# Optimal strategies in weighted timed games: undecidability and approximation

### Nicolas Markey LSV, CNRS & ENS Cachan, France

(joint work with Patricia Bouyer and Samy Jaziri)

AVeRTS'15 workshop – Bangaluru, India December 19, 2015





# Model checking and synthesis



★ E ► ★ E ►

# Model checking and synthesis





Definition ([AD90])

A timed automaton is made of

a transition system,

#### Example (A computer mouse)



[AD90] Alur, Dill. Automata For Modeling Real-Time Systems. ICALP, 1990.

### Definition ([AD90])

A timed automaton is made of

- a transition system,
- a set of clocks,

#### Example (A computer mouse)



[AD90] Alur, Dill. Automata For Modeling Real-Time Systems. ICALP, 1990.

### Definition ([AD90])

A timed automaton is made of

- a transition system,
- a set of clocks,
- timing constraints on states and transitions.

#### Example (A computer mouse) right\_button? left button? right left idle x := 0x := 0x≤300 x<300 *x* = 300 x = 300left click! right\_click! $x \leq 300$ left\_button? ≤ 300 right\_button? left double click! right\_double\_click!

[AD90] Alur, Dill. Automata For Modeling Real-Time Systems. ICALP, 1990.

























#### Theorem ([AD90,ACD93, ...])

Reachability in timed automata is decidable (as well as many other important properties).

E > < E >

[AD90] Alur, Dill. Automata For Modeling Real-Time Systems. ICALP, 1990. [ACD93] Alur, Courcoubetis, Dill. Model-Checking in Dense Real-Time. Inf. & Comp., 1993. Region automaton



### Region automaton



◆ 臣 ▶ ◆ 臣 ▶

### Region automaton





### Definition

- A timed game is made of
  - a timed automaton;

### Example



### Definition

#### A timed game is made of

- a timed automaton;
- a partition between controllable and uncontrollable transitions.

### Example



### Definition

#### A timed game is made of

- a timed automaton;
- a partition between controllable and uncontrollable transitions.

#### Example



a memoryless strategy in  $(\ell_0, x = 0)$ : wait 0.5 goto  $\ell_1$ in  $(\ell_1, x)$ : wait until x = 2goto  $\odot$ in  $(\ell_2, x \le 1)$ : wait until x = 1goto  $\ell_3$ in  $(\ell_3, x \le 1)$ : wait until x = 1goto  $\ell_1$ 

### Theorem ([AMPS98])



### Theorem ([AMPS98])



### Theorem ([AMPS98])



### Theorem ([AMPS98])



### Theorem ([AMPS98])

Deciding the winner in a timed game (e.g. for reachability objectives) is EXPTIME-complete.



E > < E >

# Outline of the talk

Introduction: timed automata and timed games

Measuring extra quantities in timed automata
Example: task graph scheduling

- Timed automata with observer variables
- 3 Cost-optimal strategies
  - Optimal reachability in priced timed automata
  - Optimal reachability in priced timed games
- 4 Conclusions and future works

#### 5 Advertisements

# Outline of the talk

Introduction: timed automata and timed games

Measuring extra quantities in timed automata
Example: task graph scheduling
Timed automata with observer variables

#### 3 Cost-optimal strategies

- Optimal reachability in priced timed automata
- Optimal reachability in priced timed games
- ④ Conclusions and future works

#### 5 Advertisements

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





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



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



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



≣⇒
Definition ([KPSY99,ALP01,BFH+01])

A priced timed automaton is made of

a timed automaton;





Definition ([KPSY99,ALP01,BFH+01])

A priced timed automaton is made of

- a timed automaton;
- the price of each transition and location.

#### Example



Definition ([KPSY99,ALP01,BFH+01])

A priced timed automaton is made of

- a timed automaton;
- the price of each transition and location.



[KPSY99] Kesten, Pnueli, Sifakis, Yovine. Decidable Integration Graphs. Inf. & Comp., 1999. [ALP01] Alur, La Torre, Pappas. Optimal paths in weighted timed automata. HSCC, 2001. [BFH<sup>+</sup>01] Behrmann *et al.* Minimum-cost reachability in priced timed automata. HSCC, 2001.

E > < E >

Definition ([KPSY99,ALP01,BFH+01])

A priced timed automaton is made of

- a timed automaton;
- the price of each transition and location.



[KPSY99] Kesten, Pnueli, Sifakis, Yovine. Decidable Integration Graphs. Inf. & Comp., 1999. [ALP01] Alur, La Torre, Pappas. Optimal paths in weighted timed automata. HSCC, 2001. [BFH<sup>+</sup>01] Behrmann *et al.* Minimum-cost reachability in priced timed automata. HSCC, 2001.

E > < E >

Definition ([KPSY99,ALP01,BFH+01])

A priced timed automaton is made of

- a timed automaton;
- the price of each transition and location.



[KPSY99] Kesten, Pnueli, Sifakis, Yovine. Decidable Integration Graphs. Inf. & Comp., 1999. [ALP01] Alur, La Torre, Pappas. Optimal paths in weighted timed automata. HSCC, 2001. [BFH<sup>+</sup>01] Behrmann *et al.* Minimum-cost reachability in priced timed automata. HSCC, 2001.

E > < E >

Definition ([KPSY99,ALP01,BFH+01])

A priced timed automaton is made of

- a timed automaton;
- the price of each transition and location.



< ⊒ > < ⊒ >

Definition ([KPSY99,ALP01,BFH+01])

A priced timed automaton is made of

- a timed automaton;
- the price of each transition and location.



Definition ([KPSY99,ALP01,BFH+01])

A priced timed automaton is made of

- a timed automaton;
- the price of each transition and location.



Definition ([KPSY99,ALP01,BFH+01])

A priced timed automaton is made of

- a timed automaton;
- the price of each transition and location.



Definition ([KPSY99,ALP01,BFH+01])

A priced timed automaton is made of

- a timed automaton;
- the price of each transition and location.



### Example: task graph scheduling

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



≣⇒

### Modelling the task graph scheduling problem



### Modelling the task graph scheduling problem



### Modelling the task graph scheduling problem



 $t_4:=1$ 

done<sub>2</sub>

 $t_1 \wedge t_2$ 

 $add_2$ 

-≣⇒

# Outline of the talk

Introduction: timed automata and timed games

Measuring extra quantities in timed automata
Example: task graph scheduling
Timed automata with observer variables

#### 3 Cost-optimal strategies

- Optimal reachability in priced timed automata
- Optimal reachability in priced timed games



#### 5 Advertisements





Minimal cost for reaching ©:









3





Theorem ([BBBR07])

*Optimal reachability in priced timed automata is* PSPACE-*complete.* 

### Theorem ([BBBR07])

*Optimal reachability in priced timed automata is* PSPACE-*complete.* 



### Theorem ([BBBR07])

*Optimal reachability in priced timed automata is* PSPACE-*complete.* 

### Proof

- Regions are not precise enough;
- Use regions with corner-points:

### Theorem ([BBBR07])

*Optimal reachability in priced timed automata is* PSPACE-*complete.* 

### Proof

- Regions are not precise enough;
- Use regions with corner-points:



[BBBR07] Bouyer, Brihaye, Bruyère, Raskin. On the optimal reachability problem. FMSD, 2007. 🛶 🚊 🕨 🛬

### Theorem ([BBBR07])

*Optimal reachability in priced timed automata is* PSPACE-*complete.* 

### Proof

- Regions are not precise enough;
- Use regions with corner-points:



[BBBR07] Bouyer, Brihaye, Bruyère, Raskin. On the optimal reachability problem. FMSD, 2007. 🛶 👳 🛌

### Theorem ([BBBR07])

*Optimal reachability in priced timed automata is* PSPACE-*complete.* 

### Proof

- Regions are not precise enough;
- Use regions with corner-points:



[BBBR07] Bouyer, Brihaye, Bruyère, Raskin. On the optimal reachability problem. FMSD, 2007. 🗤 🤅 🕨 🖉 👳

### Theorem ([BBBR07])

*Optimal reachability in priced timed automata is* PSPACE-*complete.* 

#### Proof

• optimal schedule as a linear programming problem:



### Theorem ([BBBR07])

*Optimal reachability in priced timed automata is* PSPACE-*complete.* 

#### Proof

• optimal schedule as a linear programming problem:



#### [BBBR07] Bouyer, Brihaye, Bruyère, Raskin. On the optimal reachability problem. FMSD, 2007. 🗤 🗧 🕨 🗸 🚍 🕨

### Theorem ([BBBR07])

*Optimal reachability in priced timed automata is* PSPACE-*complete.* 

#### Proof

• optimal schedule as a linear programming problem:



[BBBR07] Bouyer, Brihaye, Bruyère, Raskin. On the optimal reachability problem. FMSD, 2007. 🛛 🗸 🚊 🕨 🤇 🚍 א

### Theorem ([BBBR07])

*Optimal reachability in priced timed automata is* PSPACE-*complete.* 

#### Proof

• optimal schedule as a linear programming problem:

 $\underbrace{t_1}_{y:=0} \underbrace{t_2}_{x \le 2} \underbrace{t_3}_{y \ge 3} \underbrace{t_4}_{y \ge 3} \underbrace{t_5}_{t_2 + t_3 + t_4} \underbrace{t_5}_{t_2 + t_3 + t_4} \ge 3$ 

[BBBR07] Bouyer, Brihaye, Bruyère, Raskin. On the optimal reachability problem. FMSD, 2007. 🛛 🗸 🚊 🕨 🤇 🚍 א

### Theorem ([BBBR07])

*Optimal reachability in priced timed automata is* PSPACE-*complete.* 

#### Proof

• optimal schedule as a linear programming problem:

 $\underbrace{t_1}_{y:=0} \underbrace{t_2}_{x \le 2} \underbrace{t_3}_{y \ge 3} \underbrace{t_4}_{t_5} \underbrace{t_5}_{t_2+t_3+t_4} \ge 3$ 

 $\rightsquigarrow$  infimum over bounded zone reached at a point on the frontier, with integer coordinates.

### Theorem ([BBBR07])

*Optimal reachability in priced timed automata is* PSPACE-*complete.* 

#### Proof

• optimal schedule as a linear programming problem:

$$\forall \pi. \exists \pi_{cp}. cost(\pi_{cp}) \leq cost(\pi).$$

### Theorem ([BBBR07])

*Optimal reachability in priced timed automata is* PSPACE-*complete.* 

#### Proof

• optimal schedule as a linear programming problem:

$$\forall \pi. \exists \pi_{cp}. cost(\pi_{cp}) \leq cost(\pi).$$

• approximate path in corner-point abstraction by a real run:

 $\forall \pi_{cp}. \exists \pi. cost(\pi) \leq cost(\pi_{cp}) + \epsilon.$
# Outline of the talk

Introduction: timed automata and timed games

Measuring extra quantities in timed automata
Example: task graph scheduling
Timed automata with observer variables

#### 3 Cost-optimal strategies

- Optimal reachability in priced timed automata
- Optimal reachability in priced timed games
- ④ Conclusions and future works

#### 5 Advertisements

### Example: task graph scheduling

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



≣⇒

Using games to model uncertainty over delays

Processors with exact delays:



Using games to model uncertainty over delays

Processors with exact delays:



Processors with approximate delays:







Minimal cost for reaching ©:













# Looking for optimal strategies...



### Looking for optimal strategies...





Theorem ([BBR05,BBM06])

Optimal reachability in priced timed games is undecidable.

Theorem ([BBR05,BBM06])

Optimal reachability in priced timed games is undecidable.

Proof

Encode a two-counter machine as a priced timed game.

Theorem ([BBR05,BBM06])

Optimal reachability in priced timed games is undecidable.

Proof

Encode a two-counter machine as a priced timed game.

• add the value of clock x to the accumulated cost



Theorem ([BBR05,BBM06])

Optimal reachability in priced timed games is undecidable.

Proof

Encode a two-counter machine as a priced timed game.

- add the value of clock x to the accumulated cost
- add 1 x to the accumulated cost



Theorem ([BBR05,BBM06])

Optimal reachability in priced timed games is undecidable.

Proof

- add the value of clock x to the accumulated cost
- add 1 x to the accumulated cost
- check that y = 2x



Theorem ([BBR05,BBM06])

Optimal reachability in priced timed games is undecidable.

Proof

- add the value of clock x to the accumulated cost
- add 1 x to the accumulated cost
- check that y = 2x



### Theorem ([BBR05,BBM06])

Optimal reachability in priced timed games is undecidable.

#### Proof

- add the value of clock x to the accumulated cost
- add 1 x to the accumulated cost
- check that y = 2x
- divide clock x by 2



### Theorem ([BBR05,BBM06])

Optimal reachability in priced timed games is undecidable.

Proof

Encode a two-counter machine as a priced timed game.

- add the value of clock x to the accumulated cost
- add 1 x to the accumulated cost
- check that y = 2x
- divide clock x by 2

 $\rightsquigarrow$  We can use the following encoding:

$$x_1 = \frac{1}{2^{c_1}} \qquad \qquad x_2 = \frac{1}{2^{c_2}}$$

Theorem ([BBR05,BBM06])

Optimal reachability in priced timed games is undecidable.

Proof



Theorem ([BBR05,BBM06])

Optimal reachability in priced timed games is undecidable.

Proof

Encode a two-counter machine as a priced timed game.

Lemma

The halting state is reachable if, and only if, there is an optimal strategy in the priced timed game.

[BBR05] Brihaye, Bruyère, Raskin. On optimal timed strategies. FORMATS, 2005. [BBM06] Bouyer, Brihaye, Markey. Improved undecidability results on weighted timed automa. IPL, 2006 → < = >



[BBR05] Brihaye, Bruyère, Raskin. On optimal timed strategies. FORMATS, 2005. [BBM06] Bouyer, Brihaye, Markey. Improved undecidability results on weighted timed automa. IPL, 2006 → < Ξ →



#### Wouldn't almost-optimal strategies be sufficient?

[BBR05] Brihaye, Bruyère, Raskin. On optimal timed strategies. FORMATS, 2005. [BBM06] Bouyer, Brihaye, Markey. Improved undecidability results on weighted timed automa. IPL, 2006 → < Ξ →

### Definition

(▲ 臣 ▶ ▲ 臣 ▶

### Definition

#### Cost of a path:

```
cost(\pi) = sum of costs of all transitions until target location
```

#### Definition

### Cost of a path:

```
cost(\pi) = sum of costs of all transitions until target location
```

#### Cost of a strategy:

 $cost(\sigma) = sup\{cost(\pi) \mid \pi \text{ outcome of } \sigma\}$ 

#### Definition

### Cost of a path: $cost(\pi) = sum of costs of all transitions until target location$

#### Cost of a strategy:

 $cost(\sigma) = sup\{cost(\pi) \mid \pi \text{ outcome of } \sigma\}$ 

#### Optimal cost in a priced timed game:

 $optcost_{\mathcal{G}} = inf\{cost(\sigma) \mid \sigma \text{ winning strategy in } \mathcal{G}\}$ 

# Definition Cost of a path: $\cot(\pi) = \text{sum of costs of all transitions until target location}$ Cost of a strategy: $\cot(\sigma) = \sup\{\cot(\pi) \mid \pi \text{ outcome of } \sigma\}$ Optimal cost in a priced timed game: $\operatorname{optcost}_{\mathcal{G}} = \inf\{\operatorname{cost}(\sigma) \mid \sigma \text{ winning strategy in } \mathcal{G}\}$

The existence of a strategy with cost less than k is undecidable. What about deciding if  $optcost_{\mathcal{G}} \leq k$ ?












The value of the game is 3, but there is no optimal strategy...

Adapting the previous reduction...











### Adapting the previous reduction...

- if *M* does not halt: Player 1 simulates correctly until 2<sup>n</sup> > 1/ϵ. → cost(σ) ≤ 3 + ϵ
- if *M* halts: correct simulation for finite duration.

$$\label{eq:star} \underset{\text{for all } \sigma}{ \label{eq:star}} 3 + \alpha_{\mathcal{M}}$$



Theorem ([BJM15])

The value problem is undecidable in priced timed games.

[BJM15] Bouyer, Jaziri, Markey. On the Value Problem in Weighted Timed Games. CONCUR, 2015. 👒 🚊 🕨 🖉 🚍 א

Theorem ([BJM15])

The value problem is undecidable in priced timed games.

Remark

- blue nodes and intermediary instruction modules have cost zero everywhere;
- positive weights only occur in acyclic parts.



#### 

### Definition

A priced timed game  $\mathcal{G}$  is almost-strongly non-Zeno if there exists  $\kappa > 0$  for any run  $\rho$  that starts and ends in the same region:  $\operatorname{cost}(\rho) \ge \kappa$  or  $\operatorname{cost}(\rho) = 0$ 

### Theorem ([BJM15])

The optimal cost of almost-strongly non-Zeno priced timed automata can be approximated.

[BJM15] Bouyer, Jaziri, Markey. On the Value Problem in Weighted Timed Games. CONCUR, 2015. 🐗 🛢 🕨 🐗 🚍 🕨

### Definition

A priced timed game  $\mathcal{G}$  is almost-strongly non-Zeno if there exists  $\kappa > 0$  for any run  $\rho$  that starts and ends in the same region:  $\operatorname{cost}(\rho) \ge \kappa$  or  $\operatorname{cost}(\rho) = 0$ 

### Theorem ([BJM15])

The optimal cost of almost-strongly non-Zeno priced timed automata can be approximated: for every  $\epsilon > 0$ , we can compute

• values  $v_{\epsilon}^+$  and  $v_{\epsilon}^-$  such that

$$|v_{\epsilon}^{+} - v_{\epsilon}^{-}| < \epsilon$$
  $v_{\epsilon}^{-} \leq optcost_{\mathcal{G}} \leq v_{\epsilon}^{+}$ 

• a strategy  $\sigma_{\epsilon}$  such that

$$optcost_{\mathcal{G}} \leq cost(\sigma_{\epsilon}) \leq optcost_{\mathcal{G}} + \epsilon.$$

[BJM15] Bouyer, Jaziri, Markey. On the Value Problem in Weighted Timed Games. CONCUR, 2015. 👒 🚊 🕨 🐗 🚍 🕨



• semi-unfolding of region automaton (seen as a timed game)











#### Proof

- semi-unfolding of region automaton (seen as a timed game)
- compute exact optimal cost in tree-like parts [LMM02,ABM04]



#### Proof

- semi-unfolding of region automaton (seen as a timed game)
- compute exact optimal cost in tree-like parts [LMM02,ABM04]



#### Proof

- semi-unfolding of region automaton (seen as a timed game)
- compute exact optimal cost in tree-like parts [LMM02,ABM04]



#### Proof

- semi-unfolding of region automaton (seen as a timed game)
- compute exact optimal cost in tree-like parts [LMM02,ABM04]



#### Proof

- semi-unfolding of region automaton (seen as a timed game)
- compute exact optimal cost in tree-like parts [LMM02,ABM04]
- compute approximate optimal cost in kernels



Output cost functions f

### Proof

- semi-unfolding of region automaton (seen as a timed game)
- compute exact optimal cost in tree-like parts [LMM02,ABM04]
- compute approximate optimal cost in kernels



Output cost functions f

Under- and over-approximate by piecewise constant functions  $f_{\epsilon}^{-}$  and  $f_{\epsilon}^{+}$ 



### Proof

- semi-unfolding of region automaton (seen as a timed game)
- compute exact optimal cost in tree-like parts [LMM02,ABM04]
- compute approximate optimal cost in kernels



Output cost functions f

Under- and over-approximate by piecewise constant functions  $f_{\epsilon}^{-}$  and  $f_{\epsilon}^{+}$ 



### Proof

- semi-unfolding of region automaton (seen as a timed game)
- compute exact optimal cost in tree-like parts [LMM02,ABM04]
- compute approximate optimal cost in kernels



Output cost functions f

Under- and over-approximate by piecewise constant functions  $f_{\epsilon}^{-}$  and  $f_{\epsilon}^{+}$ 



 $\rightsquigarrow$  reachability timed game in small regions

### Proof

- semi-unfolding of region automaton (seen as a timed game)
- compute exact optimal cost in tree-like parts [LMM02,ABM04]
- compute approximate optimal cost in kernels



Output cost functions f

Under- and over-approximate by piecewise constant functions  $f_{\epsilon}^{-}$  and  $f_{\epsilon}^{+}$ 



 $\rightsquigarrow$  reachability timed game in small regions

### Outline of the talk

Introduction: timed automata and timed games

Measuring extra quantities in timed automata
Example: task graph scheduling
Timed automata with observer variables

#### 3 Cost-optimal strategies

- Optimal reachability in priced timed automata
- Optimal reachability in priced timed games

### 4 Conclusions and future works

#### 5 Advertisements

### Conclusions and future directions

### Priced timed automata and games

- convenient for modelling resources;
- 1-player setting remains tractable (sort of);
- 2-player setting undecidable, but approximable.
- approximation algorithms are a convenient trade-off.

## Conclusions and future directions

### Priced timed automata and games

- convenient for modelling resources;
- 1-player setting remains tractable (sort of);
- 2-player setting undecidable, but approximable.
- approximation algorithms are a convenient trade-off.

#### Future work

- improve approximation technique (in terms of complexity);
- extend results to whole class of priced timed games;
- average energy and energy constraints;
- robust analysis of priced timed games;
- develop a tool.

### Advertisements

### **MOVEP 2016**

- 12th Summer School MOVEP
- Genoa, Italy
- 27 June 1 July



### Advertisements

### **MOVEP 2016**

- 12th Summer School MOVEP
- Genoa, Italy
- 27 June 1 July



### FORMATS 2016



- 14th Int. Conf. FORMATS
- colocated with CONCUR and QEST
- Quebec City, Canada
- 25-27 August (tentative)