

Playing optimally on Timed Automata with Random Delays

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Formats 2012

- 1 Stochastic timed automata
- 2 The TAMDP model
- 3 Existence of optimal schedulers
- 4 Towards extensions
- 5 Concluding remarks

Timed automata with random delays and random actions.

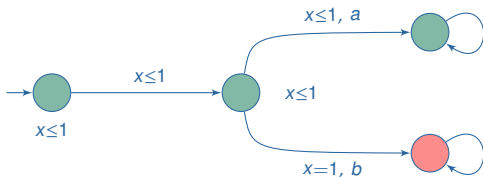
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- 1 sample a delay, according to a fixed probability distribution
 - 2 select randomly an enabled edge
- Infinite-state Markov chain.

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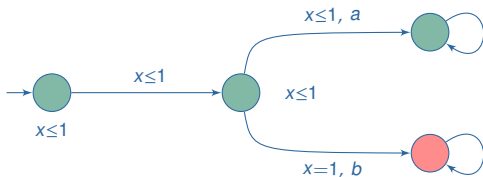


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almost-surely “G green” is satisfied

Almost-sure model checking of STA

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Is φ almost-surely is satisfied?

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One can decide whether $\mathbb{P}(\varphi) = 1$ if

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Extends to quantitative properties for 1-clock timed automata under some additional assumptions.

STA as modelling formalism

IP address allocation protocol

device entering a network

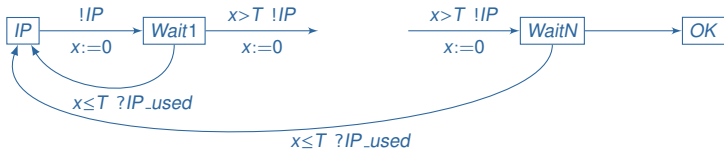
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Assumptions

- ▶ reactive timed automaton
for every state and every delay,
some action is enabled
- ▶ exponential distributions on delays

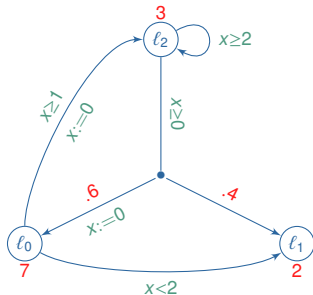
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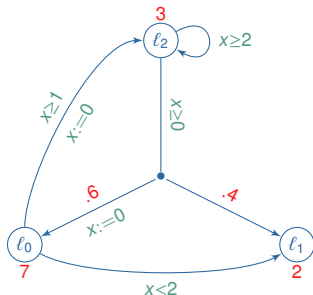
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Special cases

CTMDP = TAMDP without clocks

STA = TAMDP with a single action

Meaningful schedulers

Scheduler

- ▶ resolves non-determinism
- ▶ associates with each prefix run and delay, a distribution over enabled actions

$$\sigma : \text{Runs}(\mathcal{M}) \times \mathbb{R}_{\geq 0} \rightarrow \text{Dist}(\text{Act})$$

Late scheduler: decision is made right before discrete transition

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Late scheduler: decision is made right before discrete transition

Given TAMDP \mathcal{M} , σ defines a probability measure \mathbb{P}_σ over runs.

Measurability constraints on σ to be well-defined

Problem statement

Paths reaching goal G within T , from (ℓ_0, v_0)

$$\text{Reach}_{\mathcal{M}}(\ell, v, G, T) = \{(\ell_0, v_0) \xrightarrow{t_0, e_0, p_0} (\ell_1, v_1) \cdots (\ell_n, v_n) \mid \exists i \leq n, \ell_i \in G \text{ and } \sum_{j < i} t_j \leq T\}.$$

Optimal probability

$$\text{Opt}_{\mathcal{M}}(\ell, v, G, T) = \sup_{\sigma} \mathbb{P}_{\sigma}(\text{Reach}_{\mathcal{M}}(\ell, v, G, T)).$$

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Fundamental questions

- ▶ Is the optimal realized? $\sup = \max$?
- ▶ For what class of schedulers?

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Approximations from below

Paths reaching G within T and in less than N discrete steps

$\text{Reach}^N(\ell, \nu, G, T)$

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Sketch

- ▶ fix scheduler σ ε -optimal

$$\mathbb{P}_{\sigma}(\text{Reach}_{\mathcal{M}}) \geq \text{Opt}_{\mathcal{M}} - \varepsilon$$

- ▶ fix step-bound N s.t.

$$\mathbb{P}_{\sigma}(\text{Reach}_{\mathcal{M}}^N) \geq \mathbb{P}_{\sigma}(\text{Reach}_{\mathcal{M}}) - \varepsilon$$

Properties

Characterization

$$\text{Opt}_{\mathcal{M}}^0(\ell, v, G, T) = 0 \text{ if } \ell \notin G$$

$$\text{Opt}_{\mathcal{M}}^N(\ell, v, G, T) = 1 \text{ if } \ell \in G$$

$$\text{Opt}_{\mathcal{M}}^{N+1}(\ell, v, G, T) = \int_0^T \max_{e \in E} \sum_{(\ell, v) \xrightarrow{t, e, p} (\ell', v')} p \cdot \text{Opt}_{\mathcal{M}}^N(\ell', v', G, T - t) \cdot \Lambda(\ell) \cdot e^{-\Lambda(\ell)t} dt$$

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Key idea for uniform continuity in v

- ▶ $\text{Opt}_{\mathcal{M}}^{N+1}(\ell, v) - \text{Opt}_{\mathcal{M}}^{N+1}(\ell, w) = \int \max_{(\ell, v) \xrightarrow{t, e}} \text{Opt}_{\mathcal{M}}^N \cdots - \int \max_{(\ell, w) \xrightarrow{t, e}} \text{Opt}_{\mathcal{M}}^N \cdots$
- ▶ bound the measure μ of delays for which enabled edges differ

$$\|v - w\| < \delta \quad \Rightarrow \quad m < n \lceil T \rceil \delta$$

Existence of optimal schedulers

Optimal schedulers exist

For every TAMDP \mathcal{M} , reachability goal G and time-bound T , there exists a measurable scheduler σ such that:

$$\mathbb{P}_{\sigma}(\text{Reach}_{\mathcal{M}}(\ell_0, 0^X, G, T)) = \text{Opt}_{\mathcal{M}}(\ell_0, 0^X, G, T).$$

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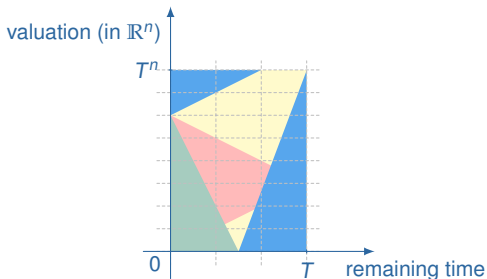
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Illustration of the proof

- ▶ D_a area in T^{n+1} where action a is optimal
- ▶ by continuity, a is also optimal on \bar{D}_a
- ▶ arbitrary order on actions as tie-breaker



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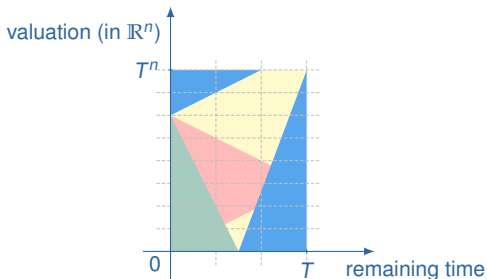
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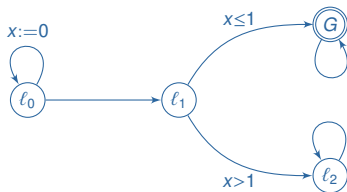


- ▶ non-constructive existence proof
- ▶ provides a **memoryless deterministic measurable scheduler**

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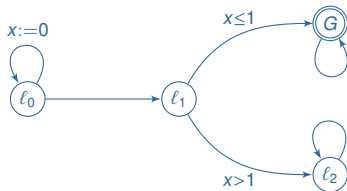
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Optimal schedulers may not exist for time unbounded reachability.



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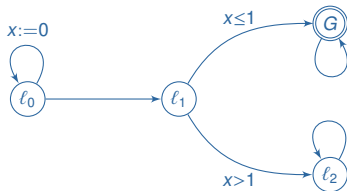
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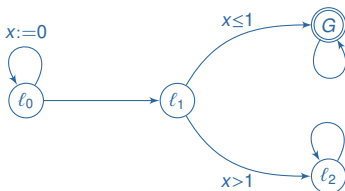
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- ▶ In l_1 , the smaller x the greater the probability.
- ▶ In l_0 , for any sampled delay $t > 0$, a smaller delay can eventually be obtained by looping on l_0 .

Simpler schedulers

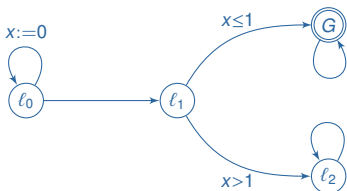
Optimal polyhedral schedulers may not exist.



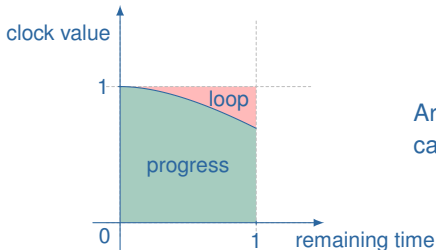
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Areas where each action is optimal
cannot be described by polyhedra.

Conclusion

- ▶ Timed automata MDP model
 - ▶ random delays and nondeterministic actions
 - ▶ encompass CTMDPs and stochastic timed automata

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- ▶ Other real-time models with probabilities and non-determinism
 - ▶ Stochastic timed games [BF-icalp09]
turn-based game between 2 players (choosing delays and actions)
in a randomized environment

 - ▶ Stochastic real-time games [BKKKR-concur10]
CTMDPs with an objective given by a deterministic timed
automaton

 - ▶ Markovian timed automata [CHKM-lics11&rp11&cdc11]
Timed automata with exponentially distributed sojourn time

Conclusion

Contribution on TAMDP model

- ▶ existence of optimal schedulers for time-bounded reachability
- ▶ extends to 2-player games
- ▶ does not extend to time unbounded reachability
- ▶ optimal schedulers are not region-based

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Open questions

- ▶ finiteness of partitionning
- ▶ decidability of existence of optimal schedulers for time-unbounded reachability
- ▶ subclasses with effective schedulers