Complexity of timeline-based planning over dense temporal domains: exploring the middle ground

GandALF 2018

L. Bozzelli, <u>A. Molinari</u>, A. Montanari and A. Peron University of Udine, IT Department of Mathematics, Computer Science, and Physics (DMIF)

September 27, 2018

Point-based vs. interval-based MC

- Model checking (MC) is usually point-based:
 - properties express requirements over points (snapshots) of a computation (states of the state-transition system)
 - they are specified by means of point-based temporal logics such as LTL, CTL, and CTL*.
- Interval-based MC:
 - Interval-based properties express conditions on computation stretches
 - they are specified by means of interval temporal logics, which feature intervals as their basic ontological entities (e.g., HS)
 - » ability to express: actions with duration, accomplishments, temporal aggregations
 - » applied to computational linguistics, artificial intelligence, temporal databases, formal verification

The logic HS

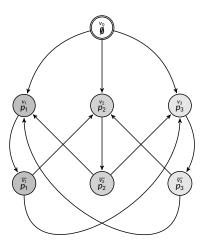
HS features a modality for each of the 13 Allen's ordering relations between pairs of intervals (except for equality)

Allen rel.	HS	Definition	Example
meets before started-by finished-by contains overlaps	(A) (L) (B) (E) (D) (O)	$ [x, y] \mathcal{R}_{A}[v, z] \iff y = v [x, y] \mathcal{R}_{L}[v, z] \iff y < v [x, y] \mathcal{R}_{B}[v, z] \iff x = v \land z < y [x, y] \mathcal{R}_{E}[v, z] \iff y = z \land x < v [x, y] \mathcal{R}_{D}[v, z] \iff x < v \land z < y [x, y] \mathcal{R}_{D}[v, z] \iff x < v \land z < y [x, y] \mathcal{R}_{D}[v, z] \iff x < v < y < z $	$X \bullet V \bullet Z$ $V \bullet Z$

 $\psi ::= p \mid \neg \psi \mid \psi \lor \psi \mid \langle X \rangle \psi \mid \langle \overline{X} \rangle \psi \qquad X \in$

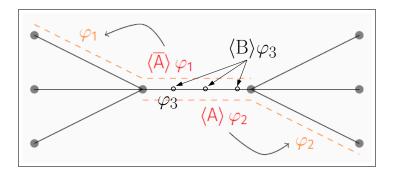
 $X \in \{A, L, B, E, D, O\}.$

Kripke structures



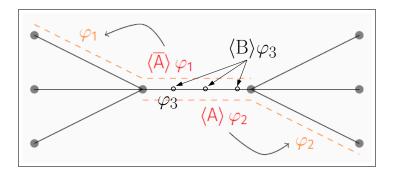
- HS formulas are interpreted over (finite) state-transition systems whose states are labeled with sets of proposition letters (Kripke structures)
- An interval is a trace (finite path) in a Kripke structure

HS (state-based) semantics



• Branching semantics of past/future operators

HS (state-based) semantics



Branching semantics of past/future operators

MC $\mathcal{K} \models \psi \iff$ for all *initial* traces ρ of \mathcal{K} , it holds that $\mathcal{K}, \rho \models \psi$

Possibly infinitely many traces!

Decidability of HS MC

Theorem

The MC problem for full HS over Kripke structures is **decidable** (with a non-elementary algorithm)

Reference

A. Molinari, A. Montanari, A. Murano, G. Perelli, and A. Peron. Checking interval properties of computations. *Acta Informatica*, pages 587–619, 2016

Decidability of HS MC

Theorem

The MC problem for full HS over Kripke structures is **decidable** (with a non-elementary algorithm)

Reference

A. Molinari, A. Montanari, A. Murano, G. Perelli, and A. Peron. Checking interval properties of computations. *Acta Informatica*, pages 587–619, 2016

Theorem

The MC problem for BE over Kripke structures, under homogeneity, is EXPSPACE-hard

Reference

L. Bozzelli, A. Molinari, A. Montanari, A. Peron, and P. Sala. Interval Temporal Logic Model Checking: the Border Between Good and Bad HS Fragments. In *IJCAR*, pages 389–405, 2016

Many other HS fragments studied (PSPACE ++++++ NP).

Ongoing work

We are looking for possible replacements of Kripke structures by more expressive system models in interval-based MC:

- interval-based system models, that allow one to directly describe systems on the basis of their interval behavior/properties (e.g., timelines).
- visibly pushdown systems, that can encode recursive programs and infinite state systems;

- Timelines have been fruitfully exploited in temporal planning
- Timeline-based planning (TP for short) is a more declarative alternative to the classic action-based planning

- Timelines have been fruitfully exploited in temporal planning
- Timeline-based planning (TP for short) is a more declarative alternative to the classic action-based planning
- Temporal domain commonly assumed discrete.
- Gigante et al. showed that TP with bounded temporal relations and token durations, and no temporal horizon, is EXPSPACE-complete and expressive enough to capture action-based temporal planning. (EXPSPACE-completeness also with unbounded relations)

State variable

$$x = (V_x, T_x, D_x)$$

where, e.g.,

•
$$V_x = \{a, b, c\},\$$

- $T_x(a) = \{b, c\}, T_x(b) = \{a, b, c\}, T_x(c) = \{a, b\}$ and
- $D_x(a) = [5, 8], D_x(b) = [1, 4], D_x(c) = [2, \infty[$

State variable

$$x = (V_x, T_x, D_x)$$

where, e.g.,

•
$$V_x = \{a, b, c\},\$$

• $T_x(a) = \{b, c\}, T_x(b) = \{a, b, c\}, T_x(c) = \{a, b\}$ and

•
$$D_x(a) = [5, 8], D_x(b) = [1, 4], D_x(c) = [2, \infty[$$

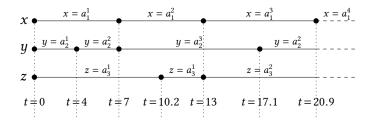
Example of timeline for *x*:

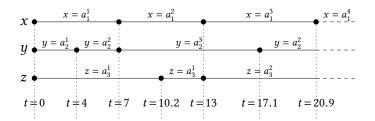
$$x = a \qquad x = b \qquad x = c \qquad x = b$$

$$t = 0 \qquad t = 7 \qquad t = 10 \qquad t = 13.9$$

$$(a, 7)(b, 3)(c, 3.9) \cdots$$

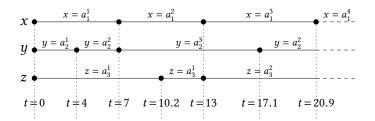
Pairs of value/duration are called tokens.





Synchronization rules on timelines:

$$\forall o_0[x = a_1^1] \to \exists o_1[z = a_3^1] \exists o_2[y = a_2^2]. (o_0 \leq_{[3,4]}^{e,s} o_1 \land o_0 \leq_{[5,\infty[}^{s,s} o_2)$$



Synchronization rules on timelines:

$$\top \to \exists o_1[z = a_3^1] \exists o_2[y = a_2^2]. (o_0 \leq_{[3,4]}^{e,s} o_1 \land o_0 \leq_{[5,\infty[}^{s,s} o_2])$$

Trigger-less rules.

Timelines as system models

- We study timeline-based planning (TP) over dense domains (no recourse to discretization).
 - Why TP before MC? Timelines will be our system models. TP is a necessary condition for MC (feasibility check of the system description).
 - Why dense domains? To avoid discreteness in system descriptions ⇒ abstraction at a higher level, neglecting unnecessary details, and paving the way for a more general interval-based MC;
- Both (i) the system model and (ii) the specifications (temporal formulas) can be translated into a common formalism (timed automata)

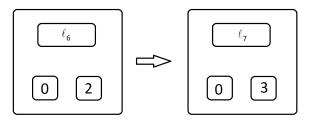
Theorem

Timeline-based planning (TP) is **undecidable over dense temporal domains**, even with a single state variable.

Theorem

Timeline-based planning (TP) is **undecidable over dense temporal domains**, even with a single state variable.

• Undecidability proved via a reduction from the halting problem for Minsky 2-counter machines (inspired by SAT of Metric Temporal Logic with past/future on dense time).

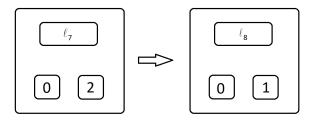


 $\ell_{\mathbf{6}}:c_{\mathbf{2}}:=c_{\mathbf{2}}+1; \operatorname{goto} \ell_{\mathbf{7}}$

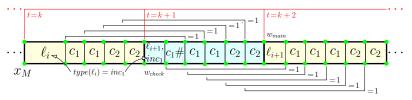
Theorem

Timeline-based planning (TP) is **undecidable over dense temporal domains**, even with a single state variable.

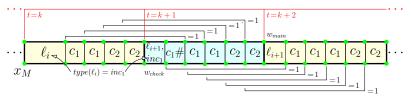
• Undecidability proved via a reduction from the halting problem for Minsky 2-counter machines (inspired by SAT of Metric Temporal Logic with past/future on dense time).



 $\ell_{\bf 7}\!\!: \, \text{if} \, c_{\bf 2} \, > \, 0 \, \text{then} \, c_{\bf 2} \, := \, c_{\bf 2}^{} - 1\!\!; \, \text{goto} \, \ell_{\bf 8}^{} \text{else goto} \, \ell_{\bf 12}^{}$

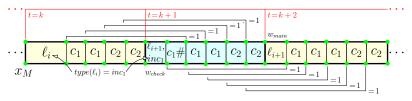


• Exactly one occurrence of l_{init} and l_{halt} (transition function);



- Exactly one occurrence of ℓ_{init} and ℓ_{halt} (transition function);
- For each $v \in V_{Ctrl} \setminus {\ell_{halt}}$,

$$o[x_{\mathsf{M}} = \mathsf{v}] \to \bigvee_{u \in \mathsf{V}_{\mathsf{Ctrl}}} \exists o'[x_{\mathsf{M}} = u] \cdot o \leq_{[1,1]}^{\mathsf{s},\mathsf{s}} o'.$$

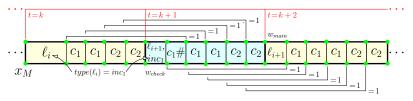


- Exactly one occurrence of ℓ_{init} and ℓ_{halt} (transition function);
- For each $v \in V_{Ctrl} \setminus \{\ell_{halt}\},\$

$$o[x_{\mathsf{M}} = \mathsf{v}] \to \bigvee_{u \in V_{\mathsf{Ctrl}}} \exists o'[x_{\mathsf{M}} = u] \cdot o \leq_{[1,1]}^{\mathsf{s},\mathsf{s}} o'.$$

• For each $i = 1, 2, v \in (U_{c_i} \cap V_{main}) \setminus V_{halt}$ (forward):

$$o[x_{\mathsf{M}} = \mathsf{v}] \to \bigvee_{u \in U_{c_i}} \exists o'[x_{\mathsf{M}} = u]. o \leq_{[1,1]}^{s,s} o'.$$



- Exactly one occurrence of ℓ_{init} and ℓ_{halt} (transition function);
- For each $v \in V_{Ctrl} \setminus \{\ell_{halt}\},\$

$$o[x_{\mathsf{M}} = \mathsf{v}] \to \bigvee_{u \in V_{\mathsf{Ctrl}}} \exists o'[x_{\mathsf{M}} = u] \cdot o \leq_{[1,1]}^{\mathsf{s},\mathsf{s}} o'.$$

• For each $i = 1, 2, v \in (U_{c_i} \cap V_{main}) \setminus V_{halt}$ (forward):

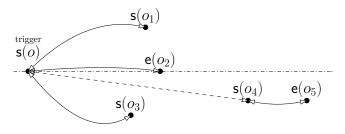
$$o[x_{\mathsf{M}} = \mathsf{v}] \to \bigvee_{u \in U_{c_i}} \exists o'[x_{\mathsf{M}} = u]. o \leq_{[1,1]}^{s,s} o'.$$

• For each $i = 1, 2, v \in (U_{c_i} \cap V_{check}) \setminus V_{init}$ (backward):

$$o[x_{\mathsf{M}} = \mathsf{v}] \to \bigvee_{u \in U_{c_i}} \exists o'[x_{\mathsf{M}} = u] \cdot o' \leq_{[1,1]}^{\mathsf{s},\mathsf{s}} o.$$

What happens if we restrict to future?

• Future: the token triggering a rule can only "refer" to other tokens in the future (i.e., starting after it).



Theorem

Future TP is non-primitive recursive-hard, even with a single state variable.

- Reduction from the halting problem for Gainy counter machines, known to be non-primitive recursive
- Only forward constraint can be expressed by future rules!

Decidability—(1) Translating rules

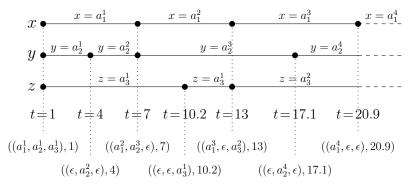
- Decidability of future TP with arbitrary trigger rules is open.
- We restrict to simple trigger rules: all existentially quantified tokens (but not the trigger!) occur just once in the rule.
- Decidability can be recovered if rules are simple and future.

Translation into MTL/MITL

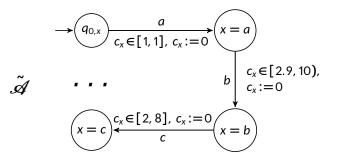
The simple form allows translation into MTL/MITL (future only+finite w!):

 $\varphi ::= \top \mid p \mid \varphi \lor \varphi \mid \neg \varphi \mid \varphi \cup_{I} \varphi$

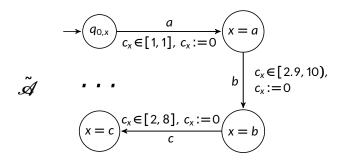
with $p \in AP$, $I \in Intv$, U_I is the standard strict timed until MTL modality



Decidability—(2) Translating state variables



Decidability—(2) Translating state variables



Theorem

Future TP with simple trigger rules is decidable (in non-primitive recursive time). If the intervals in atoms of the trigger rules are non-singular (resp., belong to $Intv_{(0,\infty)}$), then it is in **EXPSPACE** (resp., in **PSPACE**).

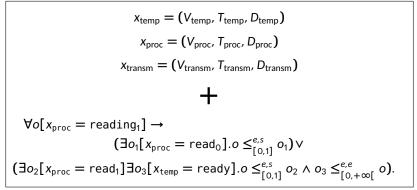
EXPSPACE-completeness (resp., **PSPACE**-completeness) holds.

System model:

 $x_{\text{temp}} = (V_{\text{temp}}, T_{\text{temp}}, D_{\text{temp}})$ $x_{\text{proc}} = (V_{\text{proc}}, T_{\text{proc}}, D_{\text{proc}})$ $x_{\text{transm}} = (V_{\text{transm}}, T_{\text{transm}}, D_{\text{transm}})$ +

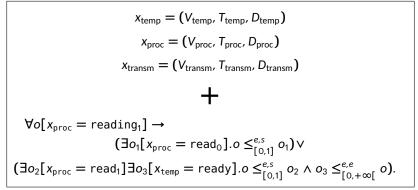
Property specification:

System model:



Property specification:

System model:



Property specification:

 $F_{\leq 8} \psi(s, \operatorname{read}_1) \qquad F_{\geq 0} (\psi(s, \operatorname{ready}) \wedge (\top U_{>0} \psi(s, \operatorname{ready})))$

Given a system model P (state vars + rules), it is possible to build a TA $\tilde{\mathscr{A}}$ that accepts all and only the (timed words encoding) computations of P.

Definition (Timeline-based model checking)

Given a system model (in the form of) $\tilde{\mathscr{A}}$ and a MITL formula φ , to decide if

 $\mathscr{L}_{\mathbb{T}}(\tilde{\mathscr{A}}) \subseteq \mathscr{L}_{\mathbb{T}}(\varphi).$

Given a system model P (state vars + rules), it is possible to build a TA $\tilde{\mathscr{A}}$ that accepts all and only the (timed words encoding) computations of P.

Definition (Timeline-based model checking)

Given a system model (in the form of) $\tilde{\mathscr{A}}$ and a MITL formula φ , to decide if

 $\mathscr{L}_{\mathbb{T}}(\tilde{\mathscr{A}}) \subseteq \mathscr{L}_{\mathbb{T}}(\varphi).$

We make a product between $\tilde{\mathscr{A}}$ and $\mathscr{A}_{\neg \varphi}$ and check for emptiness.

Theorem

The MC problem for MITL formulas over timelines, with simple future trigger rules and non-singular intervals, is in **EXPSPACE**. The MC problem for $MITL_{(0,\infty)}$ formulas over timelines, with simple future trigger rules and intervals in $Intv_{(0,\infty)}$, is in **PSPACE**.

Matching lower bounds derive from TP.

Thanks!

Publications

 L. Bozzelli, A. Molinari, A. Montanari, and A. Peron. An in-depth investigation of interval temporal logic model checking

with regular expressions.

In SEFM, pages 104-119, 2017.

- [2] L. Bozzelli, A. Molinari, A. Montanari, A. Peron, and P. Sala. Interval Temporal Logic Model Checking: the Border Between Good and Bad HS Fragments. In *IJCAR*, pages 389–405, 2016.
- [3] L. Bozzelli, A. Molinari, A. Montanari, A. Peron, and P. Sala. Interval vs. Point Temporal Logic Model Checking: an Expressiveness Comparison. In *FSTTCS*, 2016.
- [4] A. Molinari, A. Montanari, A. Murano, G. Perelli, and A. Peron. Checking interval properties of computations. *Acta Informatica*, pages 587–619, 2016.

Truth of a formula ψ over a trace ρ of a Kripke structure $\mathcal{K} = (\mathcal{AP}, W, \delta, \mu, w_0)$:

K, *ρ* ⊨ *p* iff *p* labels all states of *K* composing *ρ*, for any *p* ∈ *AP* (homogeneity assumption);

Truth of a formula ψ over a trace ρ of a Kripke structure $\mathcal{K} = (\mathcal{AP}, W, \delta, \mu, w_0)$:

• $\mathcal{K} \rho \models r$ iff the labeling of ρ is in $\mathcal{L}(r)$ (labeling based on regular expressions);

Truth of a formula ψ over a trace ρ of a Kripke structure $\mathcal{K} = (\mathcal{AP}, W, \delta, \mu, w_0)$:

- $\mathcal{K}, \rho \models r$ iff the labeling of ρ is in $\mathcal{L}(r)$ (labeling based on regular expressions);
- negation, disjunction, and conjunction are standard;
- $\mathcal{K}, \rho \models \langle \mathsf{A} \rangle \psi \dots;$
- $\mathcal{K}, \rho \models \langle \mathsf{B} \rangle \psi \dots;$
- $\mathcal{K}, \rho \models \langle \mathsf{E} \rangle \psi \dots;$
- inverse operators $\langle \overline{A} \rangle$, $\langle \overline{B} \rangle$, $\langle \overline{E} \rangle$

Truth of a formula ψ over a trace ρ of a Kripke structure $\mathcal{K} = (\mathcal{AP}, W, \delta, \mu, w_0)$:

- $\mathcal{K} \rho \models r$ iff the labeling of ρ is in $\mathcal{L}(r)$ (labeling based on regular expressions);
- negation, disjunction, and conjunction are standard;
- $\mathcal{K}, \rho \models \langle \mathsf{A} \rangle \psi \dots;$
- $\mathcal{K}, \rho \models \langle \mathsf{B} \rangle \psi \dots;$
- $\mathcal{K}, \rho \models \langle \mathsf{E} \rangle \psi \dots;$
- inverse operators $\langle \overline{A} \rangle$, $\langle \overline{B} \rangle$, $\langle \overline{E} \rangle$

MC

 $\mathcal{K} \models \psi \iff$ for all *initial* traces ρ of \mathcal{K} , it holds that $\mathcal{K}, \rho \models \psi$

Possibly infinitely many traces!

Truth of a formula ψ over a trace ρ of a Kripke structure $\mathcal{K} = (\mathcal{AP}, W, \delta, \mu, w_0)$:

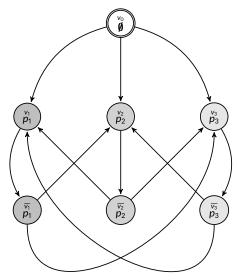
- $\mathcal{K}, \rho \models r$ iff the labeling of ρ is in $\mathcal{L}(r)$ (labeling based on regular expressions);
- negation, disjunction, and conjunction are standard;
- $\mathcal{K}, \rho \models \langle \mathsf{A} \rangle \psi \dots;$
- $\mathcal{K}, \rho \models \langle \mathsf{B} \rangle \psi \dots;$
- $\mathcal{K}, \rho \models \langle \mathsf{E} \rangle \psi \dots;$
- inverse operators $\langle \overline{A} \rangle$, $\langle \overline{B} \rangle$, $\langle \overline{E} \rangle$

MC

 $\mathcal{K} \models \psi \iff$ for all *initial* traces ρ of \mathcal{K} , it holds that $\mathcal{K}, \rho \models \psi$

Possibly infinitely many traces!

The Kripke structure \mathcal{K}_{Sched} for a simple scheduler



A short account of Ksched

 \mathcal{K}_{Sched} models the behaviour of a scheduler serving 3 processes which are continuously requesting the use of a common resource (easily generalizable to an arbitrary number of processes)

Initial state: v_0 (no process is served in that state)

In v_i and \overline{v}_i the *i*-th process is served (p_i holds in those states)

The scheduler cannot serve the same process twice in two successive rounds:

- process *i* is served in state v_i, then, after "some time", a transition u_i from v_i to v
 _i is taken; subsequently, process *i* cannot be served again immediately, as v_i is not directly reachable from v
 _i
- a transition r_j, with j ≠ i, from v_i to v_j is then taken and process j is served

Some properties to be checked over Ksched

Validity of properties over all reachable computation intervals can be forced by modality [*E*] (they are suffixes of at least one initial trace).

• In any computation interval of length at least 4, at least 2 processes are witnessed (YES: no process can be executed twice in a row)

 $\mathscr{K}_{Sched} \models [E](\langle \mathsf{E} \rangle^3 \top \rightarrow (\chi(p_1, p_2) \lor \chi(p_1, p_3) \lor \chi(p_2, p_3))),$

where $\chi(p,q) = \langle \mathsf{E} \rangle \langle \overline{\mathsf{A}} \rangle p \land \langle \mathsf{E} \rangle \langle \overline{\mathsf{A}} \rangle q$.

• In any computation interval of length at least 11, process 3 is executed at least once (NO: the scheduler can postpone the execution of a process ad libitum—starvation)

$$\mathscr{K}_{Sched} \not\models [E](\langle \mathsf{E} \rangle^{10} \top \rightarrow \langle \mathsf{E} \rangle \langle \overline{\mathsf{A}} \rangle p_3).$$

• In any computation interval of length at least 6, all processes are witnessed (NO: the scheduler should be forced to execute them in a strictly periodic manner, which is not the case)

 $\mathscr{K}_{Sched} \not\models [E](\langle \mathsf{E} \rangle^5 \to (\langle \mathsf{E} \rangle \langle \overline{\mathsf{A}} \rangle p_1 \land \langle \mathsf{E} \rangle \langle \overline{\mathsf{A}} \rangle p_2 \land \langle \mathsf{E} \rangle \langle \overline{\mathsf{A}} \rangle p_3)).$

4/12

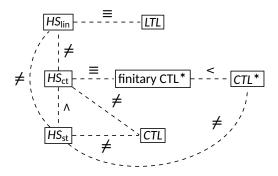
Complexity results

	Homogeneity
Full HS, BE	non-elementary
	EXPSPACE-hard
AABBE, AAEBE	
	PSPACE-hard
AABE	PSPACE-complete
AĀBĒ, BĒ, Ē, AĀEĒ, EĒ, Ē	PSPACE-complete
AAB, AAE, AB, AE	P ^{NP} -complete
А А , АВ, АЕ, А, А	$\in \mathbf{P}^{NP[O(\log^2 n)]}$
	P ^{NP[O(log n)]} -hard
Prop, B, E	co-NP-complete

Complexity results

	Homogeneity	Regular expressions
Full HS, BE	non-elementary	non-elementary
	EXPSPACE-hard	EXPSPACE-hard
AĀBBĒ, AĀEBĒ ∈ AEXP _{Pol}		AEXP Pol-complete
AADDE, AAEDE	PSPACE-hard	AEAP pol-complete
AABE	E PSPACE -complete	∈ AEXP _{Pol}
AABE		PSPACE-hard
$A\overline{A}B\overline{B}, B\overline{B}, \overline{B},$	PSPACE-complete	PSPACE -complete
AĀEĒ, EĒ, Ē		PSFACE-Complete
AĀB, AĀE, AB, ĀE	P ^{NP} -complete	PSPACE-complete
А А , АВ, АЕ, А, А	$\in \mathbf{P}^{NP[O(\log^2 n)]}$	PSPACE -complete
	P ^{NP[O(log n)]} -hard	r srace-complete
Prop, B, E	co-NP-complete	PSPACE-complete

Expressiveness results (under homogeneity)



Reference

L. Bozzelli, A. Molinari, A. Montanari, A. Peron, and P. Sala. Interval vs. Point Temporal Logic Model Checking: an Expressiveness Comparison. In *FSTTCS*, 2016

Sketch of **PSPACE**-hardness

- Reduction from the PSPACE-complete problem Periodic SAT
- We are given a Boolean formula $\varphi(x_1, \ldots, x_n, x_1^{+1}, \ldots, x_n^{+1})$ in CNF
- φ^{j} is φ in which we replace each x_{i} by a fresh x_{i}^{j} , and x_{i}^{+1} by x_{i}^{j+1} .
- Decide the satisfiability of the infinite-length formula

$$\Phi = \bigwedge_{j \ge 1} \varphi^j$$

(actually equivalent to $\Phi_f = \bigwedge_{j=1}^{2^{2n}+1} \varphi^j$).

Sketch of **PSPACE**-hardness

For the *t*-th conjunct of φ ,

$$o[y = \tilde{\$}] \rightarrow \left(\bigvee_{x_i \in \Gamma \cap L_t^+} \exists o'[y = \tilde{x}_i^\top] . o \leq_{[0,4n]}^{e,s} o' \right) \lor$$
$$\left(\bigvee_{x_i^{+1} \in \Gamma^{+1} \cap L_t^+} \exists o'[y = x_i^\top] . o \leq_{[0,4n]}^{e,s} o' \right) \lor$$
$$\left(\bigvee_{x_i \in \Gamma \cap L_t^-} \exists o'[y = \tilde{x}_i^\bot] . o \leq_{[0,4n]}^{e,s} o' \right) \lor$$
$$\left(\bigvee_{x_i^{+1} \in \Gamma^{+1} \cap L_t^-} \exists o'[y = x_i^\bot] . o \leq_{[0,4n]}^{e,s} o' \right) \lor$$
$$\exists o''[y = stop] . o \leq_{[0,2n]}^{e,s} o''.$$

Timelines with trigger-less rules only

- Trigger-less synchronization rules can be directly translated into a timed automaton (no need to translate into MTL)
- Timed automaton of exponential size: it gives us an exponential bound (*) on the number of tokens and on the horizon

Timelines with trigger-less rules only

- Trigger-less synchronization rules can be directly translated into a timed automaton (no need to translate into MTL)
- Timed automaton of exponential size: it gives us an exponential bound (*) on the number of tokens and on the horizon
- We observe that:
 - 1. timelines for different variables evolve independently, and
 - 2. each trigger-less rule enforces at most one "synchronization point" among timelines.

Theorem

TP with trigger-less rules only is **NP**-complete.

Timelines with trigger-less rules only

- Trigger-less synchronization rules can be directly translated into a timed automaton (no need to translate into MTL)
- Timed automaton of exponential size: it gives us an exponential bound (*) on the number of tokens and on the horizon
- We observe that:
 - 1. timelines for different variables evolve independently, and
 - 2. each trigger-less rule enforces at most one "synchronization point" among timelines.

Theorem

TP with trigger-less rules only is **NP-complete**.

How we deal with 1. and 2.:

- timeline evolutions are enforced by a linear program (where constants are exponential (*)), resting on results on Eulerian multi-graphs (thanks G. Woeginger!)
- we non-deterministically position tokens (those to which rules refer) along timelines (their start/end times can be generated in polynomial time (*)) and check satisfaction of rules

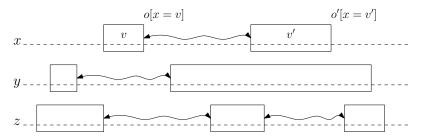
NP-completeness of the trigger-less case

- Timed automata give us (i) an exponential bound on the number of tokens of any plan and (ii) an exponential bound on the horizon.
- We start by reducing to integers all the rational values occurring in the instance.
- For every quantifier $o_i[x_i = v_i]$ in the rules, the algorithm guesses
 - 1. the integer part of the start and end time of the token for x_i to which o_i is mapped,
 - 2. an order of all fractional parts of such start/end times.

If we change the start/end time of (some of the) tokens associated with quantifiers, but we leave unchanged (i) all the integer parts, (ii) zeroness/non-zeroness of fractional parts, and (iii) the fractional parts' order, satisfaction of atoms in the rules does not change.

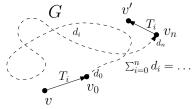
NP-completeness of the trigger-less case

 Now we have to check that there exists a legal timeline evolution "connecting" each pair of adjacent guessed tokens over the same variable



NP-completeness of the trigger-less case

- We interpret each state variable $x_i = (V_i, T_i, D_i)$ as a directed graph $G = (V_i, T_i)$ where D_i associates each $v \in V_i$ with a duration interval.
- For a pair of adjacent guessed tokens (x_i, v, d) and (x_i, v', d') :



- To this aim we guess a set of integers $\{\alpha_{u,v} \mid (u,v) \in T_i\}$ where $\alpha_{u,v}$ is the number of times the path traverses (u, v) and check that they specify a directed Eulerian path (in a multi-graph) $v_0 \rightsquigarrow v_n$.
- To check all this, we solve a linear problem. (thanks G. Woeginger!)

Theorem

TP with trigger-less rules is **NP-complete**.

NP-hardness: from existence of a Hamiltonian path in directed graph.