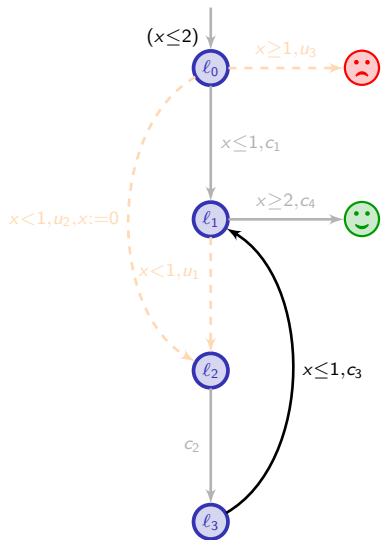
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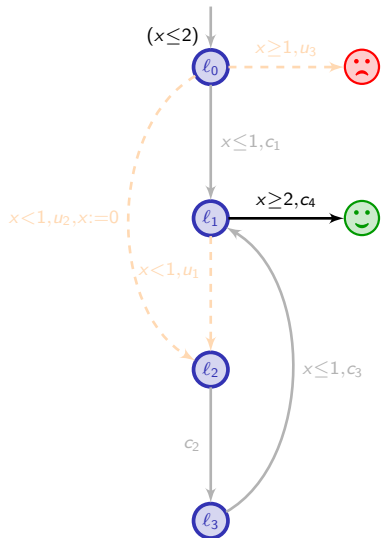
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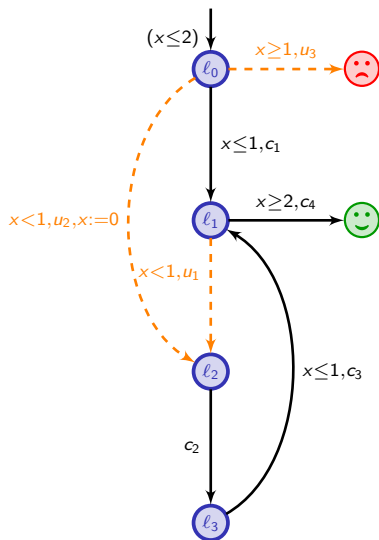
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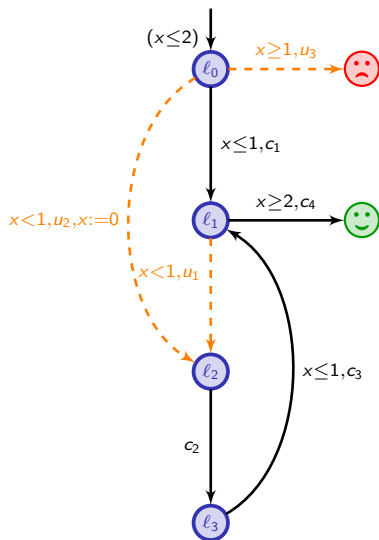
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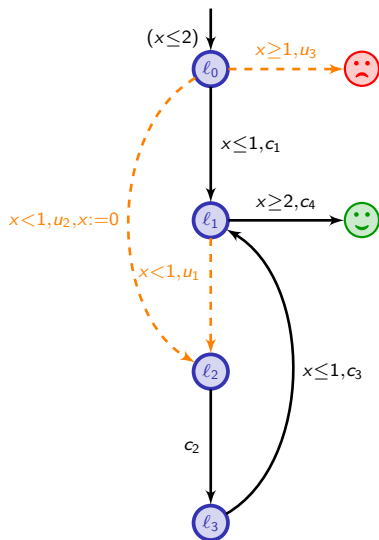
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Problems to be considered

- Does there exist a winning strategy?
- If yes, compute one (as simple as possible).

Decidability of timed games

Theorem [AMPS98, HK99]

Reachability and safety timed games are decidable and EXPTIME-complete. Furthermore memoryless and "region-based" strategies are sufficient.

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[AM99] Asarin, Maler. As soon as possible: time optimal control for timed automata (*HSCC'99*).

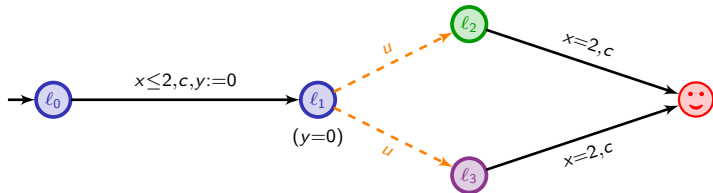
[BHPR07] Brihaye, Henzinger, Prabhu, Raskin. Minimum-time reachability in timed games (*ICALP'07*).

[JT07] Jurdziński, Trivedi. Reachability-time games on timed automata (*ICALP'07*).

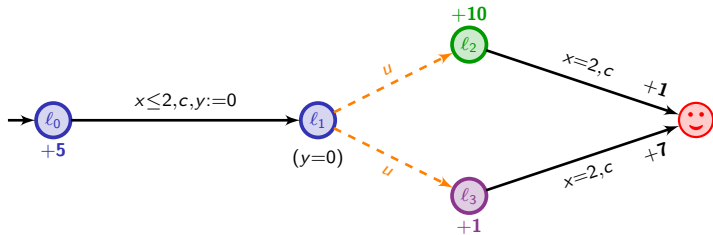
Outline

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- 2 Overview of "old" results
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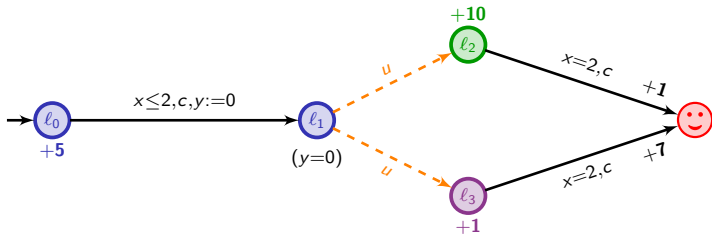
A simple timed game



A simple weighted timed game

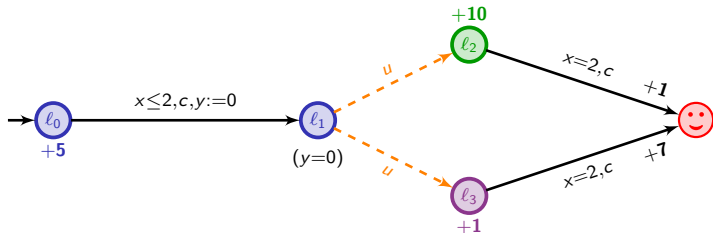


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Question: what is the optimal cost we can ensure while reaching 😊?

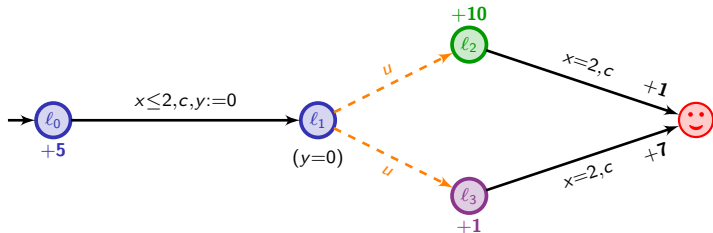
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$$5t + 10(2 - t) + 1$$

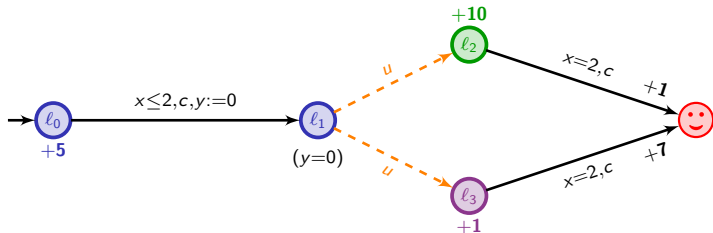
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$$5t + 10(2 - t) + 1, \quad 5t + (2 - t) + 7$$

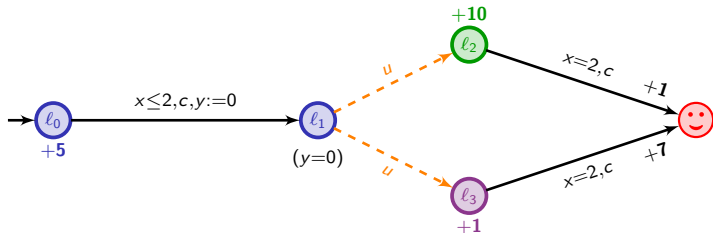
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$$\max (5t + 10(2 - t) + 1 , 5t + (2 - t) + 7)$$

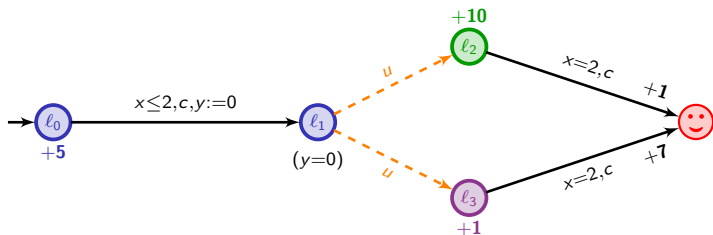
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\rightsquigarrow *strategy:* wait in l_0 , and when $t = \frac{4}{3}$, go to l_1

Optimal reachability in weighted timed games (1)

This topic has been fairly hot these last fifteen years...

[LMM02,ABM04,BCFL04,BBR05,BBM06,BLMR06,Rut11,HIM13,BGK+14]

[LMM02] La Torre, Mukhopadhyay, Murano. Optimal-reachability and control for acyclic weighted timed automata (*TCS@02*).

[ABM04] Alur, Bernardsky, Madhusudan. Optimal reachability in weighted timed games (*ICALP'04*).

[BCFL04] Bouyer, Cassez, Fleury, Larsen. Optimal strategies in priced timed game automata (*FSTTCS'04*).

[BBR05] Brihaye, Bruyère, Raskin. On optimal timed strategies (*FORMATS'05*).

[BBM06] Bouyer, Brihaye, Markey. Improved undecidability results on weighted timed automata (*Information Processing Letters*).

[BLMR06] Bouyer, Larsen, Markey, Rasmussen. Almost-optimal strategies in one-clock priced timed automata (*FSTTCS'06*).

[Rut11] Rutkowski. Two-player reachability-price games on single-clock timed automata (*QAPL'11*).

[HIM13] Hansen, Ibsen-Jensen, Miltersen. A faster algorithm for solving one-clock priced timed games (*CONCUR'13*).

[BGK+14] Brihaye, Geeraerts, Krishna, Manasa, Monmege, Trivedi. Adding Negative Prices to Priced Timed Games (*CONCUR'14*).

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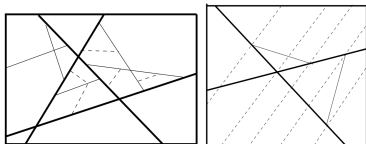
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Tree-like weighted timed games can be solved in 2EXPTIME.

[ABM04,BCFL04]

Depth- k weighted timed games can be solved in EXPTIME. There is a symbolic algorithm to solve weighted timed games **with a strongly non-Zeno cost**.



Optimal reachability in weighted timed games (2)

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- Key: resetting the clock somehow resets the history...

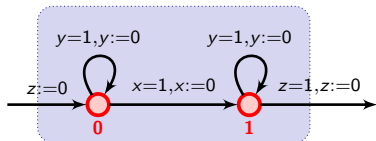
Computing the optimal cost: why is that hard?

Given two clocks x and y , we can check whether $y = 2x$.

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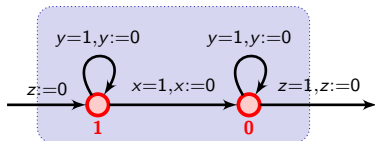
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Add⁺(x)



The cost is increased by x_0

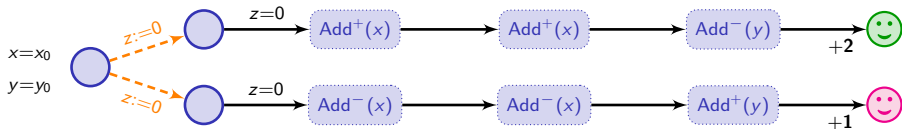
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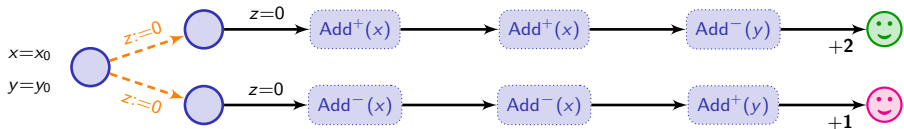
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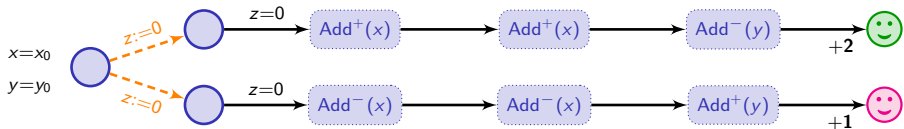
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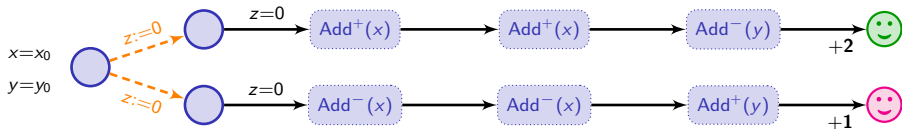
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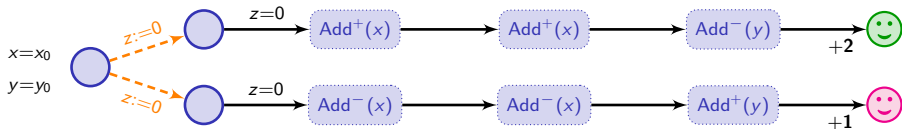
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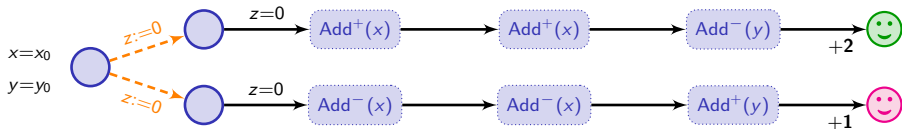
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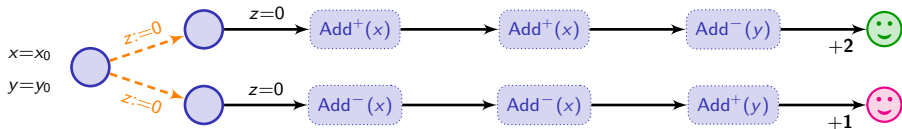
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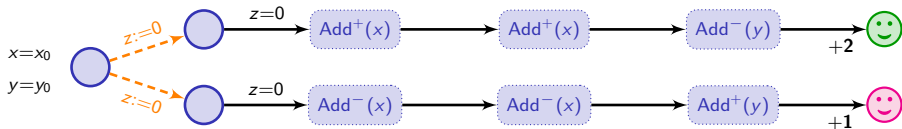
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Player 1 will simulate a two-counter machine:

- each instruction is encoded as a module;
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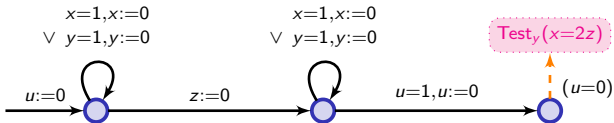
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Globally, $(x \leq 1, y \leq 1, u \leq 1)$



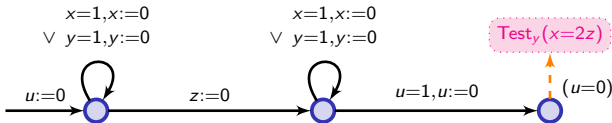
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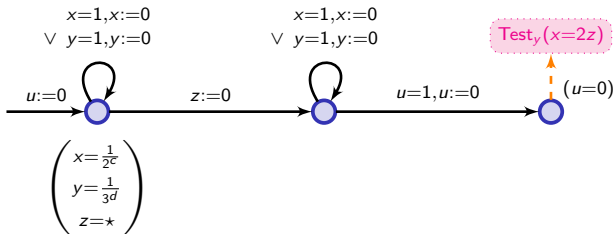
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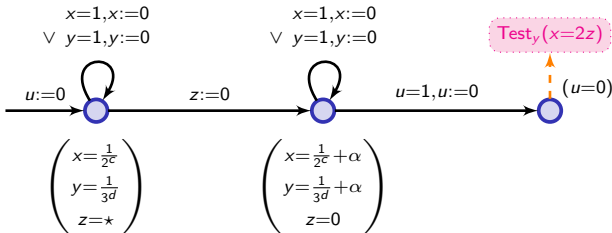
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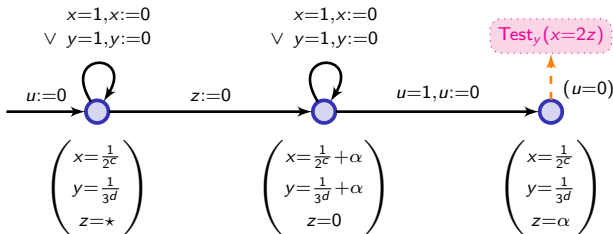
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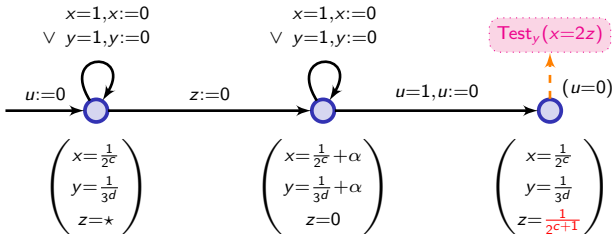
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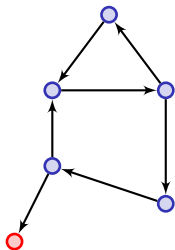
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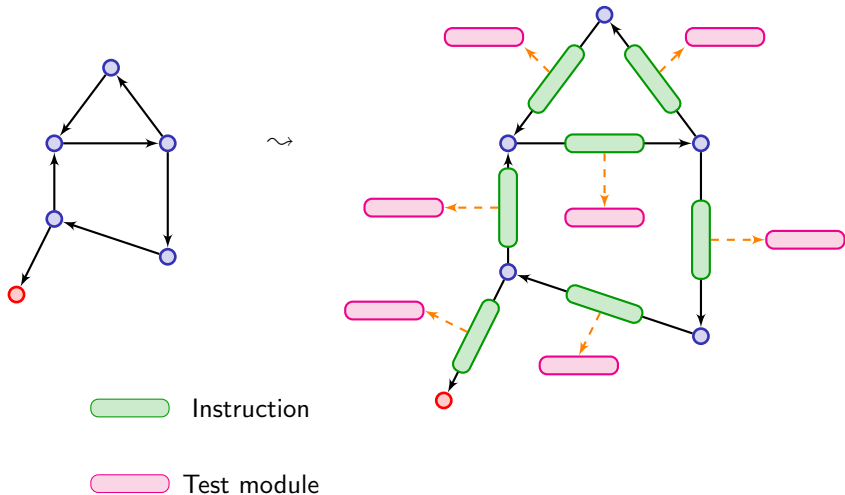
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Shape of the reduction



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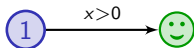
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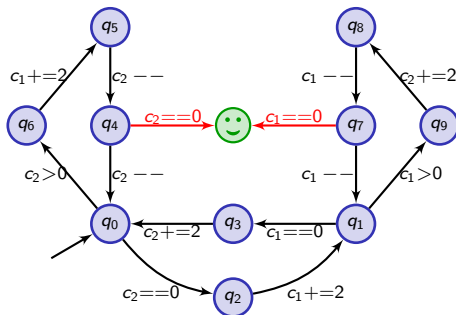
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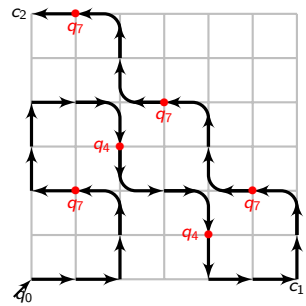
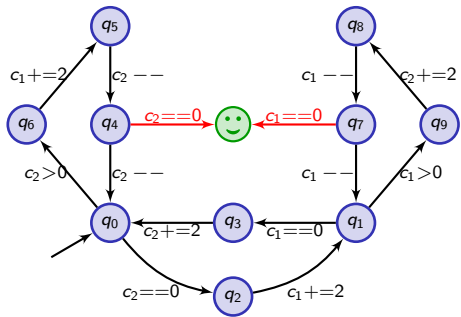
The value of the game is 0, but no strategy has cost 0.



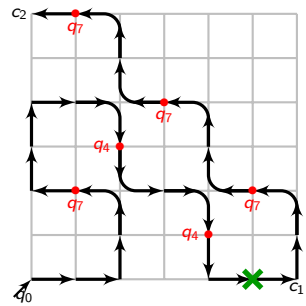
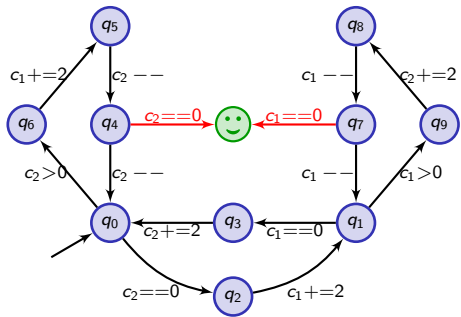
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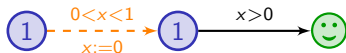
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The value of the game is 3, but no strategy has cost 3.



The value of the game is 1, but there is a strategy that secures cost < 1 .



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In weighted timed automata, the optimal cost is an integer, and can be computed in PSPACE.

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The **existence problem** is undecidable in weighted timed games.

Outline of the rest of the talk

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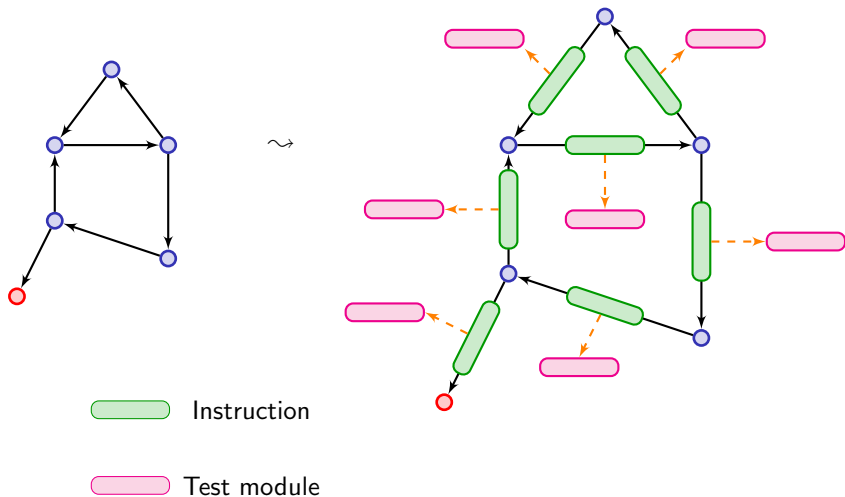
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- 2 Propose an **approximation algorithm** for a large class of weighted timed games (that comprises the class of games used for proving the above undecidability)
 - Almost-optimality in practice should be sufficient
 - Even when we know how to compute the value, we are only able to synthesize almost-optimal strategies...

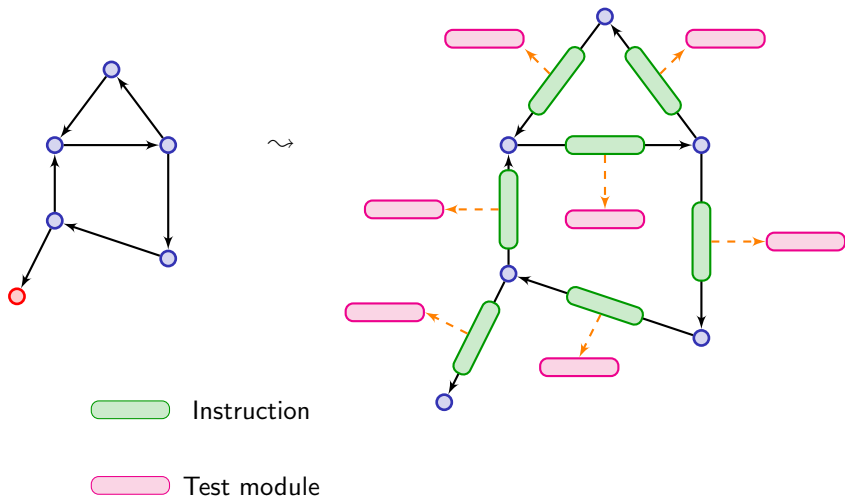
Outline

- 1 Introduction
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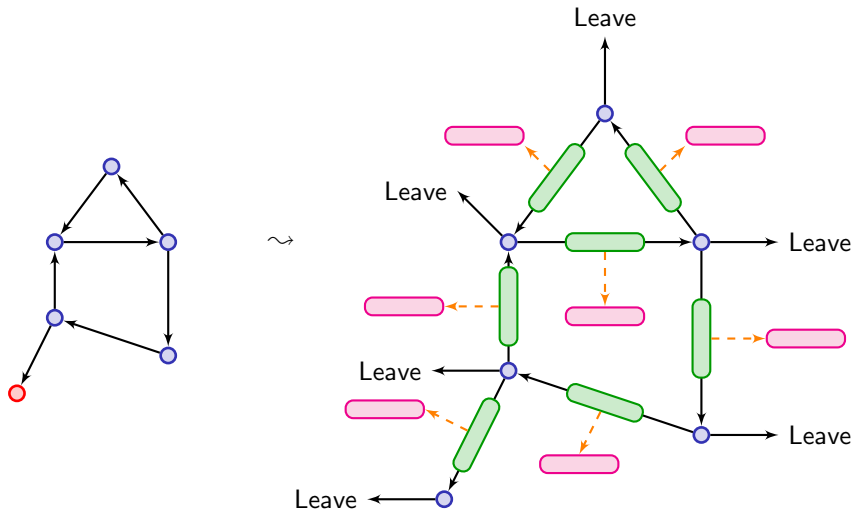
A snapshot on the undecidability proof



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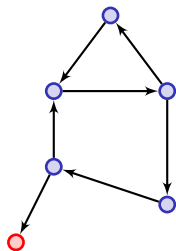
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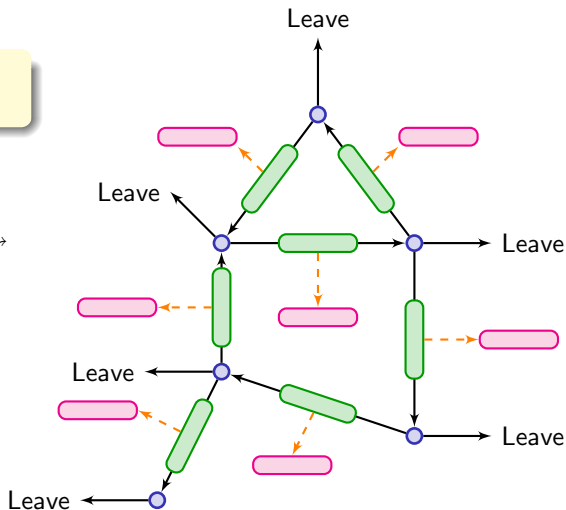
Leave with cost $3 + 1/2^n$ (n : length of the path)

A snapshot on the undecidability proof

\mathcal{M} does not halt iff the value of $\mathcal{G}_{\mathcal{M}}$ is 3



\rightsquigarrow



Leave with cost $3 + 1/2^n$ (n : length of the path)

Theorem [BJM15]

The **value problem** is undecidable in weighted timed games (with four clocks or more).

- Remark on the reduction:
 - Cost 0 within the core of the game
 - The rest of the game is acyclic

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Optimal cost is computable...

... when cost is strongly non-zero.

[AM04,BCFL04]

That is, there exists $\kappa > 0$ such that for every region cycle C , for every real run ϱ read on C ,

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Theorem

Let \mathcal{G} be a weighted timed game, in which the cost is almost-strongly non-zero. For every $\epsilon > 0$, one can compute:

- two values v_ϵ^- and v_ϵ^+ such that

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- ↪ This is not possible here
There might be runs with prefixes of arbitrary length and cost 0 (e.g. the game of the undecidability proof)

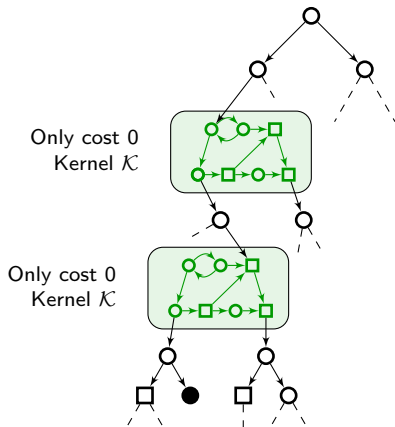
Idea for approximation

Idea

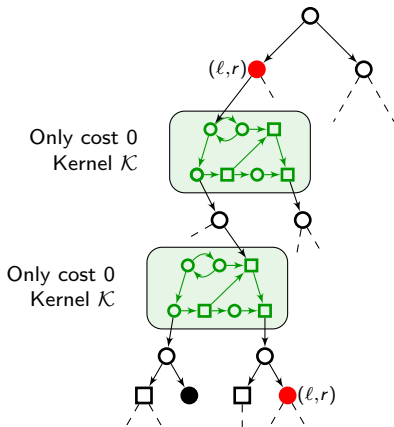
Only partially unfold the game:

- Keep components with cost 0 untouched – we call it the **kernel**
- Unfold the rest of the game

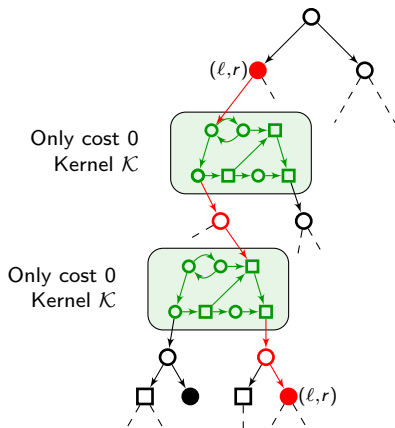
Semi-unfolding



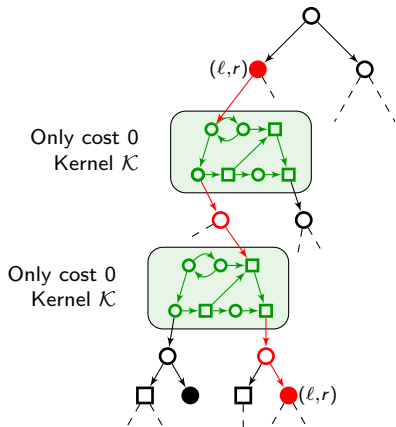
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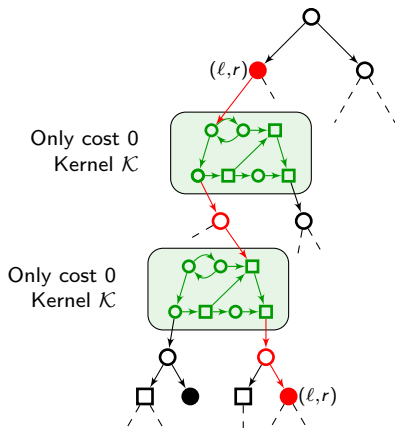


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Hypothesis:
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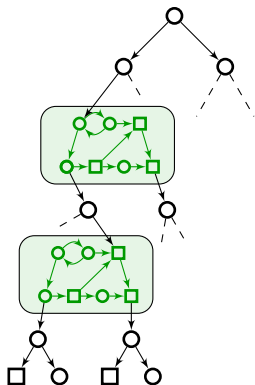
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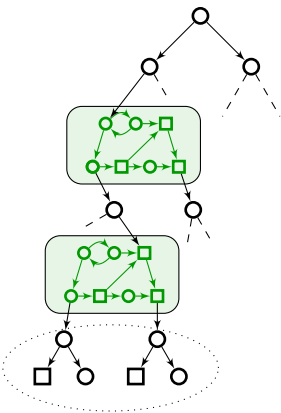
Hypothesis:
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Conclusion: we can stop unfolding the game after N steps
 (e.g. $N = (M + 2) \cdot |\mathcal{R}(\mathcal{A})|$, where M is a pre-computed bound on optcost_G)

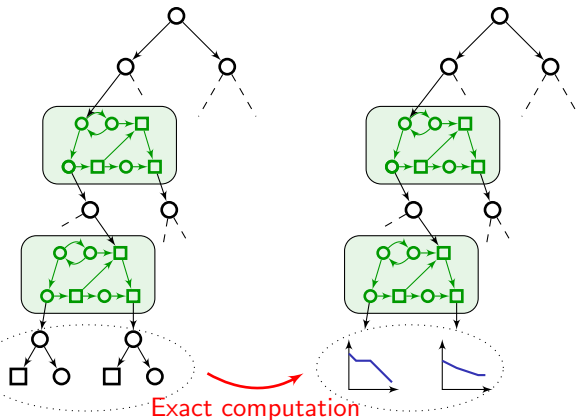
Approximation scheme



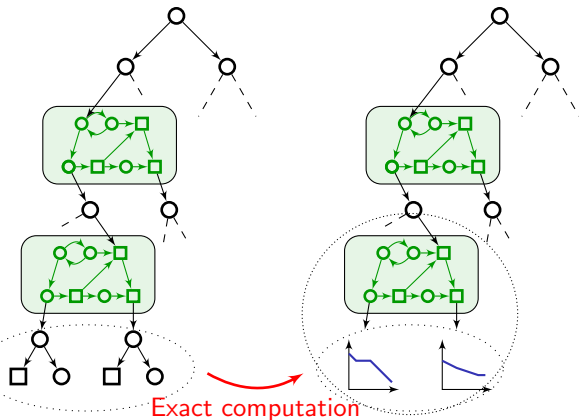
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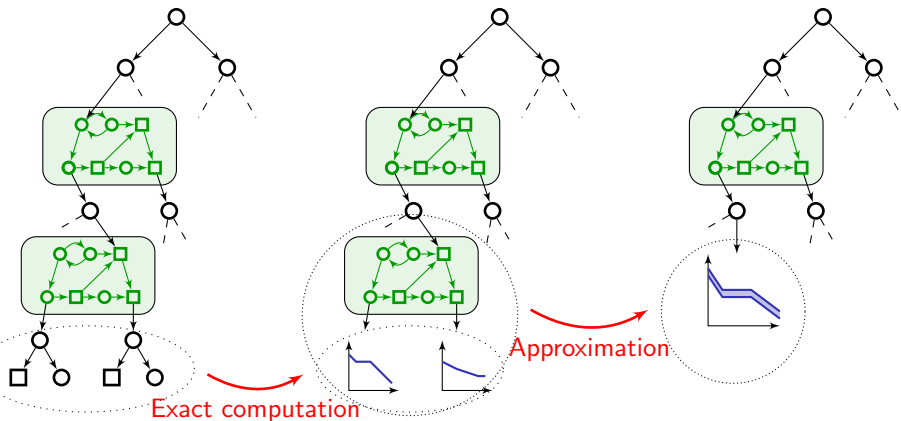
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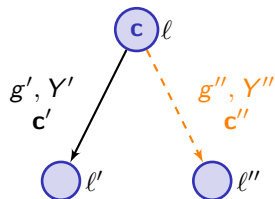


First step: Tree-like parts

↪ Goes back to [LMM02]

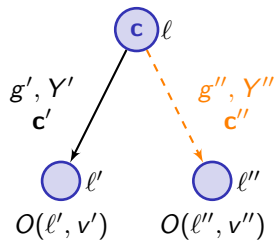
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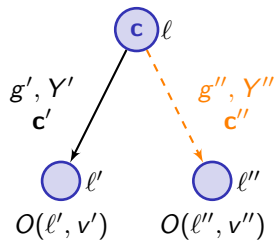
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$$O(l, v) =$$

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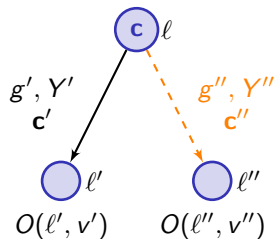
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$$O(l, v) = \inf_{t' | v+t' \models g'}$$

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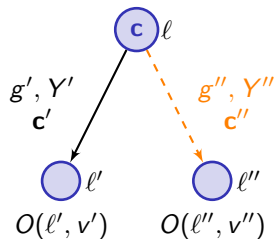
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$$O(\ell, v) = \inf_{t' \mid v+t' \models g'} \max(\quad , \quad)$$

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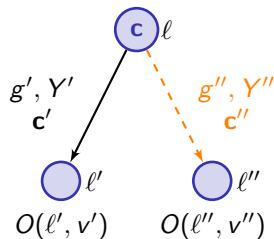
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$$(\alpha) = t'c + c' + O(\ell', v')$$

$$v' = [Y' \leftarrow 0](v+t')$$

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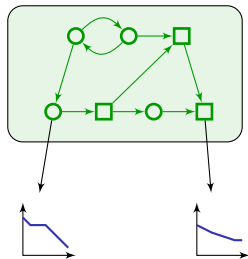
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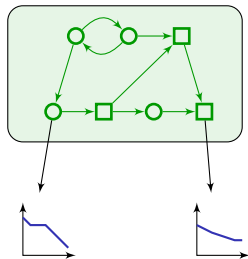
Second step: Kernels



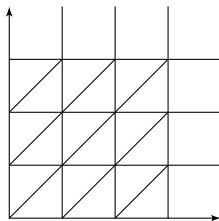
Output cost functions f

Second step: Kernels

- 1 Refine the regions such that f differs of at most ϵ within a small region

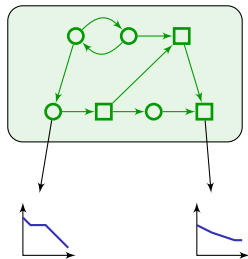


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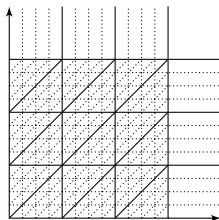


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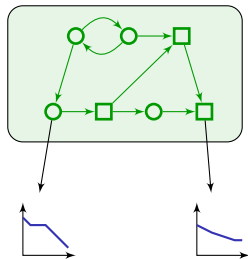


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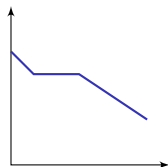
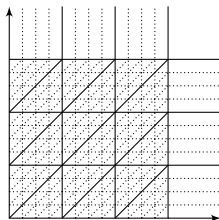


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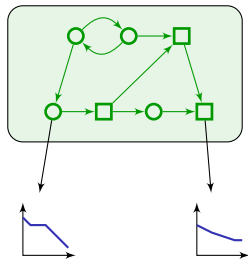


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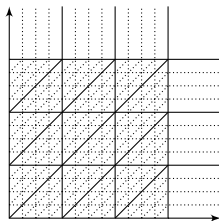


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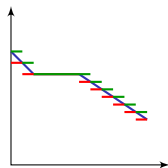
- 1 Refine the regions such that f differs of at most ϵ within a small region



Output cost functions f

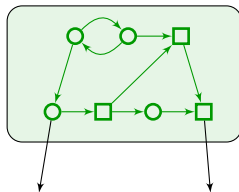


- 2 Under- and over-approximate by piecewise constant functions f_ϵ^- and f_ϵ^+



Second step: Kernels

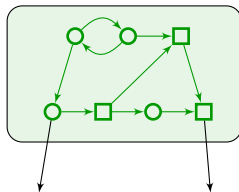
- 3 Refine/split the kernel along the new small regions and fix f_ϵ^- or f_ϵ^+ , write f_ϵ



f_ϵ : constant f_ϵ : constant

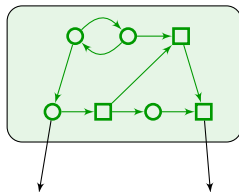
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- ③ Refine/split the kernel along the new small regions and fix f_ϵ^- or f_ϵ^+ , write f_ϵ
- ④ Since cost is 0 everywhere, the resulting game is nothing more than a **reachability timed game** with an order on target (output) edges (given by f_ϵ)



f_ϵ^- : constant f_ϵ^+ : constant

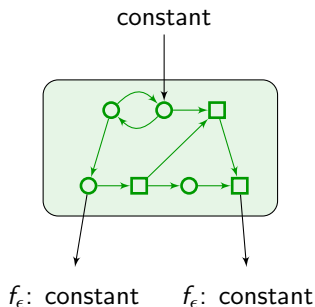
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$f_\epsilon: \text{constant}$ $f_\epsilon: \text{constant}$

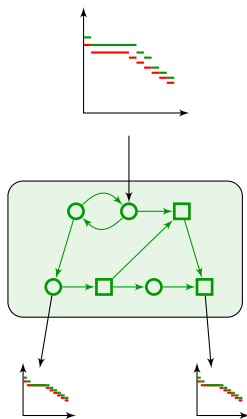
- 3 Refine/split the kernel along the new small regions and fix f_ϵ^- or f_ϵ^+ , write f_ϵ
- 4 Since cost is 0 everywhere, the resulting game is nothing more than a **reachability timed game** with an order on target (output) edges (given by f_ϵ)
- 5 Those can be solved using standard technics based on attractors: small regions are sufficient, and the local optimal cost (for output f_ϵ) is constant within a small region

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 - ⑤ Those can be solved using standard technics based on attractors: small regions are sufficient, and the local optimal cost (for output f_ϵ) is constant within a small region
- ~ We have computed ϵ -approximations of the optimal cost, which are constant within small regions. Corresponding strategies can be inferred

Outline

- 1 Introduction
- 2 Overview of "old" results
 - Weighted timed automata
 - Timed games
 - Weighted timed games
- 3 Some recent developments**
 - Undecidability of the value problem
 - Approximation of the optimal cost
 - Back to the undecidability**
- 4 Conclusion

Consequence of the approximation algorithm

Theorem

The value problem is co-recursively enumerable (for almost-strongly non-zero weighted timed games), but not recursively enumerable.

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Summary of the talk

- Quick overview of results concerning the optimal reachability problem in weighted timed games
- New insight into the value problem for this model:
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- Understand the multiplayer setting