# Weighted Timed Automata: Optimization Problems

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LSV - ENS Cachan & CNRS - France

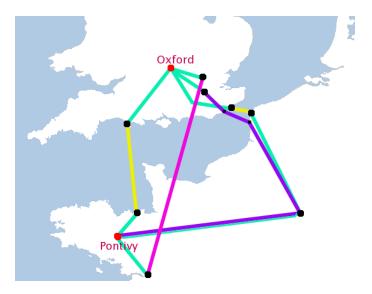
Based on joint works with Thomas Brihaye (UMH, Belgium), Ed Brinksma (Twente University, The Netherlands), Véronique Bruyère (UMH, Belgium), Franck Cassez (IRCCyN, France), Emmanuel Fleury (LaBRI, France), Kim G. Larsen (Aalborg University, Denmark), Nicolas Markey (LSV, France), Jean-François Raskin (ULB, Belgium), and Jacob Illum Rasmussen (Aalborg University, Denmark)

# Outline

## 1. Introduction

- 2. Timed automata with costs
- 3. Optimal timed games
- 4. Conclusion

# A starting example



Introduction

# Natural questions



Introduction

# Natural questions

#### Dxford

Can I reach Pontivy from Oxford?

What is the minimal time to reach Pontivy from Oxford?

# Natural questions

#### Oxford

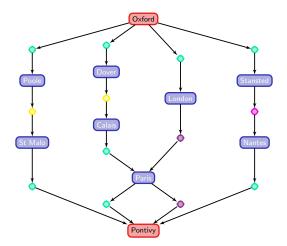
- Can I reach Pontivy from Oxford?
- What is the minimal time to reach Pontivy from Oxford?
- What is the minimal fuel consumption to reach Pontivy from Oxford?

# Natural questions

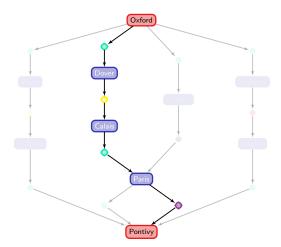
#### Oxford

- Can I reach Pontivy from Oxford?
- What is the minimal time to reach Pontivy from Oxford?
- What is the minimal fuel consumption to reach Pontivy from Oxford?
- What if there is an unexpected event?

# A first model of the system

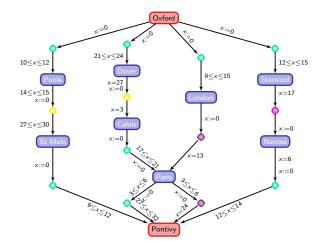


# Can I reach Pontivy from Oxford?

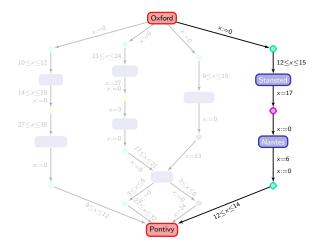


This is a reachability question in a finite graph: Yes, I can!

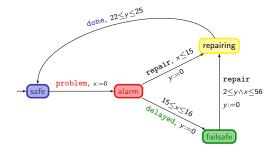
# A second model of the system

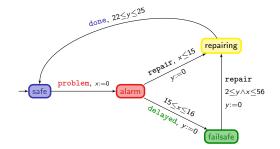


# How long will that take?



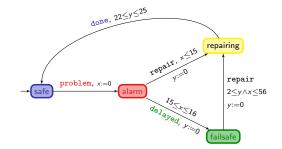
It is a reachability (and optimization) question in a timed automaton: at least 350mn = 5h50mn!



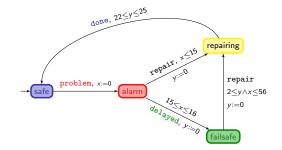




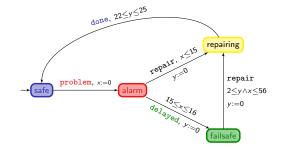
- X 0
- y 0



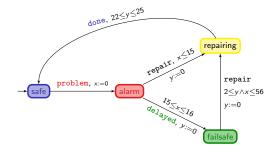
	safe	$\xrightarrow{23}$	safe
х	0		23
у	0		23



	safe	$\xrightarrow{23}$	safe	$\xrightarrow{\text{problem}}$	alarm
х	0		23		0
у	0		23		23



	safe	$\xrightarrow{23}$	safe	$\xrightarrow{\text{problem}}$	alarm	$\xrightarrow{15.6}$	alarm
х	0		23		0		15.6
у	0		23		23		38.6

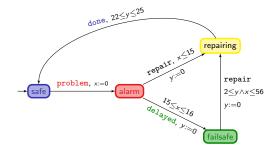


	safe	$\xrightarrow{23}$	safe	$\xrightarrow{\text{problem}}$	alarm	$\xrightarrow{15.6}$	alarm	$\xrightarrow{\text{delayed}}$	failsafe	
х	0		23		0		15.6		15.6	
у	0		23		23		38.6		0	

#### failsafe

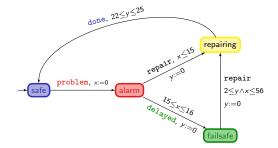
... 15.6

0



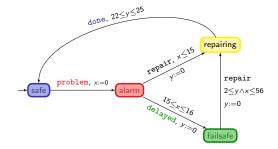
	safe	$\xrightarrow{23}$	safe	$\xrightarrow{\text{problem}}$	alarm	$\xrightarrow{15.6}$	alarm	$\xrightarrow{\text{delayed}}$	failsafe	
х	0		23		0		15.6		15.6	
у	0		23		23		38.6		0	

failsafe	$\xrightarrow{2.3}$	failsafe
 15.6		17.9
0		2.3



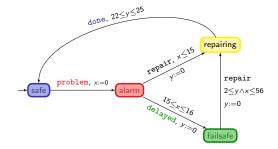
	safe	$\xrightarrow{23}$	safe	$\xrightarrow{\text{problem}}$	alarm	$\xrightarrow{15.6}$	alarm	$\xrightarrow{\text{delayed}}$	failsafe	
х	0		23		0		15.6		15.6	
у	0		23		23		38.6		0	

failsafe	$\xrightarrow{2.3}$	failsafe	$\xrightarrow{\text{repair}}$	reparation
 15.6		17.9		17.9
0		2.3		0



	safe	$\xrightarrow{23}$	safe	$\xrightarrow{\text{problem}}$	alarm	$\xrightarrow{15.6}$	alarm	$\xrightarrow{\text{delayed}}$	failsafe	
х	0		23		0		15.6		15.6	
у	0		23		23		38.6		0	

failsafe	$\xrightarrow{2.3}$	failsafe	$\xrightarrow{\text{repair}}$	reparation	$\xrightarrow{22.1}$	reparation
 15.6		17.9		17.9		40
0		2.3		0		22.1



	safe	$\xrightarrow{23}$	safe	prob	lem → alaı	$\xrightarrow{15.6}$	alarm	$\xrightarrow{\text{delayed}}$	failsafe	
х	0		23		0		15.6		15.6	
у	0		23		23	3	38.6		0	
					repair		22.1		4	
	failsafe	2.3	→ fa	ilsafe	$\xrightarrow{\text{repair}}$	reparation	$\xrightarrow{22.1}$	reparation	$\xrightarrow{\text{done}}$	safe
	15.6			17.9		17.9		40		40
	0			2.3		0		22.1		22.1

# Timed automata

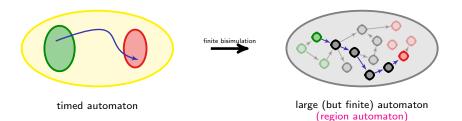
## Theorem [AD90]

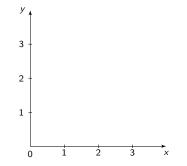
The reachability problem is decidable (and PSPACE-complete) for timed automata.

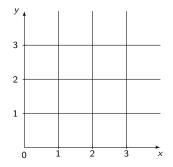
# Timed automata

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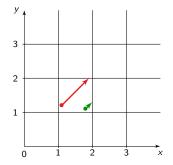
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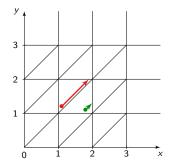




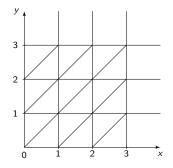
"compatibility" between regions and constraints



- "compatibility" between regions and constraints
- "compatibility" between regions and time elapsing



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an equivalence of finite index a time-abstract bisimulation

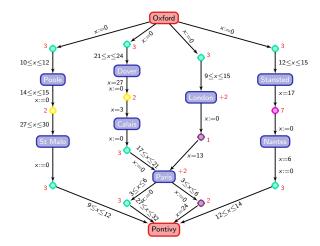


# Time-optimal reachability

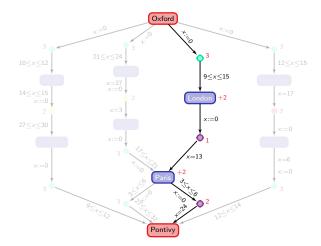
### Theorem [CY92]

The time-optimal reachability problem is decidable (and PSPACE-complete) for timed automata.

# A third model of the system



# How much fuel will I use?



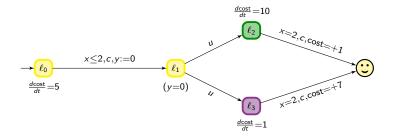
It is a *quantitative* (optimization) problem in a priced timed automaton: at least 68 anti-planet units!

## Outline

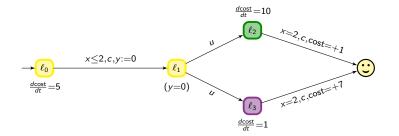
### 1. Introduction

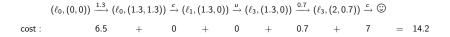
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- 3. Optimal timed games
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# HSCC'01: weighted/timed automata

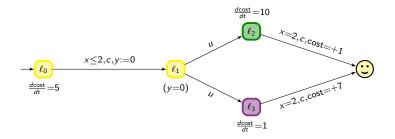


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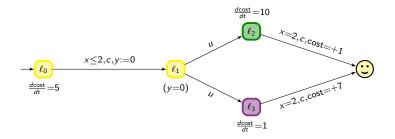




# HSCC'01: weighted/timed automata

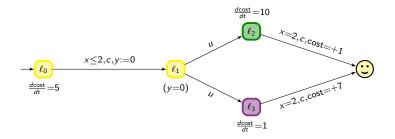


**Question:** what is the optimal cost for reaching ©?



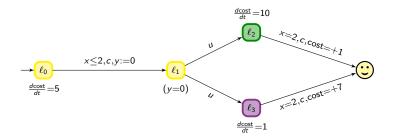
**Question:** what is the optimal cost for reaching ©?

5t + 10(2 - t) + 1, 5t + (2 - t) + 7



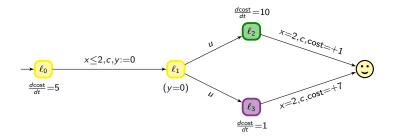
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$$\inf_{0 \le t \le 2} \min \left( 5t + 10(2-t) + 1 , 5t + (2-t) + 7 \right) = 9$$



**Question:** what is the optimal cost for reaching ©?

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

→ strategy: leave immediately  $\ell_0$ , go to  $\ell_3$ , and wait there 2 t.u.

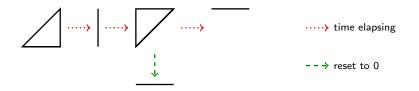
### Optimal reachability

The idea "go through corners" extends in the general case.

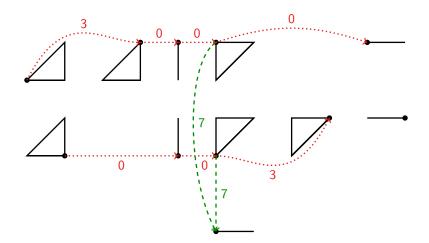
Theorem [ALP01,BFH+01,BBBR07]

Optimal reachability is decidable in timed automata. It is PSPACE-complete.

## The region abstraction is not fine enough



# The corner-point abstraction



$$\circ \xrightarrow{t_1} \circ \xrightarrow{t_2} \circ \xrightarrow{t_3} \circ \xrightarrow{t_4} \circ \xrightarrow{t_5} \circ \cdots$$

$$\circ \xrightarrow{t_1} \circ \xrightarrow{t_2} \circ \xrightarrow{t_3} \circ \xrightarrow{t_4} \circ \xrightarrow{t_5} \circ \cdots \qquad \left\{ \begin{array}{c} t_1 + t_2 \leq 2 \\ \end{array} \right.$$

$$\circ \underbrace{t_1}_{y:=0} \circ \underbrace{t_2}_{x \leq 2} \circ \underbrace{t_3}_{y \geq 5} \circ \underbrace{t_4}_{y \geq 5} \circ \underbrace{t_5}_{y \geq 5} \circ \cdots \qquad \begin{cases} t_1 + t_2 \leq 2 \\ t_2 + t_3 + t_4 \geq 5 \end{cases}$$

Optimal reachability as a linear programming problem

.

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#### Lemma

Let Z be a bounded zone and f be a function

$$f:(t_1,...,t_n)\mapsto \sum_{i=1}^n c_it_i+c$$

well-defined on  $\overline{Z}$ . Then  $inf_Z f$  is obtained on the border of  $\overline{Z}$  with integer coordinates.

Optimal reachability as a linear programming problem

$$\circ \xrightarrow{t_1} \circ \xrightarrow{t_2} \circ \xrightarrow{t_3} \circ \xrightarrow{t_4} \circ \xrightarrow{t_5} \circ \cdots \qquad \begin{cases} t_1 + t_2 \leq 2 \\ t_2 + t_3 + t_4 \geq 5 \end{cases}$$

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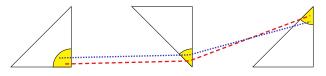
well-defined on  $\overline{Z}$ . Then  $inf_Z f$  is obtained on the border of  $\overline{Z}$  with integer coordinates.

 $\rightarrow$  for every finite path  $\pi$  in  $\mathcal{A}$ , there exists a path  $\Pi$  in  $\mathcal{A}_{cp}$  such that

 $cost(\Pi) \leq cost(\pi)$ 

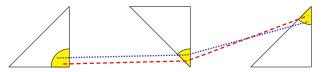
[ $\Pi$  is a "corner-point projection" of  $\pi$ ]

### Approximation of abstract paths:



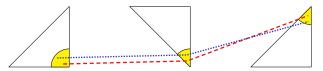
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### Approximation of abstract paths:



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

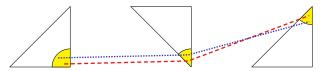
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For any path  $\Pi$  of  $\mathcal{A}_{cp}$  , for any  $\varepsilon > 0$ , there exists a path  $\pi_{\varepsilon}$  of  $\mathcal{A}$  s.t.

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

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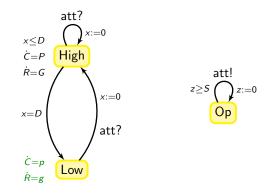
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$$\|\Pi - \pi_{\varepsilon}\|_{\infty} < \varepsilon \Rightarrow |\mathsf{cost}(\Pi) - \mathsf{cost}(\pi_{\varepsilon})| < \eta$$

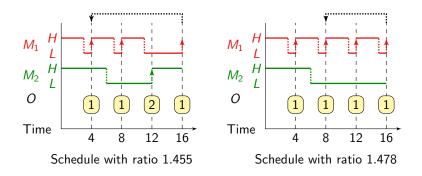
## Mean-Cost Optimization



**Question:** How to minimize  $\lim_{n\to+\infty} \frac{\operatorname{accumulated cost}(\pi_n)}{\operatorname{accumulated reward}(\pi_n)}$ ?

### An example

Two machines  $M_1(D = 3, P = 3, G = 4, p = 5, g = 3)$  and  $M_2(D = 6, P = 3, G = 2, p = 5, g = 2)$ . An operator O(4).



### Mean-cost optimization

### Theorem [BBL04,BBL08]

The mean-cost optimization problem is decidable (and PSPACE-complete) for priced timed automata.

The corner-point abstraction is sound and complete.

→ Finite behaviours: based on the following property

#### Lemma

Let Z be a bounded zone and f be a function

$$f:(t_1,...,t_n)\mapsto \frac{\sum_{i=1}^n c_i t_i + c}{\sum_{i=1}^n r_i t_i + r}$$

well-defined on  $\overline{Z}$ . Then  $inf_Z f$  is obtained on the border of  $\overline{Z}$  with integer coordinates.

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→ for every finite path π in A, there exists a path Π in A<sub>cp</sub> such that mean-cost(Π) ≤ mean-cost(π)

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Infinite behaviours: decompose each sufficiently long projection into cycles

The linear part will be negligible!

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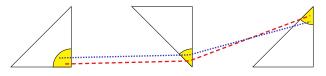
→ for every finite path  $\pi$  in  $\mathcal{A}$ , there exists a path  $\Pi$  in  $\mathcal{A}_{cp}$  such that mean-cost( $\Pi$ )  $\leq$  mean-cost( $\pi$ )

Infinite behaviours: decompose each sufficiently long projection into cycles

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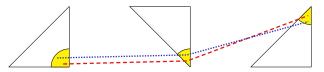
→ the optimal cycle of  $A_{cp}$  is better than any infinite path of A!

### Approximation of abstract paths:



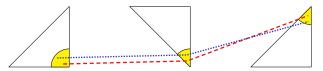
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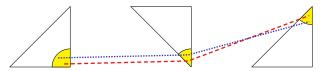
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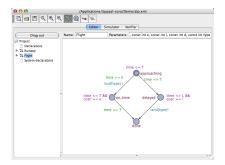
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For every  $\eta > 0$ , there exists  $\varepsilon > 0$  s.t.

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Timed automata with costs

# Uppaal Cora

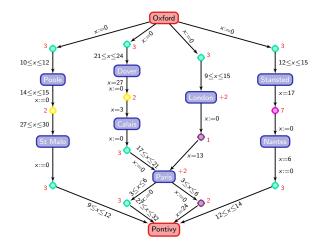


A branch of Uppaal for cost optimal reachability

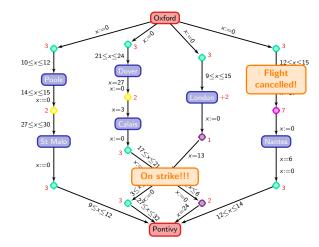
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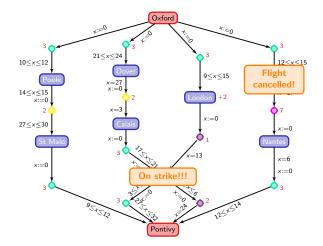
# What if an unexpected event happens?



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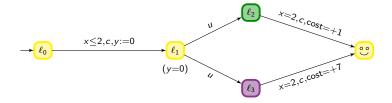


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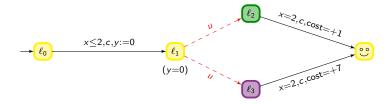


#### modelled as timed games

# A simple example of timed games



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# Decidability of timed games

### Theorem [AMPS98] [HK99]

Safety and reachability control in timed automata are decidable and  $\ensuremath{\mathsf{EXPTIME}}$  -complete.

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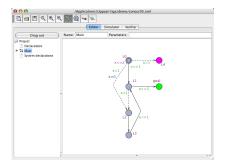
Safety and reachability control in timed automata are decidable and EXPTIME-complete.

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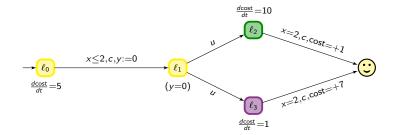
classical regions are sufficient for solving such problems

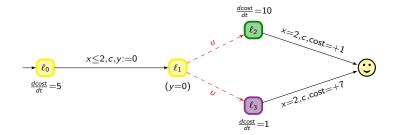
Optimal timed games

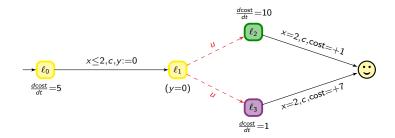
# Uppaal Tiga

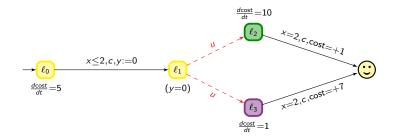


A forward on-the-fly algorithm for solving reachability timed games reachability timed as a branch of Uppaal

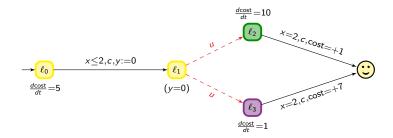




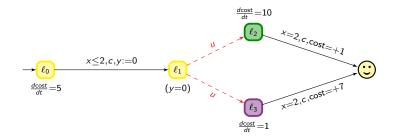




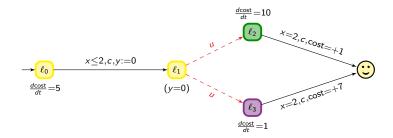
$$5t + 10(2 - t) + 1$$
,  $5t + (2 - t) + 7$ 



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

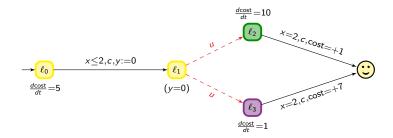


$$\inf_{0 \le t \le 2} \max \left( 5t + 10(2-t) + 1, 5t + (2-t) + 7 \right) = 14 + \frac{1}{3}$$



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$$\Rightarrow \text{ strategy: wait in } \ell_0, \text{ and when } t = \frac{4}{3}, \text{ go to } \ell_1$$

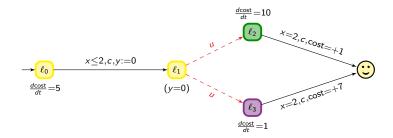


**Question:** what is the optimal cost we can ensure in state  $\ell_0$ ?

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How to automatically compute such optimal costs?



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→ strategy: wait in  $\ell_0$ , and when  $t = \frac{4}{3}$ , go to  $\ell_1$ 

- How to automatically compute such optimal costs?
- How to synthesize optimal strategies (if one exists)?

optimal time is computable in timed games



optimal time is computable in timed games

case of acyclic games

[AM99] [LMM02]

optimal time is computable in timed games [AM99]
 case of acyclic games [LMM02]
 general case [ABM04]
 complexity of k-step games

under a strongly non-zeno assumption, optimal cost is computable

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 complexity of *k*-step games
 under a strongly non-*zeno* assumption, optimal cost is computable

 general case [BCFL04]

- structural properties of strategies (e.g. memory)
- under a strongly non-zeno assumption, optimal cost is computable

#### general case

#### [BBR05]

- with five clocks, optimal cost is not computable!
- with one clock and one stopwatch cost, optimal cost is computable

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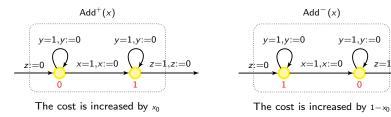
[BBM06]

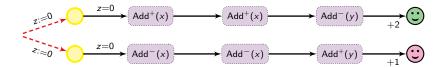
with three clocks, optimal cost is not computable

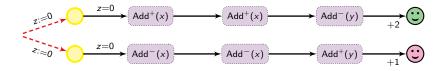
# general case [BBR05] with five clocks, optimal cost is not computable! with one clock and one stopwatch cost, optimal cost is computable general case [BBM06] with three clocks, optimal cost is not computable the single-clock case [BLMR06] with one clock, optimal cost is computable

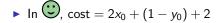
z=1, z:=0

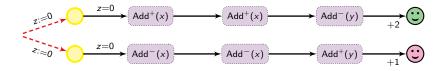
# Why is that hard?





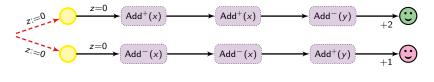






► In 
$$\bigcirc$$
, cost =  $2x_0 + (1 - y_0) + 2$   
In  $\bigcirc$ , cost =  $2(1 - x_0) + y_0 + 1$ 

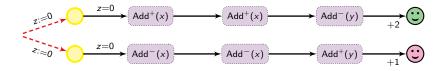
Given two clocks x and y, we can check whether y = 2x



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$$\textcircled{O}$$
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• if  $y_0 < 2x_0$ , player 2 chooses the first branch: cost > 3

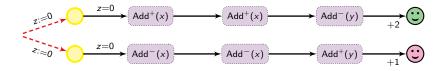
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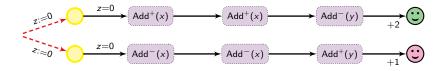
if y<sub>0</sub> < 2x<sub>0</sub>, player 2 chooses the first branch: cost > 3 if y<sub>0</sub> > 2x<sub>0</sub>, player 2 chooses the second branch: cost > 3

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



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- if y<sub>0</sub> < 2x<sub>0</sub>, player 2 chooses the first branch: cost > 3 if y<sub>0</sub> > 2x<sub>0</sub>, player 2 chooses the second branch: cost > 3 if y<sub>0</sub> = 2x<sub>0</sub>, in both branches, cost = 3
- ▶ Player 1 has a winning strategy with cost  $\leq 3$  iff  $y_0 = 2x_0$

# Outline

#### 1. Introduction

- 2. Timed automata with costs
- 3. Optimal timed games
- 4. Conclusion

## Conclusion

Priced timed automata, a model and framework to represent quantitative constraints on timed systems:

several interesting optimization problems

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#### Not mentioned here

- ▶ all works on model-checking issues (extensions of CTL, LTL)
  - very few decidability results

[BBR04,BBM06,BLM07,BM07]

discounted cost

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#### Further work

 approximate optimal timed games to circumvent undecidability results