Why is this SAT?

Why is this Hard?

What is the Problem?

# MAX-SAT for Temporal Logics

Kristin Yvonne Rozier Iowa State University



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Why is this Hard?

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# AAC Operational Concept<sup>1</sup>

Free of Conflict	(1) Controller and AutoResolver control	(2) Controller or TSAFE controls	(3) TSAFE takes control	z.mz	(4) TSAFE hand off the control	Free of Conflict
<u>~20 min</u> AutoResolver boundary	<u>~3 min</u> TSAFE boundary	<u>~1 min</u> TSAFE threshold	<u>~30 sec</u> TCAS boundary	Time of the predicted LOS	If TSAFE resolves the conflict	_

 $<sup>^{1}</sup>$ H Erzberger, K Heere. "Algorithm and operational concept for resolving short-range conflicts." Proc. IMechE G J. Aerosp. Eng. 224 (2) (2010) 225–243.

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# AAC Operational Concept<sup>2</sup>

Free of Conflict	(1) Controller and AutoResolver control	(2) Controller or TSAFE controls	(3) TSAFE takes control	5 <sup>M4</sup> Z	(4) TSAFE Free of hand off Conflic the control	t
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#### Formal verification triggered system design changes<sup>1</sup>

<sup>&</sup>lt;sup>1</sup>Y. Zhao and K.Y. Rozier. "Formal Specification and Verification of a Coordination Protocol for an Automated Air Traffic Control System." SCP Journal, vol-96, no-3, pg 337-353, 2014.

<sup>&</sup>lt;sup>2</sup>H Erzberger, K Heere. "Algorithm and operational concept for resolving short-range conflicts." Proc. IMechE G J. Aerosp. Eng. 224 (2) (2010) 225–243.

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### Operational Concept for the Swift UAS



Whenever the Swift UAS is in the air, its indicated airspeed ( $V_{IAS}$ ) must be greater than its stall speed  $V_S$ . The UAS is considered to be air-bound when its altitude *alt* is larger than that of the runway  $alt_0$ .<sup>3</sup>

<sup>&</sup>lt;sup>3</sup>T. Reinbacher, K.Y. Rozier, J. Schumann. "Temporal-Logic Based Runtime Observer Pairs for System Health Management of Real-Time Systems." TACAS 2014.

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### Operational Concept for the Swift UAS



Whenever the Swift UAS is in the air, its indicated airspeed ( $V_{IAS}$ ) must be greater than its stall speed  $V_S$ . The UAS is considered to be air-bound when its altitude *alt* is larger than that of the runway  $alt_0$ .<sup>3</sup>

### $ALWAYS((alt > alt_0) \rightarrow (V_{IAS} > V_S))$

 $<sup>^3</sup>$ T. Reinbacher, K.Y. Rozier, J. Schumann. "Temporal-Logic Based Runtime Observer Pairs for System Health Management of Real-Time Systems." TACAS 2014.

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# There is a Pattern Here...



Air Force aircraft carrier deck scheduling: deck resource timeline displaying three failures  $^{\rm 4}$ 

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# There is a Pattern Here...



Air Force aircraft carrier deck scheduling: deck resource timeline displaying three failures<sup>4</sup>

#### Aerospace Operational Concepts Are Often Specified With Timelines

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# A Natural Logic for Operational Timelines:

Linear Temporal Logic

Linear Temporal Logic (LTL) formulas reason about linear timelines:

- finite set of atomic propositions  $\{p \ q\}$
- Boolean connectives:  $\neg$ ,  $\land$ ,  $\lor$ , and  $\rightarrow$
- temporal connectives:
  - $\mathcal{X}p$ NEXT TIME $\Box p$ ALWAYS $\Diamond p$ EVENTUALLY $p\mathcal{U}q$ UNTIL $p\mathcal{R}q$ RELEASE



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# Formal Verification Via Model Checking

- Describe system requirements in a formal specification, φ.
- Create a system model with formal semantics, *M*.
- **3** Check that M satisfies  $\varphi$ .

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Model checking finds disagreements between the system model and the formal specification.

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# Formal Verification Via LTL Model Checking

- Describe system requirements in a formal LTL specification, φ.
- Create a system model with formal semantics, *M*.
- **3** Check that M satisfies  $\varphi$ .

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Model checking finds disagreements between the system model and the formal specification.

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What is the Problem?

# Formal Verification Via LTL Model Checking

- Describe system requirements in a formal LTL specification, φ.
- Create a system model with formal semantics, *M*.
- **③** Check that M satisfies  $\varphi$ .
  - Graph-search-based
  - BDD-based
  - BMC-based
  - IC3-based





Model checking finds disagreements between the system model and the formal specification.

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# Formal Verification Via LTL Model Checking

- **1** Describe system requirements in a formal specification,  $\varphi$ .
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  - Only works if the formula is correct!
  - Create a system model with formal semantics, *M*.
  - **3** Check that M satisfies  $\varphi$ .
    - Graph-search-based
    - BDD-based
    - BMC-based
    - IC3-based





Model checking finds disagreements between the system model and the formal specification.

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# Property Assurance: We Propose Satisfiability Checking

 $\mathit{M}\vDash\varphi$  may not mean the system has the intended behavior

Recall that a property  $\varphi$  is *valid* iff  $\neg \varphi$  is *unsatisfiable*.

- If  $\neg \varphi$  is not satisfiable, then
  - There can never be a counterexample.
  - Model checkers will always return "success."
  - $\varphi$  is probably wrong.

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# Property Assurance: We Propose Satisfiability Checking

 $\textit{M}\vDash\varphi$  may not mean the system has the intended behavior

 $M \not \models \varphi$  may not mean the system does not have the intended behavior

Recall that a property  $\varphi$  is *valid* iff  $\neg \varphi$  is *unsatisfiable*.

- If  $\neg\varphi$  is not satisfiable, then
  - There can never be a counterexample.
  - Model checkers will always return "success."
  - $\varphi$  is probably wrong.
- If  $\varphi$  is not satisfiable, then
  - There is always a counterexample.
  - Model checkers will always return "failure."
  - $\varphi$  is probably wrong.

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# Specification Debugging: LTL Satisfiability Checking

#### For each property $\varphi$ and $\neg\varphi$ we should check for satisfiability.

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# Specification Debugging: LTL Satisfiability Checking

For each property  $\varphi$  and  $\neg\varphi$  we should check for satisfiability.

We need to check the conjunction of all properties for satisfiability.

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# LTL-to-Automaton Complexity

• LTL property f of size  $|\varphi|$ 

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- System model *M* of size *M*
- LTL satisfiability checking takes time  $|M| \cdot 2^{\mathcal{O}(|\varphi|)}$ .

### LTL Satisfiability Checking is PSPACE-Complete!

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# LTL-to-Automaton Complexity

- LTL property f of size  $|\varphi|$
- System model M of size |M|
- LTL satisfiability checking takes time  $|M| \cdot 2^{\mathcal{O}(|\varphi|)}$ .

#### LTL Satisfiability Checking is PSPACE-Complete!

#### We have to be smart about encoding the problem!

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# Ex: Automata-Theoretic Approach to Model Checking: One of the PSPACE-Complete Algorithms for LTL-SAT



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# Ex: Automata-Theoretic Approach to Model Checking: One of the PSPACE-Complete Algorithms for LTL-SAT

#### Requires efficient LTL-to-automaton translation.



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# LTL Satisfiability is Hard to Scale<sup>5</sup>



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### LTL Satisfiability is Hard to Code Correctly<sup>6</sup>

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<sup>6</sup>K.Y.Rozier, M.Y.Vardi. "LTL Satisfiability Checking." STTT Journal, pg. 123=137, 2010, ← ≧ → ← ≧ → ⇒ → ○ ○ ○

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# Implementation is Hugely Influential<sup>7</sup>

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<sup>7</sup>K.Y.Rozier, M.Y.Vardi. "LTL Satisfiability Checking." STTT Journal, pg. 123=137, 2010. → 🗄 → → 🖹 → 🖉 🔗 🤇

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# Better Encoding Can Lead to Exponential Improvement!<sup>8</sup>



<sup>8</sup>K.Y. Rozier and M.Y. Vardi. "A Multi-Encoding Approach for LTL Symbolic Satisfiability Checking." FM'11. E 2000

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# Even for Very Hard Formulas! <sup>9</sup>



9 K.Y. Rozier and M.Y. Vardi. "A Multi-Encoding Approach for LTL Symbolic Satisfiability Checking." में 11. 💈 🔊 ९ २

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# Specification Debugging: LTL Satisfiability Checking

#### For each property $\varphi$ and $\neg\varphi$ we should check for satisfiability.

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# Specification Debugging: LTL Satisfiability Checking

For each property  $\varphi$  and  $\neg\varphi$  we should check for satisfiability.

We need to check the conjunction of all properties for satisfiability.

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# Specification Debugging: LTL Satisfiability Checking

For each property  $\varphi$  and  $\neg\varphi$  we should check for satisfiability.

#### We need to check the conjunction of all properties for satisfiability. Is this actually required in real life?

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# LTL Satisfiability Checking Found A Specification Bug



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Problem O	verview		

• **Specification Debugging:** If the conjunction of all properties is not satisfiable, where is the problem?

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Problem Over	view		

- **Specification Debugging:** If the conjunction of all properties is not satisfiable, where is the problem?
- **Requirements Engineering:** If the conjunction of all requirements is UNSAT, how many can I have? What's the closest you can give me to what I want?

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- XAI: "I could not solve this because ... This (smallest subset of) requirement(s) is not compatible with the rest of the set"

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#### These are all MAX-SAT!

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- **Specification Debugging:** If the conjunction of all properties is not satisfiable, where is the problem?
- **Requirements Engineering:** If the conjunction of all requirements is UNSAT, how many can I have? What's the closest you can give me to what I want?
- XAI: "I could not solve this because ... This (smallest subset of) requirement(s) is not compatible with the rest of the set"

#### These are all MAX-SAT! But SAT for LTL is already hard!

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# Linear Temporal Logic: Reasons Over Infinite Traces

Linear Temporal Logic (LTL) formulas reason about linear timelines:

- finite set of atomic propositions {p q}
- Boolean connectives:  $\neg,$   $\wedge,$   $\lor,$  and  $\rightarrow$
- temporal connectives:
  - $\mathcal{X}p$  NEXT TIME  $\Box p$  ALWAYS
  - *♦<i>p* EVENTUALLY
  - $p\mathcal{U}q$  UNTIL
  - $p\mathcal{R}q$  RELEASE



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# LTLf: Linear Temporal Logic on Finite Traces<sup>10</sup>

LTLf formulas reason about *finite* linear timelines *terminating at Tail*:

- finite set of atomic propositions {p q}
- Boolean connectives:  $\neg$ ,  $\land$ ,  $\lor$ , and  $\rightarrow$
- temporal connectives:



10 G. De Giacomo, M.Y. Vardi. "Linear temporal logic and linear dynamic logic on finite traces." IJCAI 2013. 🛓 🔊 🔍 🖓

# Mission-Bounded Linear Temporal Logic <sup>11</sup>

**Mission-Time Temporal Logic** (MLTL) reasons about *integer-bounded* timelines:

- finite set of atomic propositions  $\{p \ q\}$
- Boolean connectives:  $\neg,$   $\wedge,$   $\lor,$  and  $\rightarrow$
- temporal connectives with time bounds:



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# MLTL Runtime Benchmark Generation:

An Easier Problem<sup>12</sup>



MLTL formula  $\varphi$  evaluated over system trace  $\pi :$ 

 $\forall i : 0 \le i \le$ MissionTime  $\pi, i \vDash \varphi$ .

An MLTL Runtime Benchmark is a 3-tuple:

- Input stream, or computation,  $\pi$
- MLTL formula,  $\varphi$ , over *n* propositional variables
- Oracle  $\mathcal{O}$ , of  $\langle time, verdict \rangle$

 $<sup>^{12}</sup>$  J.Walling and K.Y.Rozier. "Generating System-Agnostic Runtime Verification Benchmarks from MLTL Formulas via SAT." Under Submission, 2018.

# MLTL Runtime Benchmark Generation: An Example<sup>13</sup>



MLTL formula  $\varphi$  evaluated over system trace  $\pi$ :

 $\forall i : 0 \le i \le$ MissionTime  $\pi, i \vDash \varphi$ .

#### MLTL Runtime Benchmark Example:

• 
$$\pi = a, \neg a, \neg a, a, a, a, a, a, a, a, a$$

• 
$$\varphi = \text{ALWAYS}_{[5]}(a)$$

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•  $\mathcal{O} = \langle 0, F \rangle, \langle 1, F \rangle, \langle 2, F \rangle, \langle 3, T \rangle, \langle 4, T \rangle, \dots$ 

 $<sup>^{13}</sup>$  J.Walling and K.Y.Rozier. "Generating System-Agnostic Runtime Verification Benchmarks from MLTL Formulas via SAT." Under Submission, 2018.

# MLTL Runtime Benchmark Generation: An Example<sup>13</sup>



MLTL formula  $\varphi$  evaluated over system trace  $\pi$ :

 $\forall i : 0 \leq i \leq \text{MissionTime } \pi, i \models \varphi.$ 

#### MLTL Runtime Benchmark Example:

• 
$$\pi = a, \neg a, \neg a, a, a, a, a, a, a, a, a$$

• 
$$\varphi = \text{ALWAYS}_{[5]}(a)$$

•  $\varphi = \text{ALWAYS}_{[5]}(a)$ •  $\mathcal{O} = \langle 0, F \rangle, \langle 1, F \rangle, \langle 2, F \rangle, \langle 3, T \rangle, \langle 4, T \rangle, \dots$ 

### A SAT Encoding:

Assign  $a_i$  to a at time i.

Iteratively conjunct the satisfying assignment from *i* to the formula for i + 1. Record UNSAT as  $\mathcal{O} = \langle i, F \rangle$ ; otherwise  $\langle i, T \rangle$ 

<sup>&</sup>lt;sup>13</sup>J.Walling and K.Y.Rozier. "Generating System-Agnostic Runtime Verification Benchmarks from MLTL Formulas via SAT." Under Submission, 2018. (日) (圖) (문) (문) (문)

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Open Ques	tions		

- How can we design (more) efficient MAX-SAT for MLTL?
- Can we design a MAX-SAT solver for LTL? For LTLf?

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- Can we develop heuristics specific to MAX-SAT for temporal logics?
- Can we take advantage of the intuitions inherent to this domain?

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