

# Discounting in Time



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## One-slide summary (tongue in cheek!)

In formalisms with both  
**time** and  
**weights**,  
there is  
only **one** way  
to define total cost of infinite runs.

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In particular, those people did it **the wrong way**:



And **economists** have been doing it **right** for 100s of years.

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- 2 Weighted timed transition systems
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# Motivation

## The big picture: Optimal infinite scheduling

- Control for factory to achieve highest output



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- Control for factory to achieve highest output
- Control for car to achieve energy efficiency

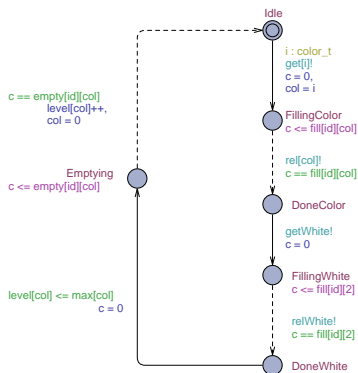




# Motivation

## The big picture: Optimal infinite scheduling

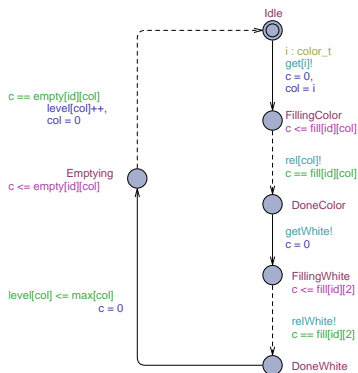
- Control for factory to achieve highest output
- Control for car to achieve energy efficiency
- *etc.*
- Weighted timed automata; weighted timed games; weighted time Petri nets
- UPPAAL; PHAVer; MATLAB<sup>®</sup> Simulink<sup>®</sup>; *etc.*



# Motivation

## The big picture: Optimal infinite scheduling

- Control for factory to achieve highest output
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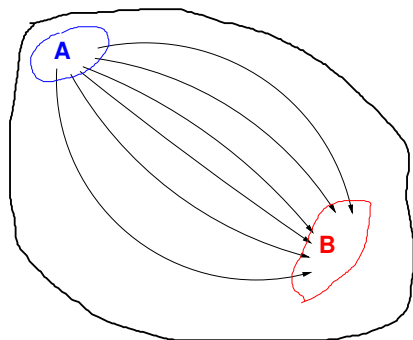


Underlying semantic model: **Weighted timed transition systems**

# Motivation

Optimal **finite** scheduling:

- optimal reachability problem
- not difficult to solve for weighted timed automata
- tool support in UPPAAL



*Find cheapest way from A to B*

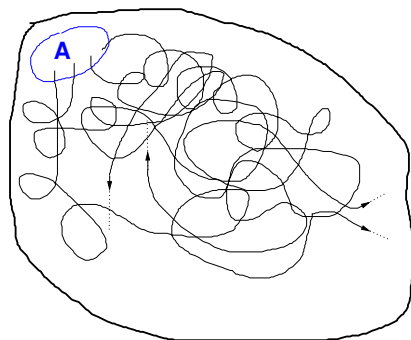
# Motivation

Optimal **finite** scheduling:

- optimal reachability problem
- not difficult to solve for weighted timed automata
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Optimal **infinite** scheduling:

- optimal safety problem (?)
- difficult even to *define*:  
**What is the price of an infinite run ?**



*Find cheapest infinite execution starting in A*

# Motivation

**What is the price  
of an infinite run**

?



(and others ?)

# Motivation

**What is the price  
of an infinite run**  
in a weighted timed transition system  
with non-negative weights  
?



(and others ?)

# How to compute (finite) prices of infinite runs

- BBL, *HSCC* 2004: **Mean-cost approach**



$$P(\rho) = \liminf_{T \rightarrow \infty} \frac{P(\rho \upharpoonright T)}{T} \quad \leftarrow \text{run } \rho \text{ up to time } T$$

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- JT, *FORMATS* 2008: **Step-based discounting**

- fix *discounting factor*  $0 < \lambda < 1$
- after each discrete step, weights are multiplied by  $\lambda$
- (as if the model was discrete:

$$P(\overset{\rightarrow}{p_1} \overset{\rightarrow}{p_2} \overset{\rightarrow}{p_3} \cdots) = p_1 + \lambda p_2 + \lambda^2 p_3 + \cdots \quad )$$





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- FL, *INFINITY* 2008: **Time-based discounting**

- things which happen at time  $T$ ,  
are discounted with  $\lambda^T$



# Discounting

- In economics: *future* loss or profit **matters less** than if it occurred *right now*
- Using *expected return rate*  $r$ , the *net present value* of a transaction  $x$  at time  $T$  is

$$x_{\text{NPV}} = \frac{1}{(1+r)^T} x = \lambda^T x$$

- with discount factor  $\lambda = \frac{1}{1+r}$

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- Expected return rate depends on
  - interest rates
  - perceived risk
  - greed, etc.

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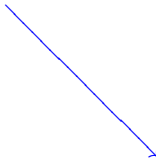
- with discount factor  $\lambda = \frac{1}{1+r}$
- Of interest for us: Using this form of discounting, **most infinite paths have finite total price**
- (because the geometric series  $1 + \lambda + \lambda^2 + \dots$  converges)

# Weighted timed transition systems

$(S, T_s, T_d, w, r) :$

- states  $S$ , switches  $T_s \subseteq S \times S$ , delays  $T_d \subseteq S \times \mathbb{R}_{\geq 0} \times S$ , weights  $w : T_s \rightarrow \mathbb{R}$ , rates  $r : S \rightarrow \mathbb{R}$

Axioms for delays:

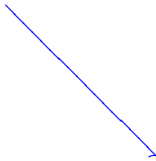
- **trivial loops:**  $\forall s \in S : s \xrightarrow{0} s$
  - **determinacy:**  $s \xrightarrow{t} s_1 \wedge s \xrightarrow{t} s_2 \Rightarrow s_1 = s_2$
  - **additivity:**  $s \xrightarrow{t} s^t \xrightarrow{t'} s^{t+t'} \Rightarrow s \xrightarrow{t+t'} s^{t+t'}$
  - **density (?)**:  $s \xrightarrow{t} s^t \wedge t' \leq t \Rightarrow s \xrightarrow{t'} s^{t'} \xrightarrow{t-t'} s^t$
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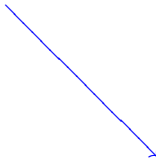
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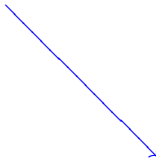
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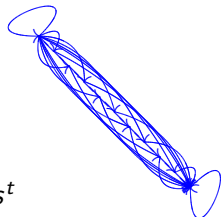
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Can view a delay as a **continuum of intermediate states** !

# Discounted price of infinite paths

- Discounted price of *finite* alternating path

$$\pi = s_0 \xrightarrow{t_0} s_0^{t_0} \rightarrow s_1 \rightarrow \dots \xrightarrow{t_{n-1}} s_{n-1}^{t_{n-1}} \rightarrow s_n :$$

$$P(\pi) = \sum_{i=0}^{n-1} \left( \int_{T_{i-1}}^{T_i} \lambda^t r(s_i^t) dt + \lambda^{T_i} p(s_i^{T_i} \rightarrow s_{i+1}) \right)$$

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

- Discounted price of *infinite* alternating path

$$\pi = s_0 \xrightarrow{t_0} s_0^{t_0} \rightarrow s_1 \rightarrow \dots : \text{limit}$$

$$P(\pi) = \lim_{n \rightarrow \infty} P(s_0 \xrightarrow{t_0} s_0^{t_0} \rightarrow \dots \rightarrow s_{n-1}^{t_{n-1}} \rightarrow s_n)$$

provided that it exists. (!)

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**TLD;DR**  
(Just a minute...)

# INFINITY 2008 result

- Under certain assumptions, **infinite paths with cheapest discounted price** can be computed in weighted timed automata.
- (Similar results for mean-cost [BBL04] and for step-based discounting [JT08])
- But no efficient algorithms

# Recursive property

Equivalent formulation of time-based discounting:

- For  $s \xrightarrow{p} s'$  a switch and  $\pi$  a path out of the target of the switch:

$$P(s \xrightarrow{p} s' \circ \pi) = p + P(\pi)$$

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

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- Fixed-point computations ?
- Efficient, zone-based algorithms ?

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- Fixed-point computations ?
- Efficient, zone-based algorithms ?
- Mean-cost and step-based-discounting approach **do not have this property**



# Recursive property

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$$P(s \xrightarrow{t} s^t \circ \pi) = \int_0^t \lambda^\tau r(s^\tau) d\tau + \lambda^t P(\pi)$$

**Inverse question:** We want this property.

What way can we **define**  $P(\pi)$  ?

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- 3 Simplify

# Recursive property

$$P(s \xrightarrow{t} s^t \xrightarrow{t'} s^{t+t'}) = P(s \xrightarrow{t} s^t) + \lambda^t P(s^t \xrightarrow{t'} s^{t+t'})$$

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# Recursive property

$$P(s \xrightarrow{t+t'} s^{t+t'}) = P(s \xrightarrow{t} s^t) + \lambda^t P(s \xrightarrow{t'} s^{t'})$$

$$f(t + t') = f(t) + g(t)f(t')$$

**Inverse question:** We want this property.

What way can we **define**  $P(\pi)$  ?

- 1 Forget about switches
- 2 Declare rates a *discrete* property
- 3 Simplify
- 4 Only look at paths of length 2
- 5 Time shift
- 6 Simplify
- 7 Generalize; translate to **functional equation**

# Uniqueness

**Theorem:** If  $P$  is a continuous price function in a weighted timed transition system in which rates are a discrete property, and if

$$P(s \xrightarrow{t} s^t \xrightarrow{t'} s^{t+t'}) = P(s \xrightarrow{t} s^t) + g(t) P(s^t \xrightarrow{t'} s^{t+t'})$$

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  $\alpha : S \rightarrow \mathbb{R}$ .

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If you want the nice recursive property, you *have* to use time-based discounting.

And given additivity of delays, the property is quite natural.

Skip proof

# Proof

**Proof:** (See paper for details) 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*:

Skip anyway

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- By induction:

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

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- Can show that  $f(x) \neq 0$  for  $x \neq 0$ , hence  $g(ix) = g(x)^i$
- 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.



# Conclusion

- If you want to discuss optimal scheduling problems in formalisms with both time and weight, use time-based discounting
- (unless you have your own good reasons not to).
- Then, **and only then**, you'll get a natural and useful recursive property ("additivity").
- Also, for weighted timed automata, optimal infinite paths are computable under timed-based discounting,
- and the recursive property lets us hope for an efficient, zone-based algorithm.