

# Quantitative Analysis: Examples, Applications, Generalities

Uli Fahrenberg

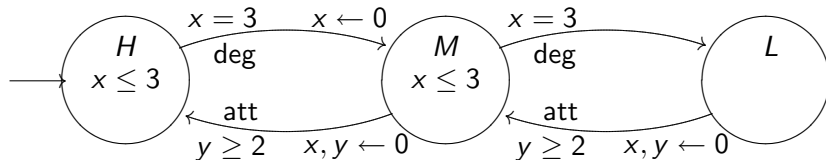
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IST 2010



- 1 Priced timed automata
- 2 Discount-optimal infinite runs
- 3 Additivity of discounting
- 4 Infinite runs with energy constraints
- 5 Quantitative analysis
- 6 Acknowledgment

# Priced timed automata

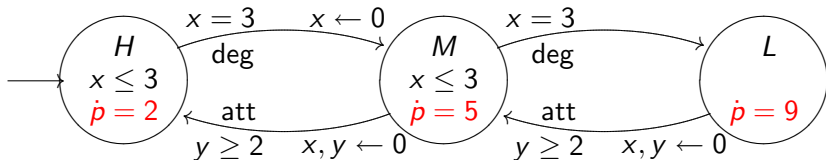


- Timed automaton:

- Finite automaton

- + finite set of clocks  $C = \{x, y, \dots\}$
  - + location invariants
  - + edge constraints
  - + edge resets

# Priced timed automata



- Timed automaton:

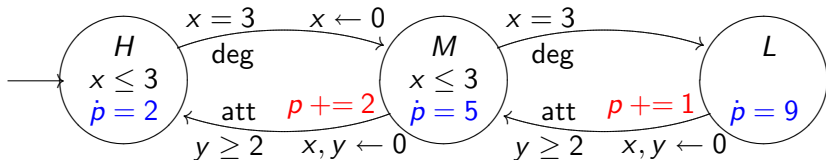
- Finite automaton

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- Priced timed automaton:

- + price rates in locations (cost per time unit)

# Priced timed automata



- **Timed automaton:**

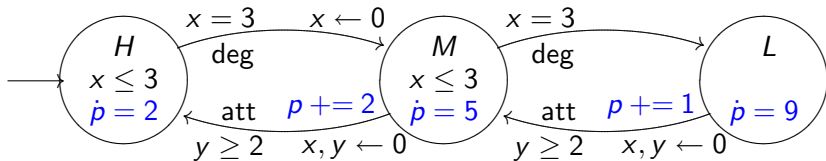
- Finite automaton

- + finite set of clocks  $C = \{x, y, \dots\}$
  - + location invariants
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- **Priced** timed automaton:

- + price rates in locations (cost per time unit)
  - + price updates on transitions

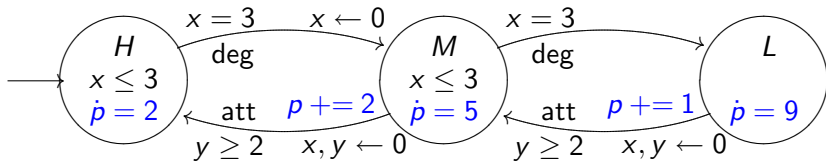
# Cheapest infinite runs



Problem: Find cheapest infinite run

- (Motivation: Production plant with High, Medium and Low productivity mode)

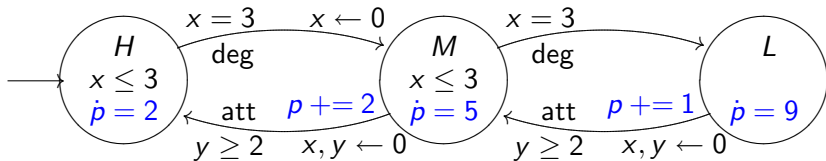
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# Cheapest infinite runs

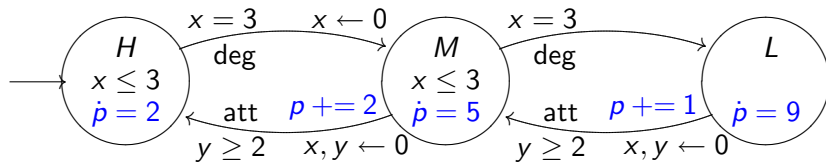


Problem: Find cheapest infinite run

- (Motivation: Production plant with High, Medium and Low productivity mode)
- What is the price of an infinite run?
  - Well,  $\infty$  !
- Use mean-payoff
- Or, **discounting**



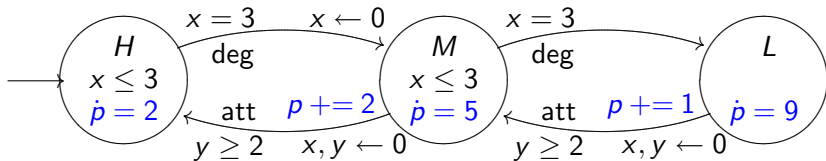
# Cheapest infinite runs



An example (finite) run:

loc.	H	d	H	s	M	d	M	s	L	d	L	s	M	d	M	s	H
$x$	0		3		0		3		3		4		0		2		0
$y$	0		3		3		6		6		7		0		2		0
$t$	0		3		3		6		6		7		7		9		9

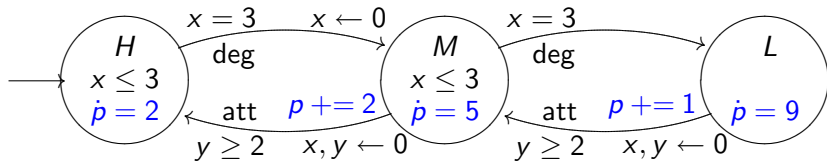
# Cheapest infinite runs



An example (finite) run:

loc.	H	d	H	s	M	d	M	s	L	d	L	s	M	d	M
x	0		3		0		3		3		4		0		2
y	0		3		3		6		6		7		0		2
t	0		3		3		6		6		7		7		9
	$2 \int_0^3 \lambda^t dt$		0	$5 \int_3^6 \lambda^t dt$		0	$9 \int_6^7 \lambda^t dt$		$1\lambda^7$	$5 \int_7^9 \lambda^t dt$					

# Cheapest infinite runs



An example (finite) run:

loc.	H	d	H	s	M	d	M	s	L	d	L	s	M	d	M	s	H
x	0		3		0		3		3		4		0		2		0
y	0		3		3		6		6		7		0		2		0
t	0		3		3		6		6		7		7		9		9
$\lambda = .9$		5.14		0		9.38		0		4.54	.48		4.31		.77		

- Total discounted price of run: **24.62**
- Total discounted price of infinite loop: **40.2**

# Discounted price

Formally: Let  $A$  be a **priced timed transition system** and  $\lambda \in [0, 1]$ .

- Discounted price of *finite* alternating path

$$\pi = s_0 \xrightarrow{t_0} s'_0 \rightarrow s_1 \rightarrow \cdots \xrightarrow{t_{n-1}} s'_{n-1} \rightarrow s_n :$$

$$P(\pi) = \sum_{i=0}^{n-1} \left( \int_{T_{i-1}}^{T_i} \lambda^t r(s_i^t) dt + \lambda^{T_i} p(s'_i \rightarrow s_{i+1}) \right)$$

with  $T_i = \sum_{j=0}^i t_j$ .

- Discounted price of *infinite* alternating path

$$\pi = s_0 \xrightarrow{t_0} s'_0 \rightarrow s_1 \rightarrow \cdots : \text{limit}$$

$$P(\pi) = \lim_{n \rightarrow \infty} P(s_0 \rightarrow s'_0 \rightarrow \cdots \rightarrow s'_{n-1} \rightarrow s_n)$$

provided that it exists. (!)

# Problem and solution

## Problem:

- Given: priced timed transition system  $A$ , state  $s \in A$
- Find: an infinite path from  $s$  with **lowest discounted price**
- (or one that comes arbitrarily close)

## Solution:

- For priced timed automata
- with non-negative price rates and updates,
- which are *bounded*
- and *time-divergent*,
- and *rational*  $\lambda$ ,
- starting with an *integer valuation*,
- our problem is **computable**

# Proof structure

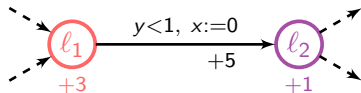
Given priced timed automaton  $A$ :

- 1 Use **corner point abstraction** to construct *finite weighted graph*  $\text{cp}(A)$
- 2 Find infinite path  $\tilde{\pi}$  with lowest discounted price in  $\text{cp}(A)$  using **linear programming**
- 3 Find cheapest path lying over  $\tilde{\pi}$  in  $A$

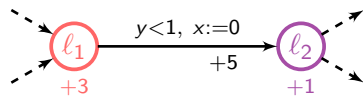
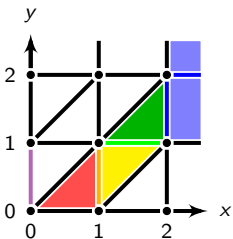
**This needs** a soundness and completeness result:

- Given an infinite path  $\tilde{\pi}$  in  $\text{cp}(A)$  for which  $P(\tilde{\pi})$  converges, then for all  $\varepsilon > 0$  there exists an infinite path  $\pi \in \text{cp}^{-1}(\tilde{\pi})$  for which  $|P(\pi) - P(\tilde{\pi})| < \varepsilon$ .
- Given an infinite path  $\pi$  in  $A$ , there exists an infinite path  $\tilde{\pi} \in \text{cp}(\pi)$  for which  $P(\tilde{\pi}) \leq P(\pi)$ .

# Corner point abstraction

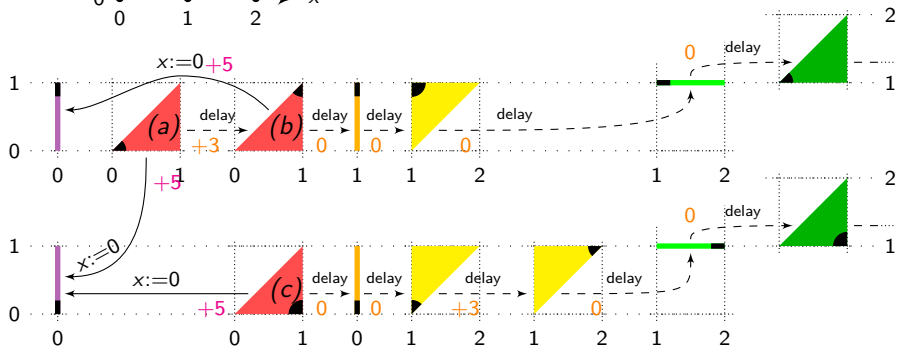
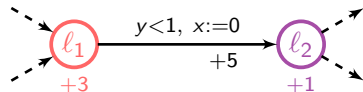
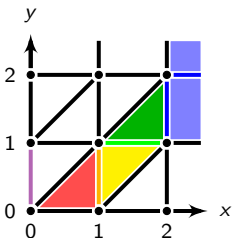


# Corner point abstraction





# Corner point abstraction



## Proof details

(skip)

Given an infinite path  $\pi$  in  $A$ , there exists an infinite path  $\tilde{\pi} \in \text{cp}(\pi)$  for which  $P(\tilde{\pi}) \leq P(\pi)$ .

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Write  $\pi = (q_0, \nu_0) \rightarrow (q_0, \nu_0 + t_0) \xrightarrow{p_0} (q_1, \nu_1) \rightarrow (q_1, \nu_1 + t_1) \xrightarrow{p_1} \dots$

Then

$$\begin{aligned} P(\pi) &= \sum_{i=0}^{\infty} \left( \int_{T_{i-1}}^{T_i} \lambda^t r(q_i) dt + \lambda^{T_i} p_i \right) \\ &= \sum_{i=0}^{\infty} \left( \frac{1}{\ln \lambda} r(q_i) (\lambda^{T_i} - \lambda^{T_{i-1}}) + p_i \lambda^{T_i} \right) \end{aligned}$$

– a function in variables  $T_0, T_1, \dots$

⇒ **Optimization problem:** Minimize  $P(\pi) = f(T_0, T_1, \dots)$  under the constraint that  $T_0, T_1, \dots$  lie in a specific zone defined by  $\pi$  above.

## Proof details, 2.

(skip)

$$P(\pi) = f(T_0, T_1, \dots) = \sum_{i=0}^{\infty} \left( \frac{1}{\ln \lambda} r(q_i) (\lambda^{T_i} - \lambda^{T_{i-1}}) + p_i \lambda^{T_i} \right)$$

**Task:** Minimize  $f(T_0, T_1, \dots)$  under the constraint that  $(T_0, T_1, \dots) \in Z$  for a given (bounded, closed) zone  $Z$ .

- 
- (can be shown that)  $f$  is (weakly) monotonic
  - easy to see: monotonic functions over *finite-dimensional* closed zones attain their minimum in a *corner point*
  - ⇒ for *finite paths*, the corner point abstraction can “see” the path with lowest price (because it goes through corners) ⇒ done
  - **Need:** Generalization of the above to **infinite-dimensional** zones
  - not easy, because infinite-dimensional zones are **not compact**
  - difficult part: show that infimum is attained **somewhere**

## Proof details, 3.

(skip)

**Theorem:**  $Z \subseteq \mathbb{R}^\infty$  bounded and closed (in the supremum metric)

- $f_1, f_2, \dots$  continuous functions  $p r_i Z \rightarrow \mathbb{R}_{\geq 0}$  (*non-negative values!*)
- $f(x_1, x_2, \dots) = \sum_{i=1}^{\infty} f_i(x_i) : Z \rightarrow [0, \infty]$  converges for some  $x \in Z$   
 $\Rightarrow$  exists  $z \in Z$  for which  $f(z) = \inf_{y \in Z} f(y)$

**Proof:** Let  $x : \mathbb{N} \rightarrow Z$  be a sequence for which  $\lim f(x_i) = \inf_{y \in Z} f(y)$

Standard argument:  $Z$  is compact  $\Rightarrow x$  contains converging subsequence  $x' \Rightarrow$  let  $z = \lim x' \Rightarrow$  done.

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But  $Z$  is not compact.

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$x = \quad x_1 \quad x_2 \quad x_3 \quad x_4 \quad x_5 \quad x_6 \quad x_7 \quad x_8 \quad x_9$

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$x =$     •    •    •    •    •    •    •    •    •    •    •    •    •



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$x =$

The diagram shows a grid of 13 columns and 8 rows of black dots. The first column is labeled 'x ='. The dots are arranged in a regular grid pattern, representing the sequence x.

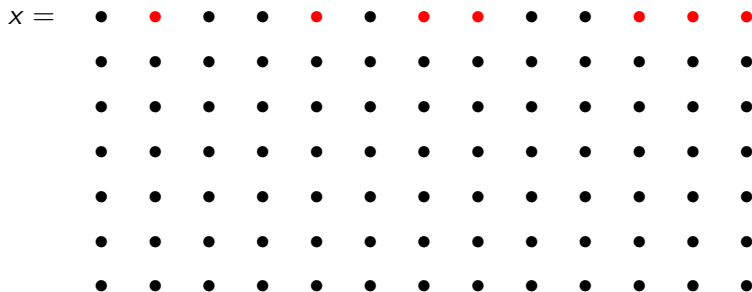
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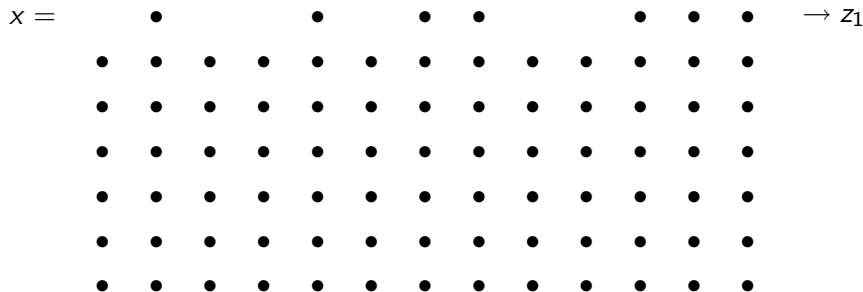
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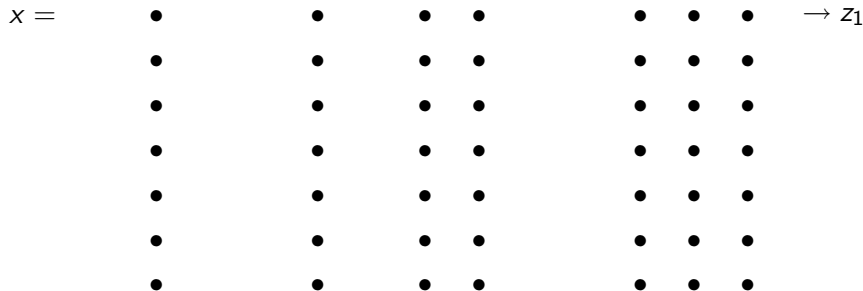
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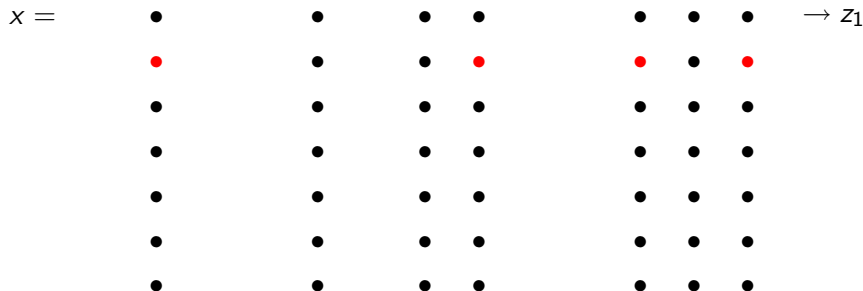
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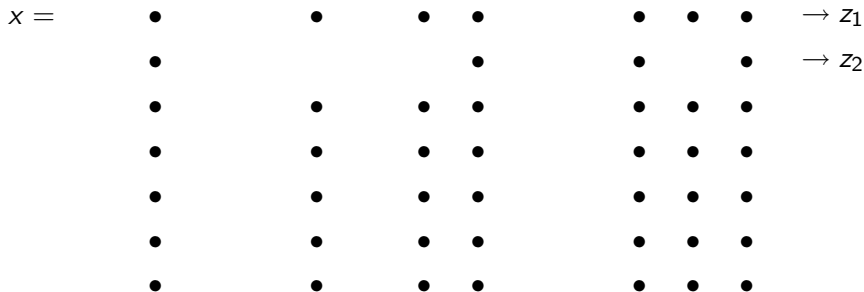
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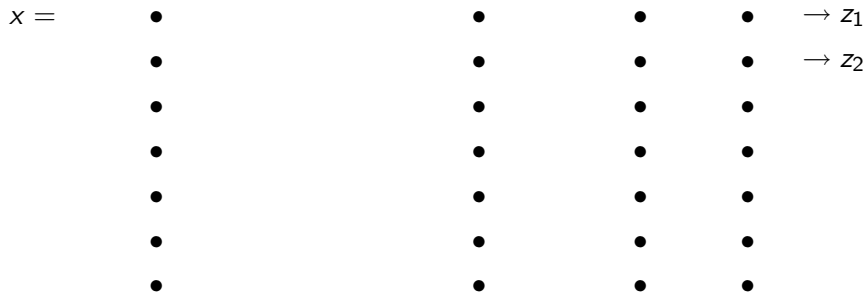
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- $\Rightarrow$  exists  $z \in Z$  for which  $f(z) = \inf_{y \in Z} f(y)$

**Corollary:**  $Z \subseteq \mathbb{R}^\infty$  bounded and closed **zone**

- $f_1, f_2, \dots$  **monotonous** continuous functions  $\text{pr}_i : Z \rightarrow \mathbb{R}_{\geq 0}$
  - $f(x_1, x_2, \dots) = \sum_{i=1}^{\infty} f_i(x_i) : Z \rightarrow [0, \infty]$  converges for some  $x \in Z$
- $\Rightarrow$  exists **corner point**  $z$  of  $Z$  for which  $f(z) = \inf_{y \in Z} f(y)$

**So** corner point abstraction *can* see the path with lowest price  $\Rightarrow$  done



# Summary

- The discount-optimal infinite path problem is **computable for priced timed automata**
  - (with arbitrarily many clocks)
  - (under certain restrictions; only “real” restriction: time divergence)
  - Uses generalization of a well-known fact about monotonous functions defined on zones, to **infinite zones**
  - (Other applications?)
- 

- Computable **yes**, feasible **NO**
- (The corner point abstraction is HUGE, and the Linear Programming problem to solve is also HUGE)
- For zone-based iterative computations: need some **fixed-point property / additivity**

# Additivity

- For  $\rightarrow$  a switch and  $\pi$  a path out of the target of the switch:

$$P(\rightarrow \circ \pi) = p(\rightarrow) + P(\pi)$$

For  $\xrightarrow{t}$  a delay and  $\pi$  a path out of the end state of the delay:

$$P(\xrightarrow{t} \circ \pi) = p(\xrightarrow{t}) + \lambda^t P(\pi)$$

- Similar property not satisfied for other formalisms (e.g. mean-payoff, or discounting by discrete steps)
- Question: What do we know about the cost function if we require

$$P(\xrightarrow{t} \circ \pi) = p(\xrightarrow{t}) + g(t)P(\pi)$$

- (Natural property also because of **additivity of delays** !)
- Answer: **Everything!**

# Additivity

**Theorem:** If  $P$  is an accumulated price function in a PTA which satisfies

$$P(s \xrightarrow{t_1} s' \xrightarrow{t_2} s'') = P(s \xrightarrow{t_1} s') + g(t_1) P(s' \xrightarrow{t_2} s'')$$

for all states and delays, then

$$g(t) = \lambda^t \quad \text{and} \quad P(s \xrightarrow{t} s') = \alpha(s) \int_0^t \lambda^t dt$$

for some  $\lambda \in \mathbb{R}_{\geq 0}$  and  $\alpha : S \rightarrow \mathbb{R}$ .

**Reason:** The functional equation

$$f(t_1 + t_2) = f(t_1) + g(t_1) f(t_2)$$

has essentially only one solution.

**Proof:** Just do like Cauchy in 1821 !

(or skip)

## Proof

(skip)

**Proof:** We need to solve the functional equation

$$f(x + y) = f(x) + g(x)f(y)$$

and we find inspiration in **Cauchy's 1821** textbook *Cours d'analyse*:

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and we find inspiration in **Cauchy's 1821** textbook *Cours d'analyse*:

- By induction:

$$f(kx) = f((k-1)x) + g((k-1)x)f(x) = f(x) \left( \sum_{i=0}^{k-1} g(ix) \right)$$

$$f(kx) = f(x) + g(x)f((k-1)x) = f(x) \left( \sum_{i=0}^{k-1} (g(x))^i \right)$$

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- Put  $\lambda = g(1)$ , then  $g(n) = \lambda^n$ . Also,  $g(n) = g(k \frac{n}{k}) = g(\frac{n}{k})^k$  hence  $g(\frac{n}{k}) = \lambda^{\frac{n}{k}}$ . By continuity,  $g(x) = \lambda^x$

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- Put  $\beta = f(1)$ , then  $f(n) = \beta \cdot \sum_{i=1}^{n-1} \lambda^i = \beta \frac{1-\lambda^n}{1-\lambda}$  *etc.*



# Summary

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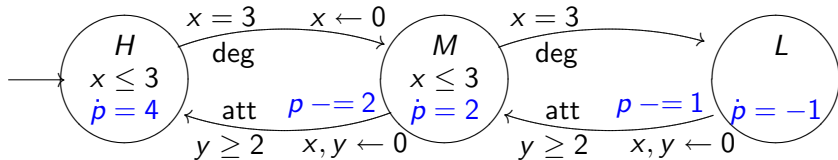
With time-based discounting, you get

- computability of cheapest infinite runs in non-negatively priced timed automata,
- a nice additivity property,
- feasible zone-based algorithms ?

And additivity you can **only** have for time-based discounting.

- Is additivity necessary and / or sufficient for a zone-based approximation algorithm ?

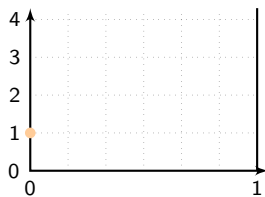
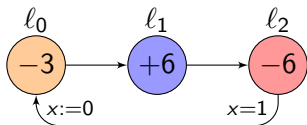
# Infinite runs with energy constraints



New problem: Given some initial value of  $p$ , **does there exist an infinite run in which  $p$  always is  $\geq 0$ ?**

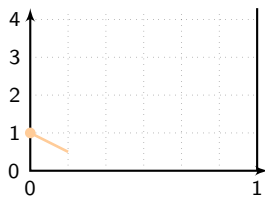
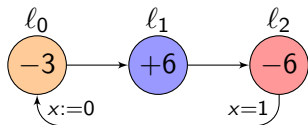
- (Same motivation as before)
- No discounting this time
- (Can we introduce discounting here ?)

# Another example



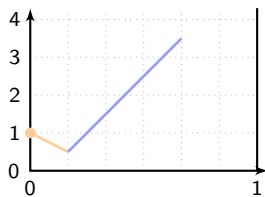
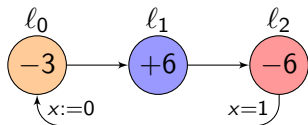
lower-bound problem

# Another example



lower-bound problem

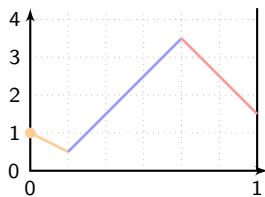
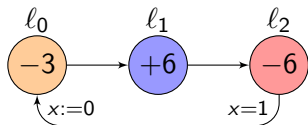
# Another example



lower-bound problem

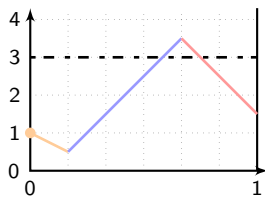
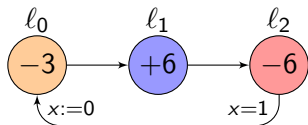


# Another example

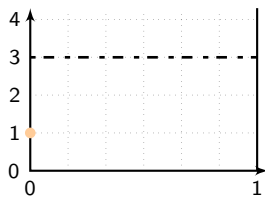
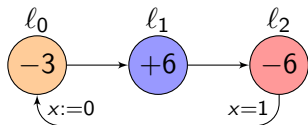


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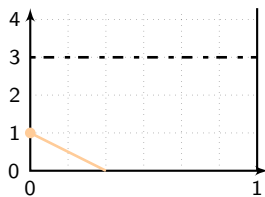
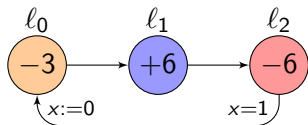


# Another example



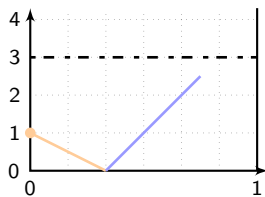
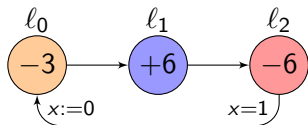
lower-upper-bound problem

# Another example



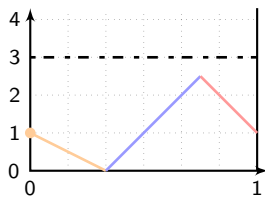
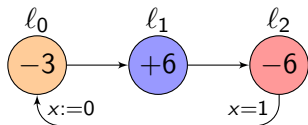
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# Another example



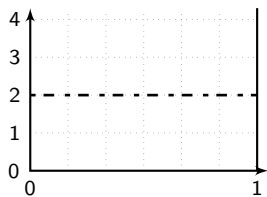
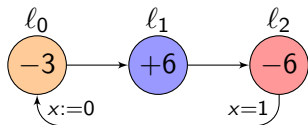
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# Another example



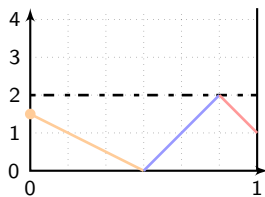
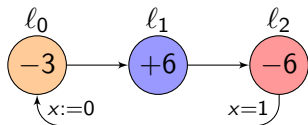
lower-upper-bound problem

# Another example



lower-upper-bound problem

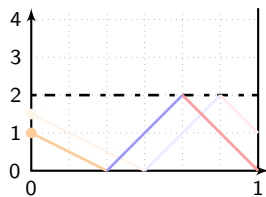
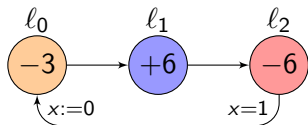
# Another example



lower-upper-bound problem

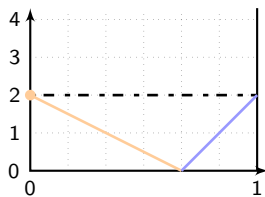
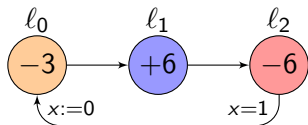


# Another example



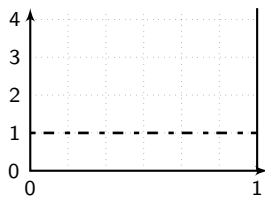
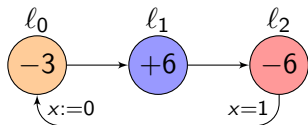
lower-upper-bound problem

# Another example



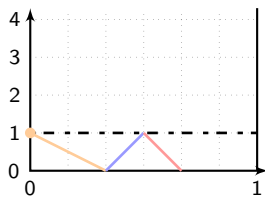
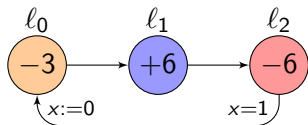
lower-upper-bound problem

# Another example



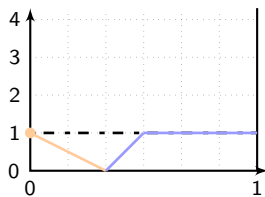
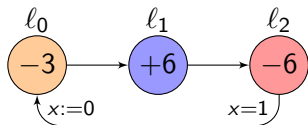
lower-upper-bound problem

# Another example



lower-upper-bound problem

# Another example



lower-weak-upper-bound problem

# Problems and solutions

## Problems:

- Given: priced transition system  $A$ , state  $s \in A$ , initial credit  $p$
- Find: an infinite path from  $s$  with initial credit  $p$  in which the accumulated credit
  - (L) never goes below 0, or
  - (L+W) never goes below 0, under restricted capacity, or
  - (L+U) always stays within interval bounds  $[0, u]$
- (or one that comes arbitrarily close)
- Also: Does the above hold **for all** infinite paths from  $s$  ?
- And can we solve **games** ?

## Solutions:

- For finite priced transition systems: almost completely solved
- For 1-clock priced timed automata: some results
- For priced timed automata with 2 clocks: open
- For  $\geq 3$  clocks: probably all undecidable

# Results for the untimed case

	<b>exist. problem</b>	<b>univ. problem</b>	<b>games</b>
L	$\in P$	$\in P$	$\in UP \cap \text{coUP}$ P-hard
L+W	$\in P$	$\in P$	$\in NP \cap \text{coNP}$ P-hard
L+U	$\in PSPACE$ NP-hard	$\in P$	EXPTIME-c.

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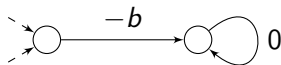
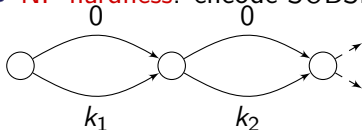
- Bellman-Ford algorithm



# Results for the untimed case

	exist. problem	univ. problem	games
L	$\in P$	$\in P$	$\in UP \cap \text{coUP}$ P-hard
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L+U	$\in PSPACE$ NP-hard	$\in P$	EXPTIME-c.

- **PSPACE**: guess an infinite path in the configuration graph
- **NP-hardness**: encode SUBSET-SUM:



# Results for the untimed case

	exist. problem	univ. problem	games
L	$\in P$	$\in P$	$\in UP \cap \text{coUP}$ P-hard
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- **EXPTIME**: play the game in the configuration graph
- **EXPTIME-hardness**: encode COUNTDOWN-GAME

# Results for the untimed case

	<b>exist. problem</b>	<b>univ. problem</b>	<b>games</b>
L	$\in P$	$\in P$	$\in UP \cap \text{coUP}$ P-hard
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L+U	$\in PSPACE$ NP-hard	$\in P$	EXPTIME-c.

- Mean-payoff games
- (See also recent work by Raskin-Doyen-Henzinger)

# Results for the 1-clock case (without discrete updates !)

	<b>exist. problem</b>	<b>univ. problem</b>	<b>games</b>
L	$\in P$	$\in P$	?
L+W	$\in P$	$\in P$	?
L+U	?	?	undecidable

# Results for the 1-clock case (without discrete updates !)

	<b>exist. problem</b>	<b>univ. problem</b>	<b>games</b>
L	$\in P$	$\in P$	?
L+W	$\in P$	$\in P$	?
L+U	?	?	undecidable

- corner-point abstraction

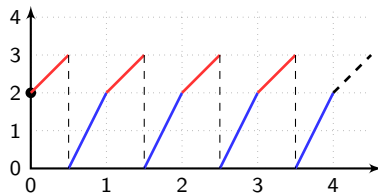
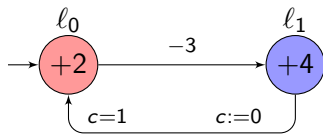
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L+U	?	?	undecidable

- two-counter machines

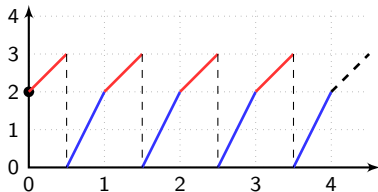
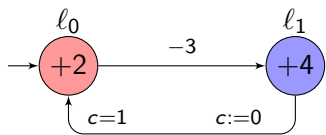
# Extensions

- For 1-clock PTA with discrete updates, the corner point abstraction is not complete:

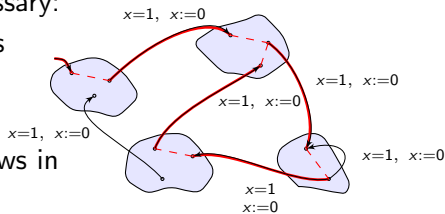


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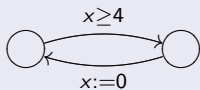
- Completely different approach necessary:
  - Optimize along reset-free paths
  - Compute “energy automaton” abstraction
- Extends also to exponential price laws in locations:  $\dot{p} = k p$  instead of  $\dot{p} = k$
- “Hybridization” ?





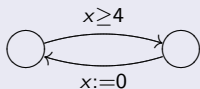
# Quantitative Analysis

## Quantitative Models



# Quantitative Quantitative Analysis

## Quantitative Models

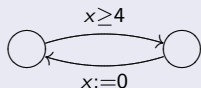


## Quantitative Logics

$$\Pr_{\leq .1}(\diamond error)$$

# Quantitative Quantitative Quantitative Analysis

## Quantitative Models



## Quantitative Logics

$$\Pr_{\leq .1}(\diamond error)$$

## Quantitative Verification

$$\llbracket \varphi \rrbracket (s) = 3.14$$

### Boolean world

Trace equivalence  $\equiv$

Bisimilarity  $\sim$

$s \sim t$  implies  $s \equiv t$

$s \models \varphi$  or  $s \not\models \varphi$

$s \sim t$  iff  $\forall \varphi : s \models \varphi \Leftrightarrow t \models \varphi$

### “Quantification”

Linear distance  $d_L$

Branching distance  $d_B$

$d_L(s, t) \leq d_B(s, t)$

$\llbracket \varphi \rrbracket (s)$  is a quantity

$d_B(s, t) = \sup_{\varphi} d(\llbracket \varphi \rrbracket (s), \llbracket \varphi \rrbracket (t))$

# Weighted automata and traces

## Definition

A **weighted automaton**: states  $S$ , transitions  $T \subseteq S \times \mathbb{R} \times S$

(Yes, we can deal with more general weights than  $\mathbb{R}$ . Also: labels.)

## Definition

A **trace** is an infinite sequence of weights.

## Definition: Trace distances

(values in  $\mathbb{R} \cup \{\infty\}$ )

**point-wise**

$$d_L^\bullet(\sigma, \tau) = \sup_i \lambda^i |\sigma_i - \tau_i|$$

**accumulating**

$$d_L^+(\sigma, \tau) = \sum_i \lambda^i |\sigma_i - \tau_i|$$

$\lambda \in [0, 1]$  is a fixed **discounting factor**.

(Yes, there are other interesting trace distances.)

# Linear distance

Linear distance between states: use **Hausdorff distance**:

## Definition

$$d_L^{\bullet}(s, t) = \sup \begin{cases} \sup_{\sigma \in \text{Tr}(s)} \inf_{\tau \in \text{Tr}(t)} d_L^{\bullet}(\sigma, \tau) \\ \sup_{\tau \in \text{Tr}(t)} \inf_{\sigma \in \text{Tr}(s)} d_L^{\bullet}(\sigma, \tau) \end{cases}$$

## Lemma

$$d_L^{\bullet}(s, t) \leq \sup \begin{cases} \sup_{s \xrightarrow{x} s'} \inf_{t \xrightarrow{y} t'} \max(|x - y|, \lambda d_L^{\bullet}(s', t')) \\ \sup_{t \xrightarrow{y} t'} \inf_{s \xrightarrow{x} s'} \max(|x - y|, \lambda d_L^{\bullet}(s', t')) \end{cases}$$

and similarly for  $d_L^+$

# Branching distances

Definition: Branching distances are minimal fixed points

$$d_B^\bullet(s, t) = \sup \begin{cases} \sup_{s \xrightarrow{x} s'} \inf_{t \xrightarrow{y} t'} \max(|x - y|, \lambda d_B^\bullet(s', t')) \\ \sup_{t \xrightarrow{y} t'} \inf_{s \xrightarrow{x} s'} \max(|x - y|, \lambda d_B^\bullet(s', t')) \end{cases}$$

$$d_B^+(s, t) = \sup \begin{cases} \sup_{s \xrightarrow{x} s'} \inf_{t \xrightarrow{y} t'} |x - y| + \lambda d_B^+(s', t') \\ \sup_{t \xrightarrow{y} t'} \inf_{s \xrightarrow{x} s'} |x - y| + \lambda d_B^+(s', t') \end{cases}$$

Theorem

$$d_L(s, t) \leq d_B(s, t)$$

# Metric properties

- $d_L^\bullet$  and  $d_B^\bullet$  are **topologically inequivalent**
- Likewise,  $d_L^+$  and  $d_B^+$  are **topologically inequivalent**
- For  $\lambda = 1$ ,
  - $d_L^\bullet$  and  $d_L^+$  are **topologically inequivalent**
  - and so are  $d_B^\bullet$  and  $d_B^+$
- For  $\lambda < 1$ ,
  - $d_L^\bullet$  and  $d_L^+$  are **Lipschitz equivalent**
  - and so are  $d_B^\bullet$  and  $d_B^+$

# Logical characterization

For both point-wise and accumulating branching distance, there is an adequate logical characterization using weighted CTL (with two different semantics).



# Where to go from here?

- Other interesting distances: e.g. **maximum-lead distance** (Henzinger-Majumdar-Prabhu)

$$d_L^\pm(\sigma, \tau) = \sup_i \lambda^i \left| \sum_{j=0}^i \sigma_j - \sum_{j=0}^i \tau_j \right|$$

Corresponding branching distance ✓

- General picture: Linear distances are easy to define, branching distances are easy to compute
- General framework for linear distances on  $\mathbb{K}$ -weighted automata (for a semiring  $\mathbb{K}$ ) and general recipe for how to go from linear to branching distances

# Co-workers



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Cachan



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Cachan



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Aalborg



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