# Optimal strategies in weighted timed games: undecidability and approximation 

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(joint work with Patricia Bouyer and Samy Jaziri)

68 NQRT seminar - Rennes, France

October 1, 2015

## Model checking and synthesis



## Model checking and synthesis



## Reasoning about real-time systems

Example (A computer mouse)


## Reasoning about real-time systems

## Definition ([AD90])

A timed automaton is made of

- a transition system,

Example (A computer mouse)


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## Definition ([AD90])

A timed automaton is made of

- a transition system,
- a set of clocks,


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## Reasoning about real-time systems

## 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)


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

## Continuous-time semantics

Example



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Theorem ([AD90,ACD93, ...])
Reachability in timed automata is decidable (as well as many other important properties).
[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



## Region automaton



## Timed games

## Definition

A timed game is made of

- a timed automaton;


## Example



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A timed game is made of

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


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## Example



$$
\begin{aligned}
& \text { a memoryless strategy } \\
& \text { in }\left(\ell_{0}, x=0\right): \text { wait } 0.5 \\
& \quad \text { goto } \ell_{1} \\
& \text { in }\left(\ell_{1}, x\right): \text { wait until } x=2 \\
& \\
& \text { goto } \odot \\
& \text { in }\left(\ell_{2}, x \leq 1\right): \\
& \text { wait until } x=1 \\
& \text { in }\left(\ell_{3}, x \leq 1\right): \\
& \quad \begin{array}{l}
\text { wait } \ell_{3} \\
\\
\text { goto } \ell_{1}
\end{array}
\end{aligned}
$$

## Timed games

## Theorem ([AMPS98])

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


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- regions are sufficient;
- the computation terminates.


## Outline of the talk

(1) Introduction: timed automata and timed games
(2) 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


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## Example: task graph scheduling

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


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P_{2} \text { (slow): }
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## Example: task graph scheduling

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

| time |  |
| :---: | :---: |
| $+$ | 2 picoseconds |
| $\times$ | 3 picoseconds |
| energy |  |
| idle | 10 Watt |
| in use | 90 Watts |

$$
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## Priced timed automata

## Definition ([KPSY99,ALP01,BFH $\left.{ }^{+} 01\right]$ )

A priced timed automaton is made of

- a timed automaton;


## Example


[KPSY99] Kesten, Pnueli, Sifakis, Yovine. Decidable Integration Graphs. Inf. \& Comp., 1999.
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## Modelling the task graph scheduling problem

## Processors:



Modelling the task graph scheduling problem

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Modelling the task graph scheduling problem

## Processors:



Tasks:


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- Optimal reachability in priced timed games

4. Conclusions and future works

## Cost-optimal reachability in priced timed automata

Example


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Minimal cost for reaching © :

## Cost-optimal reachability in priced timed automata

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Minimal cost for reaching ©:

$$
5 t+6(3-t)+1
$$



## Cost-optimal reachability in priced timed automata

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Minimal cost for reaching ©:

$$
\begin{aligned}
& 5 t+6(3-t)+1 \\
& 5 t+3(3-t)+9
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$$



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\inf _{0 \leq t \leq 2} \min \binom{5 t+6(3-t)+1}{5 t+3(3-t)+9}
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\inf _{0 \leq t \leq 2} \min \binom{5 t+6(3-t)+1}{5 t+3(3-t)+9}=17
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The optimal schedule consists in

- waiting 2 time units in ;
- going through



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Theorem ([BBBR07])
Optimal reachability in priced timed automata is PSPACE-complete.

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- Regions are not precise enough;



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Minimize

$$
\sum_{i} c_{i} \cdot t_{i}+C_{\mathrm{disc}}
$$



$$
\begin{aligned}
& t_{1}+t_{2} \leq 2 \\
& t_{2}+t_{3}+t_{4} \geq 3
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$\sim$ infimum over bounded zone reached at a point on the frontier, with integer coordinates.

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\forall \pi . \exists \pi_{c p} . \operatorname{cost}\left(\pi_{c p}\right) \leq \operatorname{cost}(\pi)
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$$

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

$$
\forall \pi_{c p} . \exists \pi . \operatorname{cost}(\pi) \leq \operatorname{cost}\left(\pi_{c p}\right)+\epsilon
$$

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## Cost-optimal reachability in priced timed games

Using games to model uncertainty over delays
Processors with exact delays:


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Using games to model uncertainty over delays

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Processors with approximate delays:


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$$
\inf _{0 \leq t \leq 2} \max \binom{5 t+6(3-t)+1}{5 t+3(3-t)+9}=18.66
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$$
\begin{aligned}
\inf _{0 \leq t \leq 2} \max \binom{5 t+6(3-t)+1}{5 t+3(3-t)+9} & =18.66 \\
\left(\text { with } t_{\mathrm{opt}}\right. & \left.=\frac{1}{3}\right)
\end{aligned}
$$



## Looking for optimal strategies...

Optimal strategies need not exist...


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Optimal strategies need not exist...


Optimal strategies may need memory...


## Cost-optimal reachability in priced timed games

## Theorem ([BBR05,BBM06])

Optimal reachability in priced timed games is undecidable.
[BBR05] Brihaye, Bruyère, Raskin. On optimal timed strategies. FORMATS, 2005.
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## Cost-optimal reachability in priced timed games

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

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

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- add $1-x$ to the accumulated cost
- check that $y=2 x$
- divide clock $x$ by 2
$\sim$ We can use the following encoding:

$$
x_{1}=\frac{1}{2^{c_{1}}} \quad x_{2}=\frac{1}{2^{c_{2}}}
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reach terminal location with total weight at most 3
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Optimal cost in a priced timed game:

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\text { optcost }_{\mathcal{G}}=\inf \{\operatorname{cost}(\sigma) \mid \sigma \text { winning strategy in } \mathcal{G}\}
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Optimal cost in a priced timed game:

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

## Undecidability of the value problem

Trying to reuse the previous reduction...


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

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Adapting the previous reduction...


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exit nodes: cost $3+\frac{1}{2^{n}}$
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Adapting the previous reduction...

- if $\mathcal{M}$ does not halt:

Player 1 simulates correctly until $2^{n}>\frac{1}{\epsilon}$.
$\sim \operatorname{cost}(\sigma) \leq 3+\epsilon$

exit nodes: cost $3+\frac{1}{2^{n}}$ ( $n=$ length of path $)$

## Undecidability of the value problem

Adapting the previous reduction...

- if $\mathcal{M}$ does not halt:

Player 1 simulates correctly until $2^{n}>\frac{1}{\epsilon}$. $\sim \operatorname{cost}(\sigma) \leq 3+\epsilon$

- if $\mathcal{M}$ halts:
correct simulation for finite duration.
$\leadsto \operatorname{cost}(\sigma) \geq 3+\alpha_{\mathcal{M}}$ for all $\sigma$

exit nodes: cost $3+\frac{1}{2^{n}}$ ( $n=$ length of path $)$


## Undecidability of the value problem

Theorem ([BJM15])
The value problem is undecidable in priced timed games.

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## Remark

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

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


## Approximation of the optimal cost

## 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:

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\operatorname{cost}(\rho) \geq \kappa \quad \text { or } \quad \operatorname{cost}(\rho)=0
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## 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

$$
\left|v_{\epsilon}^{+}-v_{\epsilon}^{-}\right|<\epsilon \quad v_{\epsilon}^{-} \leq o p t \cos t_{\mathcal{G}} \leq v_{\epsilon}^{+}
$$

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

$$
\operatorname{optcost}_{\mathcal{G}} \leq \operatorname{cost}\left(\sigma_{\epsilon}\right) \leq \text { optcost }_{\mathcal{G}}+\epsilon
$$

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Hypothesis:

$$
\begin{gathered}
\text { cost }>0 \\
\downarrow \\
\operatorname{cost} \geq \kappa
\end{gathered}
$$

$\sim$ bounded depth

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Output cost functions $f$

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


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## Outline of the talk

(1) Introduction: timed automata and timed games
(2) 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


## 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.


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## 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.

