# Monitoring Arithmetic Temporal Properties on Finite Traces

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# Checking properties of dynamic systems





- system fully known,
  specification available
- analyze all executions, or all execution trees

analysis task: model checking

- system unknown, or properties inaccessible
- analyze running execution and its possible continuations

analysis task: monitoring



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 $(ALTL_f)$ 



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- anticipatory monitoring: determine current and future satisfaction

#### " $\psi_1$ holds but could get violated in the future"



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- linear-time property ψ with linear arithmetic constraints (ALTL<sub>f</sub>) variables can have lookahead to refer to future values
- anticipatory monitoring: determine current and future satisfaction
- what is decidable/solvable? how to construct monitors?

given trace and ALTL<sub>f</sub> property, determine monitoring state [BLS2010]:

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A. Bauer, M. Leucker, and C. Schallhart: Comparing LTL Semantics for Runtime Verification. J. Logic and Comput., 20(3): 651-674, 2010.

problem at least as hard as

satisfiability and validity

Х

#### Theorem

monitoring of lookahead-free properties is solvable

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# Example

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monitoring of lookahead-free properties is solvable: DFAs serve as monitors

### Example

• construct DFA for  $(y \ge 0) \cup (G(x > y))$ , treating constraints as propositions

every DFA state *q* corresponds to unique monitoring state









#### Example (DFAs are not monitors)

• DFAs construction for  $G(x' > x) \land F(x = 2)$ 



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sequence of monitoring states and DFA states



#### Fact

Monitoring with lookahead is not solvable: reduction from reachability in 2CM

# Monitoring with lookahead is not solvable

problem: state reachability depends on assignment

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#### Approach: Symbolic finite state abstraction

**history constraints** are constraints accumulated along paths in DFA:

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 formulas in final nodes of CG give condition for reachability of final DFA states: captured by FSat(CG(q)) (similarly FUns(CG(q)))

# Monitoring procedure

# all monitoring structures can be computed upfront (DFA, CGs, FSat, FUns)

- 1: procedure MONITOR( $\psi$ ,  $\tau$ )
- 2: compute DFA for  $\psi$
- 3:  $w \leftarrow$  word over constraints consistent with au
- 4:  $q \leftarrow \mathsf{DFA}$  state in such that  $\{q_0\} \rightarrow^*_w q$
- 5:  $\alpha \leftarrow \mathsf{last} \mathsf{ assignment} \mathsf{ in } \tau$
- 6: if q accepting in DFA then
- 7: return (cs if  $\alpha \models FUns(CG(q))$  else ps)
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does not terminate if CGs infinite

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previously used in context of model checking [FMW22]

### Definition (Finite summary)

property  $\psi$  has finite summary if paths in DFA for  $\psi$  are covered by finitely many history constraints

[FMW22] P. Felli, M. Montali, S. Winkler. Linear-time verification of data-aware dynamic systems with arithmetic. AAAI-36(5), 5642-5650, 2022

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monitoring task is solvable for any  $\psi$  that has finite summary, and MONITOR is monitoring procedure

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# Property classes that enjoy finite summary

▶ monotonicity constraint properties over  $\mathbb{Q}$  or  $\mathbb{Z}$   $G(x' > x) \land F(x=2)$ (all constraints are variable-to-variable/constant comparisons)

S. Demri and D. D'Souza: An automata-theoretic approach to constraint LTL. Inform. Comput., 205(3): 380-415, 2007.

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S. Demri: LTL over integer periodicity constraints. Theor. Comput. Sci., 360(1-3): 96-123, 2006.

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- ► **bounded lookback** properties (restriction on interaction of constraints via lookahead, generalizes feedback freedom)

E. Damaggio, A. Deutsch and V. Vianu: Artifact systems with data dependencies and arithmetic. ACM Trans. Database Syst., 37(3): 22:1–22:36, 2012

# Property classes that enjoy finite summary

- $G(x' > x) \land F(x = 2)$ **monotonicity constraint** properties over  $\mathbb{Q}$  or  $\mathbb{Z}$ (all constraints are variable-to-variable/constant comparisons)
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- $F(x' > y) \wedge G(x + z = 7)$ **bounded lookback** properties (restriction on interaction of constraints via lookahead, generalizes feedback freedom)

## Non-solvable class

gap-order properties (all constraints are gap-order comparisons)

L. Bozzelli and S. Pinchinat: Verification of gap- order constraint abstractions of counter systems. Theor. Comput. Sci., 523: 1-36, 2014

 $G(x' - y \ge 3) \wedge F(x - z' \ge 2)$ 

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2	genei	1	Monitoring Arith	metic Temporal Properties
	term		prototype	tool for AAAI'23 submission
3	solva			main help load example +
	mond	x = 0, y = 0 x = 15 y = 1		
4	SMT	x = 2, y = 2 x = 3, y = 1		
_				
		LTLf property		
		(x' >= x) U (y == 3)		
		Check		
		NFA DFA OUTPUT		
		input system		
		CICC to open $q_{0}$ : (0) (y = 3) $q_{2}$ : (1, 2) (1) (1) (2) (2) (2) (3) (3) (3) (4) (4) (5) (5) (5) (5) (5) (5) (5) (5	x >= x-), (y != 3))	

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#### Future work

- lift approach to richer properties equipped with full-fledged relations
- possibly study more general, controlled first-order quantification across time