

# SAT Applications in Temporal Logics

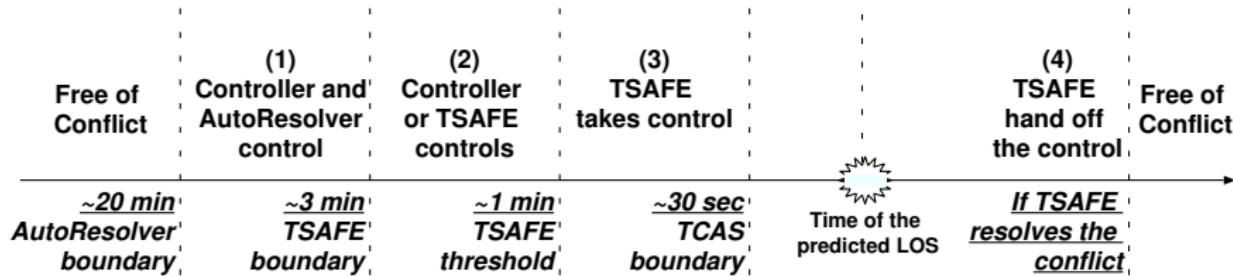
Kristin Yvonne Rozier  
Iowa State University



SAT/SMT/AR Summer School  
June 26, 2024

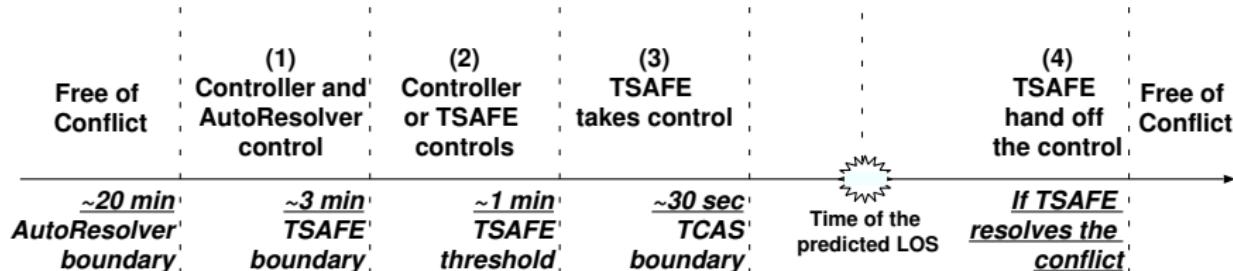


## AAC Operational Concept<sup>1</sup>



<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.

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

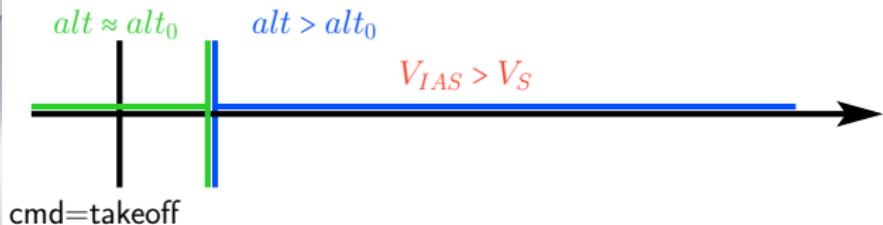
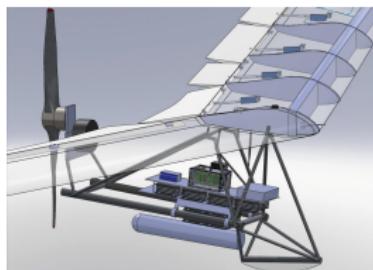


# Formal verification triggered system design changes<sup>1</sup>

<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.

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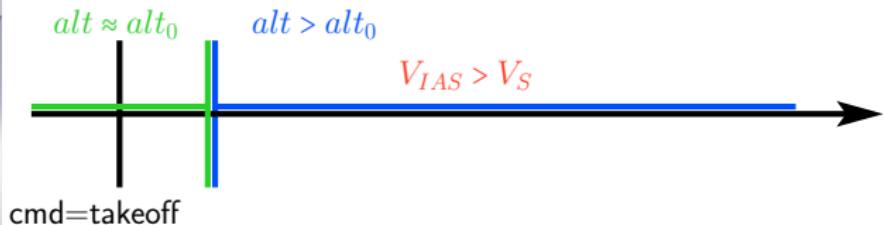
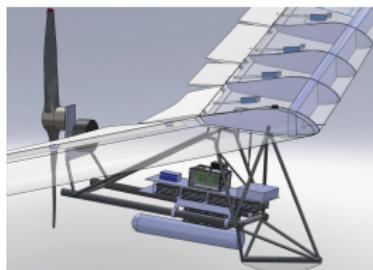
## Operational Concept for the Swift UAS



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>

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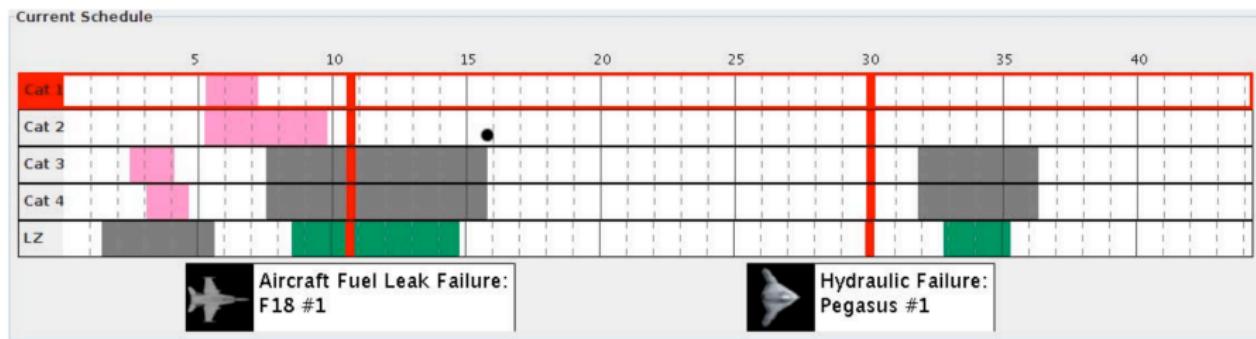


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ALWAYS(( $alt > alt_0$ )  $\rightarrow$  ( $V_{IAS} > V_S$ ))

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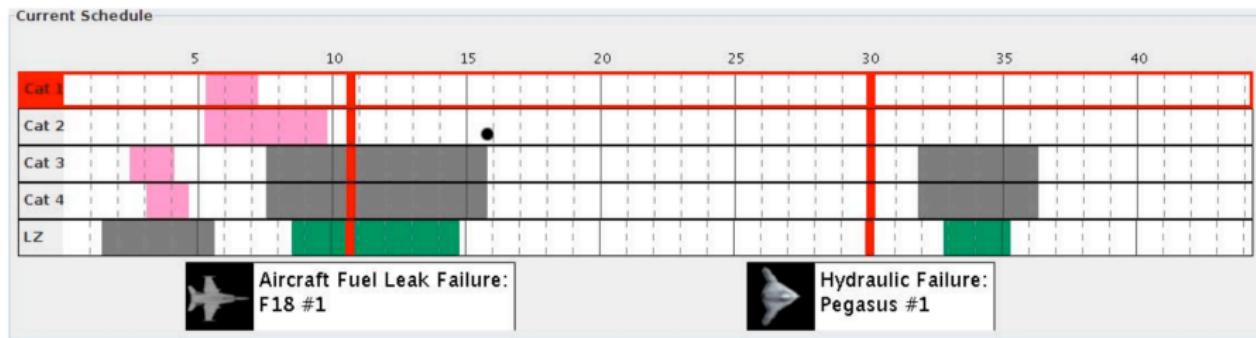
# There is a Pattern Here...



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

<sup>4</sup> J.C.Ryan, M.L.Cummings, N.Roy, A.Banerjee, A.Schulte. "Designing an Interactive Local and Global Decision Support System for Aircraft Carrier Deck Scheduling." AIAA Infotech, 2011.

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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:  $\neg, \wedge, \vee$ , and  $\rightarrow$
- temporal connectives:

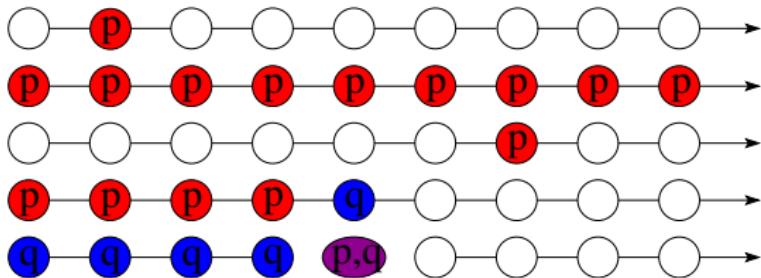
$\chi_p$       NEXT TIME

*p*      **ALWAYS**

$\diamond p$  EVENTUALLY

*pUq* UNTIL

*pRq* RELEASE



## Formal Verification Via Model Checking

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



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

# Formal Verification Via LTL Model Checking

- 1 Describe system requirements in a formal LTL specification,  $\varphi$ .
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- Graph-search-based
- BDD-based
- BMC-based
- IC3-based



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

# Formal Verification Via LTL Model Checking

1 Describe system requirements in a formal **TL** specification,  $\varphi$ .



Only works if the formula is correct!

2 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.

# Property Assurance: We Propose Satisfiability Checking

$M \models \varphi$  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.

# Property Assurance: We Propose Satisfiability Checking

$M \models \varphi$  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

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If  $\varphi$  is not satisfiable, then

- There is always a counterexample.
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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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**We need to check the conjunction of all properties for satisfiability.**

# 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!**

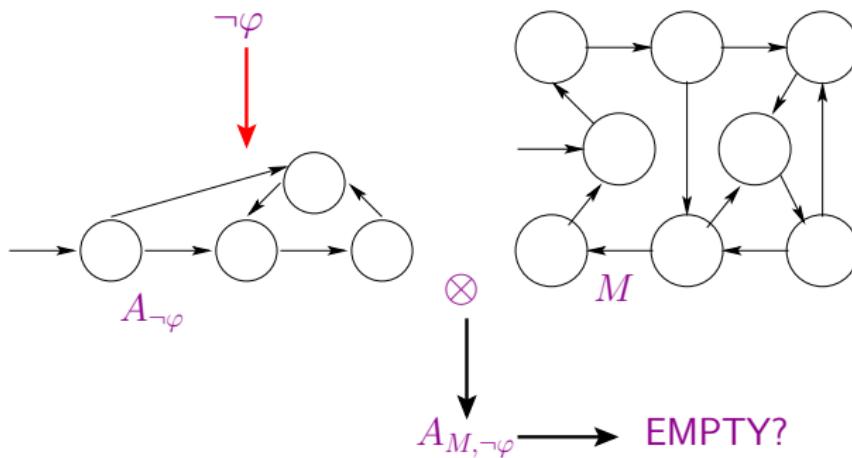
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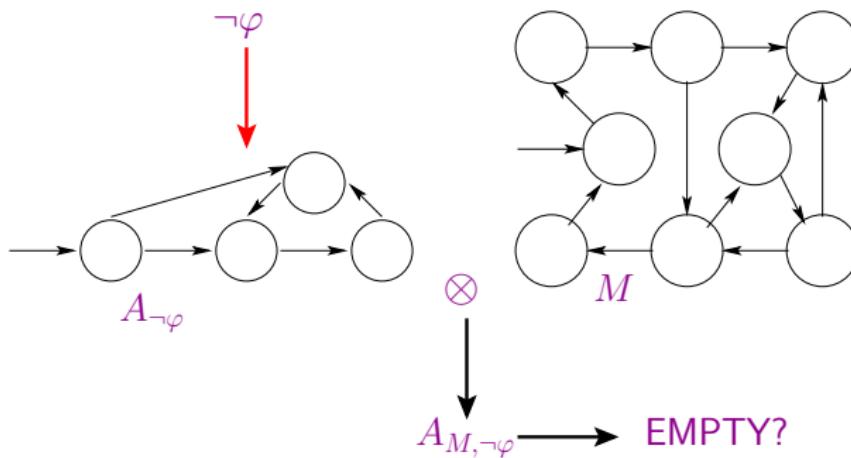
**We have to be smart about encoding the problem!**

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

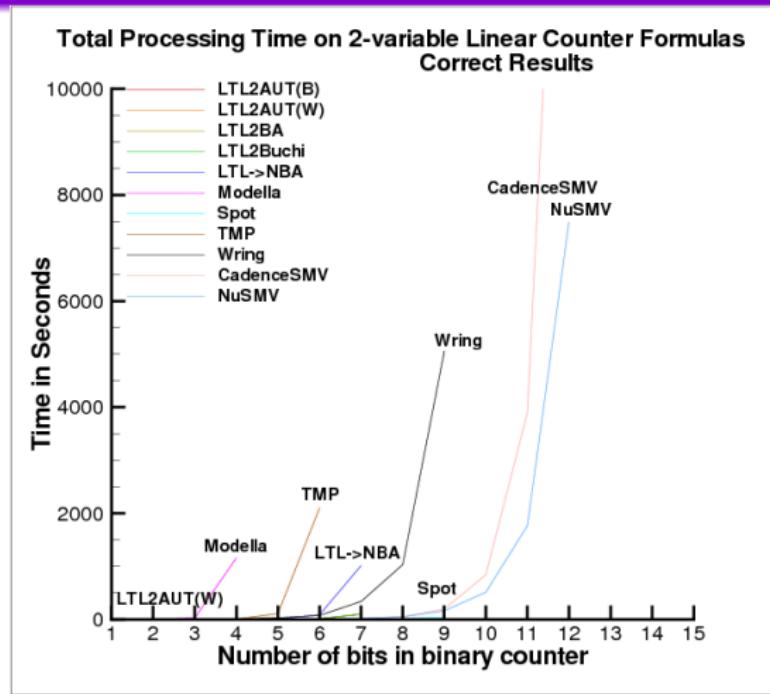


## Ex: Automata-Theoretic Approach to Model Checking: One of the PSPACE-Complete Algorithms for LTL-SAT

Requires efficient LTL-to-automaton translation.



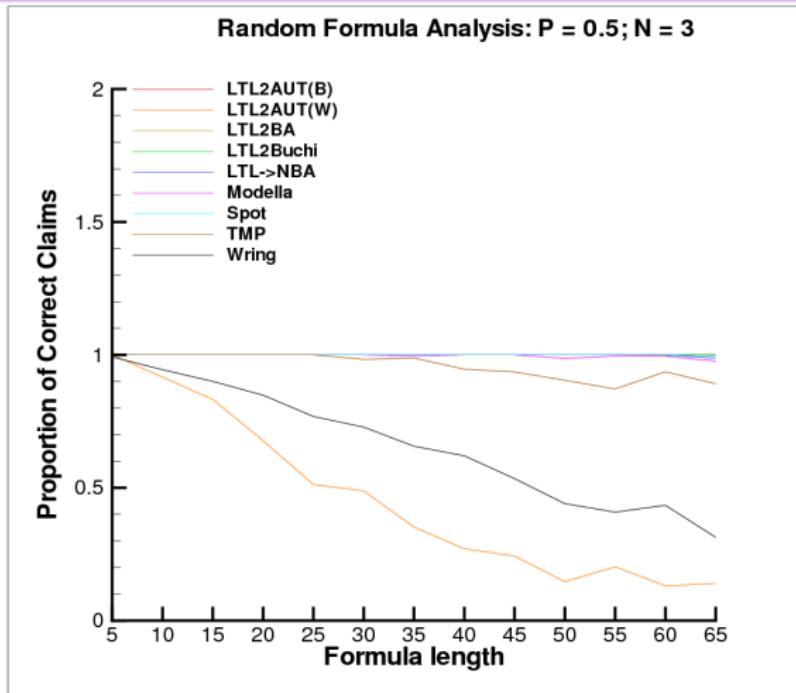
## LTL Satisfiability is Hard to Scale<sup>5</sup>



Many tools cannot check 8-bit binary counter formulas

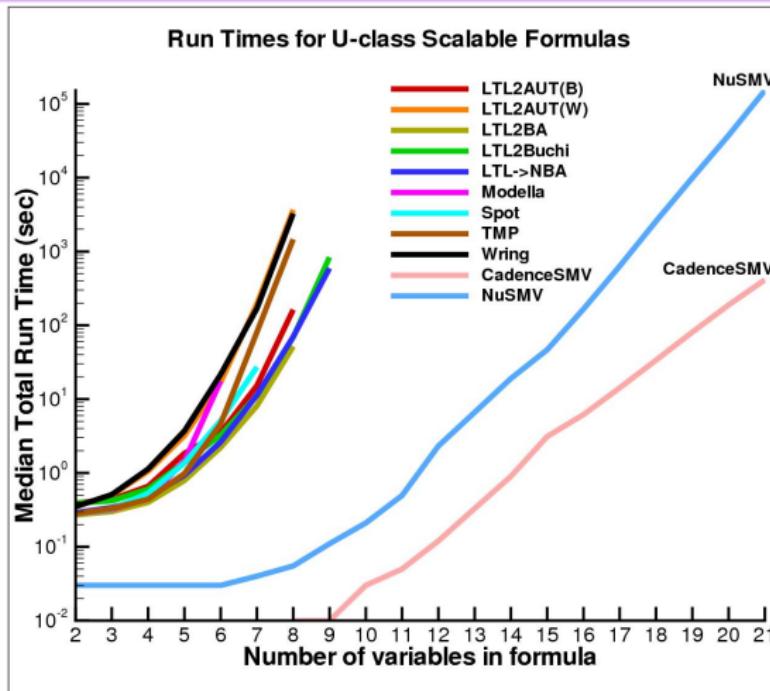
<sup>5</sup> K.Y.Rozier, M.Y.Vardi. "LTL Satisfiability Checking." STTT Journal, pg. 123-137, 2010.

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



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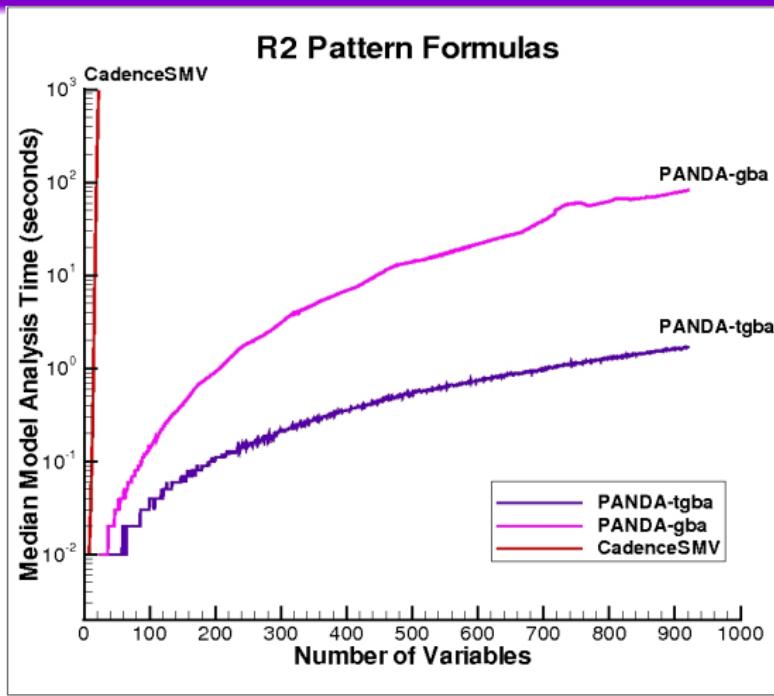
# Implementation is Hugely Influential<sup>7</sup>



<sup>7</sup>

K.Y.Rozier, M.Y.Vardi. "LTL Satisfiability Checking." STTT Journal, pg. 123-137, 2010.

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

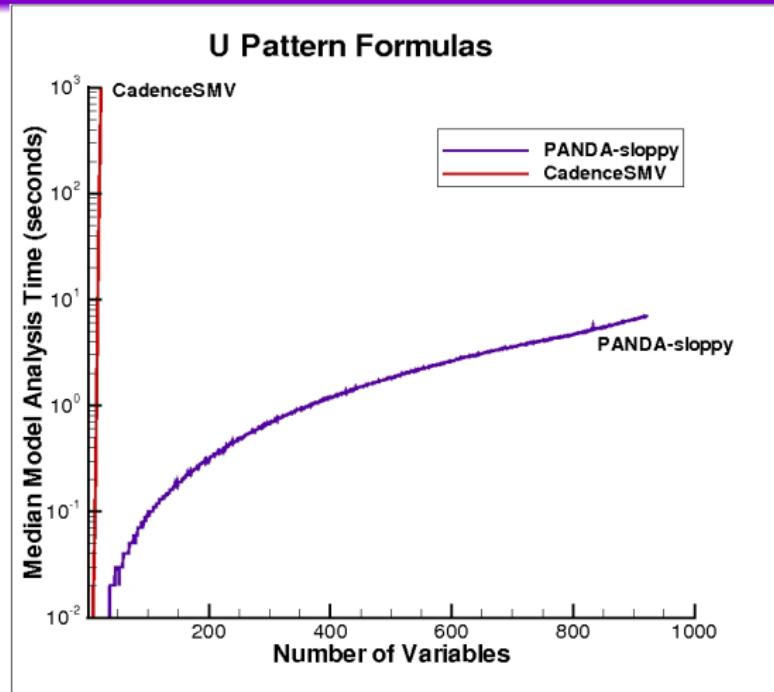


$$R_2(n) = (..(p_1 \mathcal{R} p_2) \mathcal{R} \dots) \mathcal{R} p_n.$$

<sup>8</sup>

K.Y. Rozier and M.Y. Vardi. "A Multi-Encoding Approach for LTL Symbolic Satisfiability Checking." *FM'11*.

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



$$U(n) = (\dots (p_1 \cup p_2) \cup \dots) \cup p_n.$$

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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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Is this actually required in real life?

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Yes! 10

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# LTL Satisfiability Checking Found A Specification Bug

LTL safety requirement  $\varphi_0$

LTL fairness constraint  $\varphi_1$

ALWAYS EVENTUALLY  $\varphi_1 \rightarrow \varphi_0$

An overstrict  $\varphi_1$  can effectively cause  $\varphi_0$  to be valid!

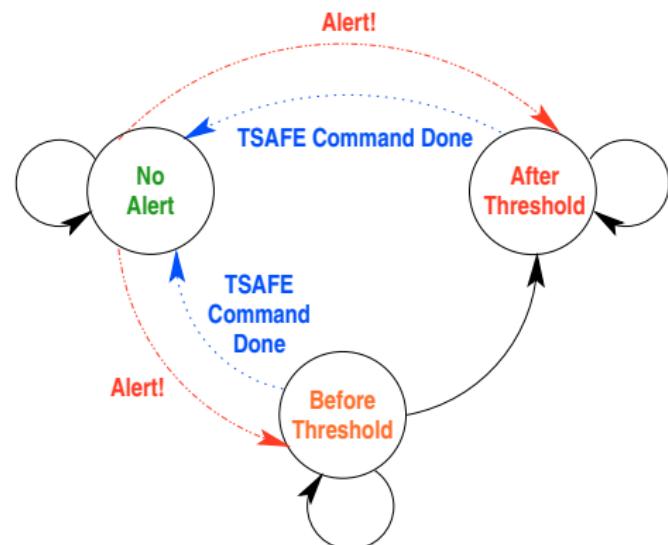
## Example:

Safety Requirement: "All TSAFE alerts will be eventually resolved."

Fairness Constraint: Progress between TSAFE alerts

Wrong: FAIRNESS (TSAFE\_Alert = Non);

Right: FAIRNESS (TSAFE\_Alert != AT);



## LTL-SAT Problem Examples

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

<sup>11</sup> G. Hariharan, P. H. Jones, K. Y. Rozier, T. Wongpiromsarn. "Maximum Satisfiability in Mission-time Linear Temporal Logic." FORMATS, 2023.

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## LTL-SAT Problem Examples

- **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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These are all MAX-SAT!<sup>1112</sup>

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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:  $\neg, \wedge, \vee$ , and  $\rightarrow$
- temporal connectives:

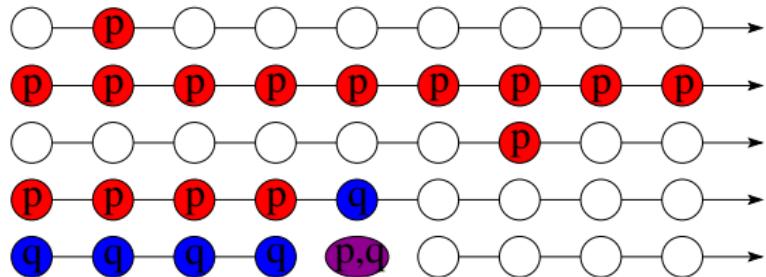
$\chi p$       **NEXT TIME**

$\Box p$       **ALWAYS**

$\Diamond p$       **EVENTUALLY**

$p \mathcal{U} q$       **UNTIL**

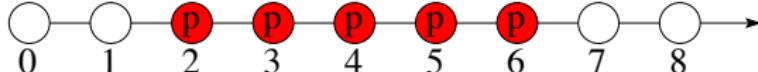
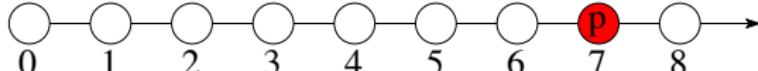
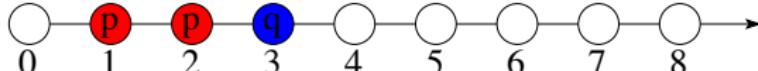
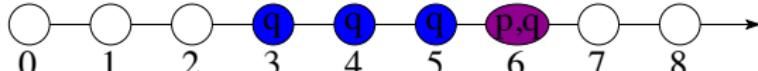
$p \mathcal{R} q$       **RELEASE**



# MLTL: A Good Specification Language<sup>13</sup>

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

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

Symbol	Operator	Timeline
$\Box_{[2,6]} p$	ALWAYS <sub>[2,6]</sub>	
$\Diamond_{[0,7]} p$	EVENTUALLY <sub>[0,7]</sub>	
$p \mathcal{U}_{[1,5]} q$	UNTIL <sub>[1,5]</sub>	
$p \mathcal{R}_{[3,8]} q$	RELEASE <sub>[3,8]</sub>	

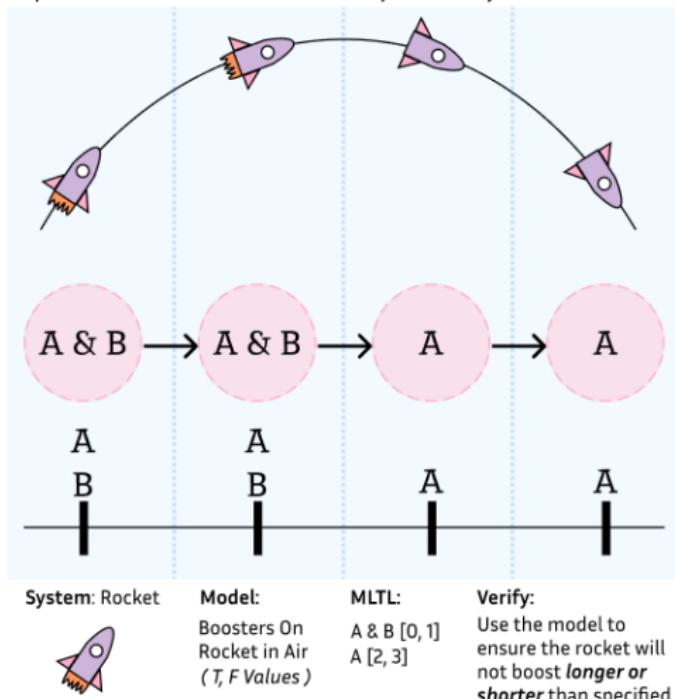
<sup>13</sup> T. Reinbacher, K.Y. Rozier, J. Schumann. "Temporal-Logic Based Runtime Observer Pairs for System Health Management of Real-Time Systems." TACAS 2014.

## Mission-Time Linear Temporal Logic

## A: The Rocket is Off the Ground

### B: The Rockets Boosters are Active

Specification: A and B hold for 2 time steps. Then only A holds.



# MLTL Runtime Benchmark Generation: An Easier Problem<sup>14</sup>

Time:  1 2 3 4 5 6 7 8 9

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

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

An MLTL Runtime Benchmark is a 3-tuple:

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

<sup>14</sup>J.Wallin and K.Y.Rozier. "Generating System-Agnostic Runtime Verification Benchmarks from MLTL Formulas via SAT." Under Submission, 2018.

## MLT Runtime Benchmark Generation: An Example<sup>15</sup>

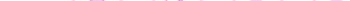
Time:	a	$\neg a$	$\neg a$	a	a	a	a	a	a	a
	0	1	2	3	4	5	6	7	8	9

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

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

## MLTL Runtime Benchmark Example:

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

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# MLTL Runtime Benchmark Generation: An Example<sup>15</sup>

Time: 

a	$\neg a$	$\neg a$	a	a	a	a	a	a	a
0	1	2	3	4	5	6	7	8	9

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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  $\langle i, T \rangle$

---

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## MLT Runtime Benchmark Generation: An Example<sup>15</sup>

Time:	a	$\neg a$	$\neg a$	a	a	a	a	a	a	a
	0	1	2	3	4	5	6	7	8	9

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

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## So where do we use this IRL?

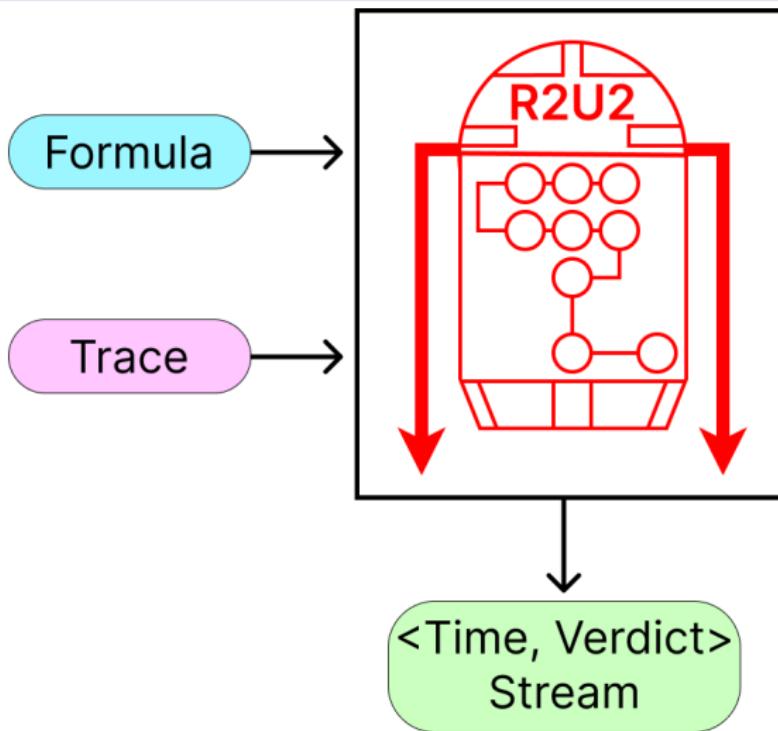
<sup>15</sup>J.Wallin and K.Y.Rozier. "Generating System-Agnostic Runtime Verification Benchmarks from MLTL Formulas via SAT." Under Submission, 2018.

# NASA Lunar Gateway: Assume-Guarantee Contracts<sup>16</sup>



$$(CMD == START) \rightarrow (\square_{[0,5]}(ActionHappens \& \square_{[0,2]}(CMD = END)))$$

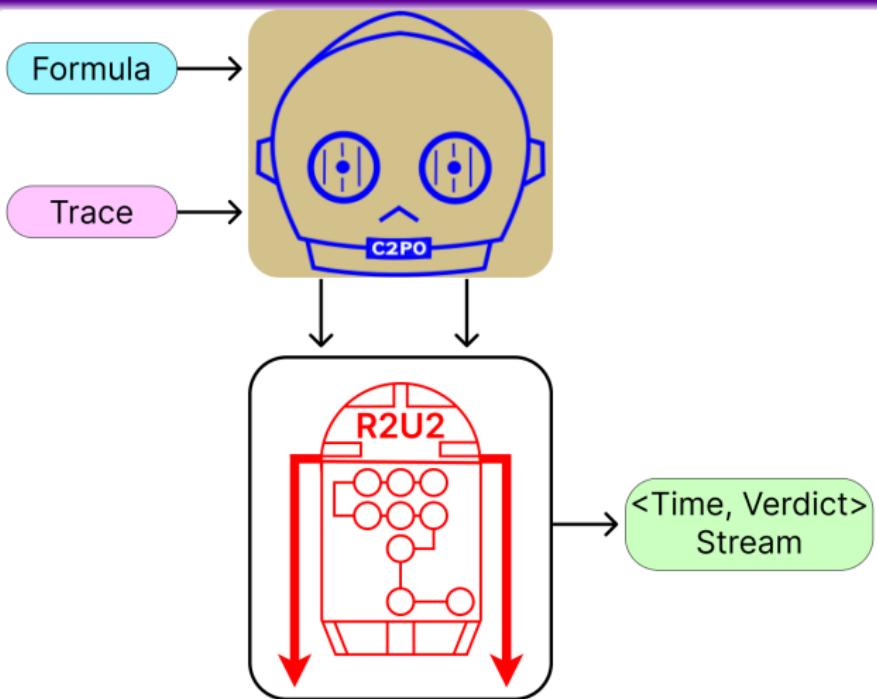
<sup>16</sup> Dabney, James B., Julia M. Badger, and Pavan Rajagopal. "Adding a Verification View for an Autonomous Real-Time System Architecture." In AIAA Scitech 2021 Forum, p. 0566. 2021.



17 18

<sup>17</sup> K. Y. Rozier, J. Schumann. "R2U2: Tool Overview." RV-CUBES, 2017.

<sup>18</sup>T. Reinbacher, K. Y. Rozier, J. Schumann. "Temporal-Logic Based Runtime Observer Pairs for System Health Management of Real-Time Systems." TACAS, 2014.

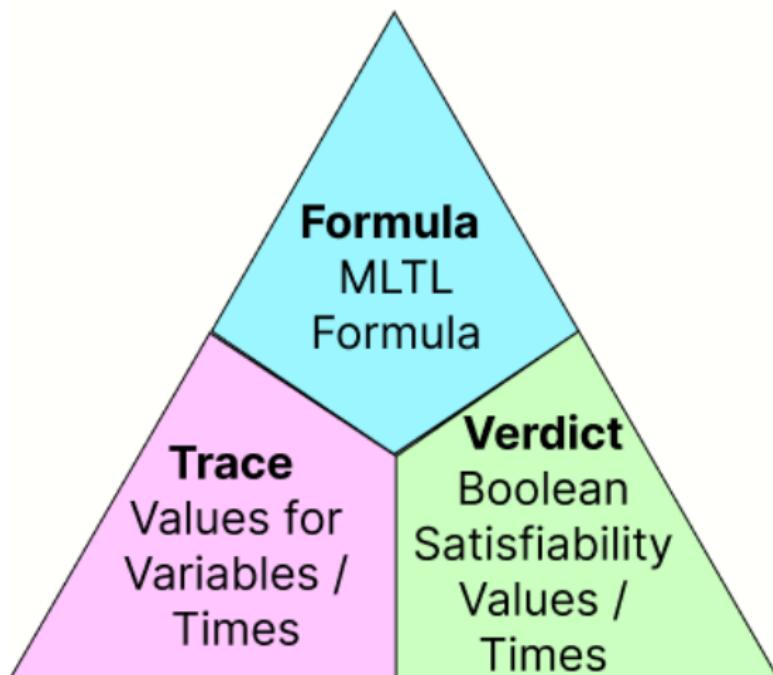


19 20

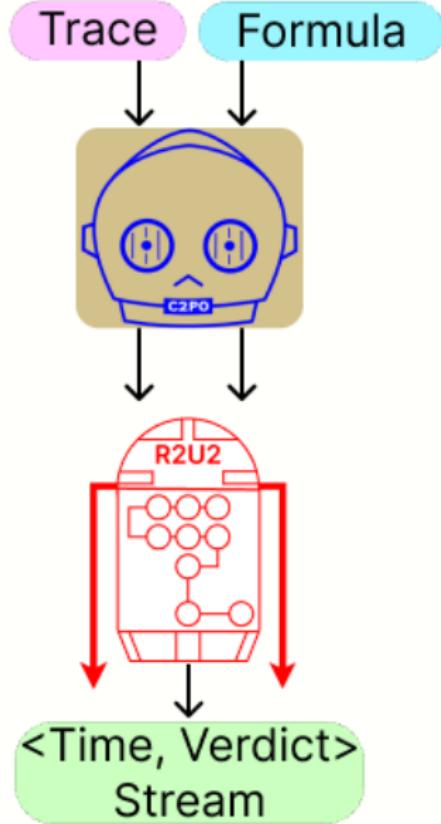
19 C. Johannsen, P. H. Jones, B. Kempa, K. Y. Rozier, P. Zhang. "R2U2 Version 3.0: Re-imagining a Toolchain for Specification, Resource Estimation, and Optimized Observer Generation for Runtime Verification in Hardware and Software." CAV, 2023.

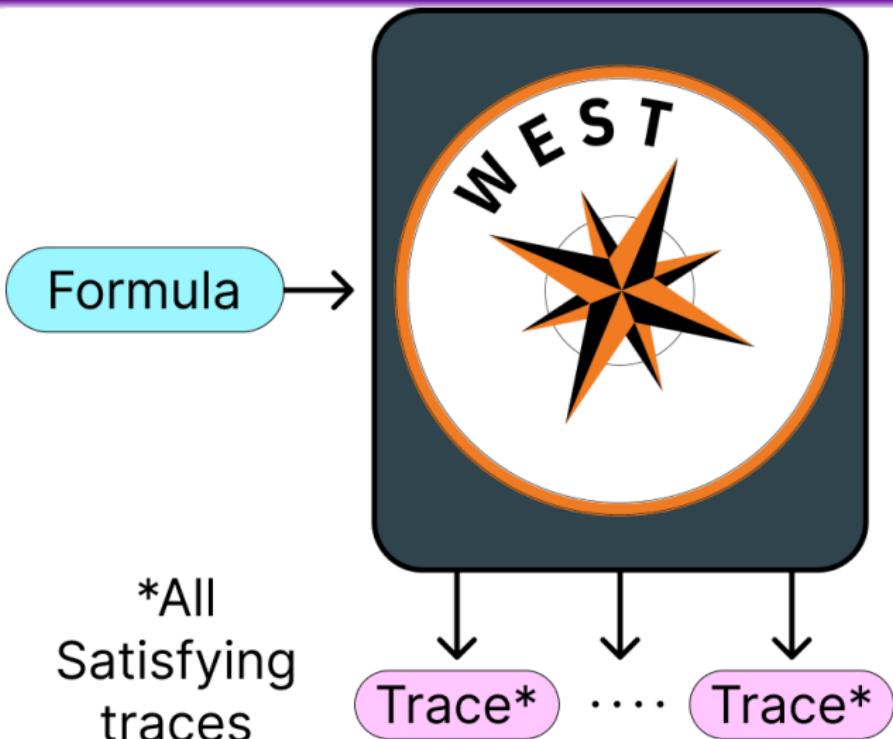
20 C. Johannsen, B. Kempa, P. H. Jones, K. Y. Rozier, T. Wongpiromsarn. "Impossible Made Possible: Encoding Intractable Specifications via Implied Domain Constraints." FMICS, 2023.



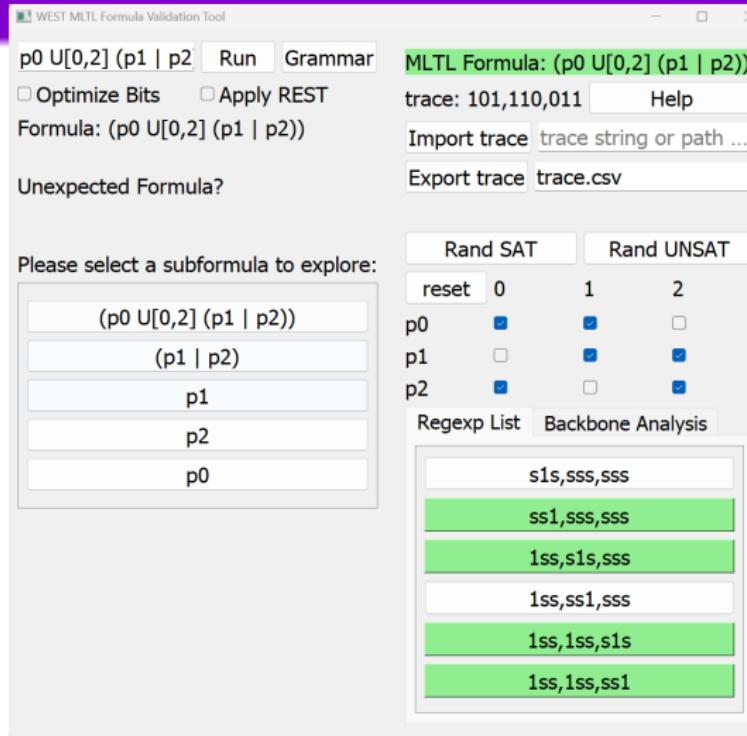


Given any 2 you can find the 3<sup>rd</sup>

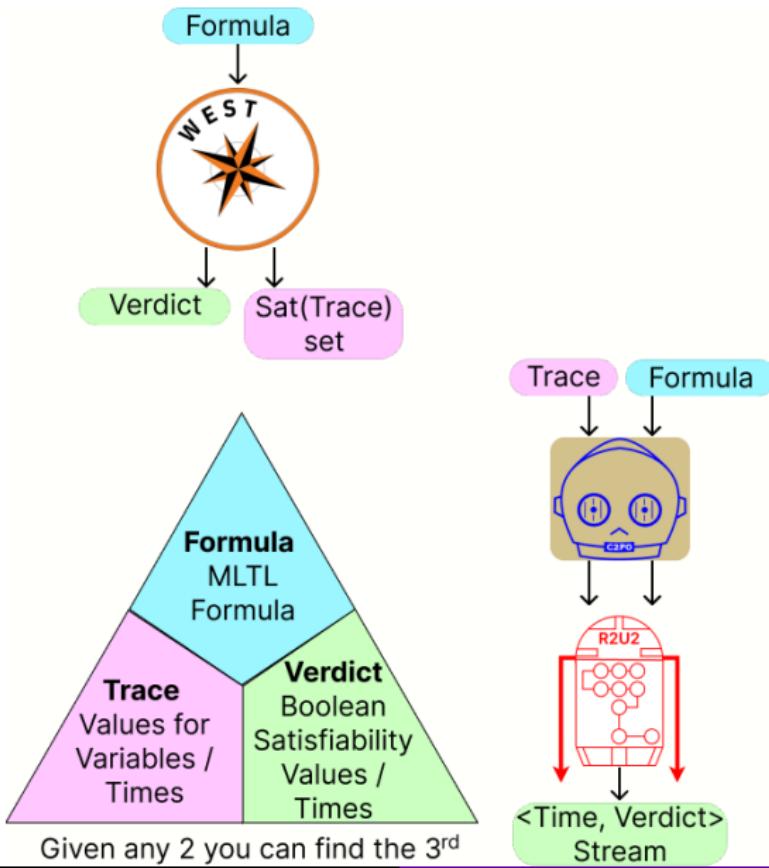


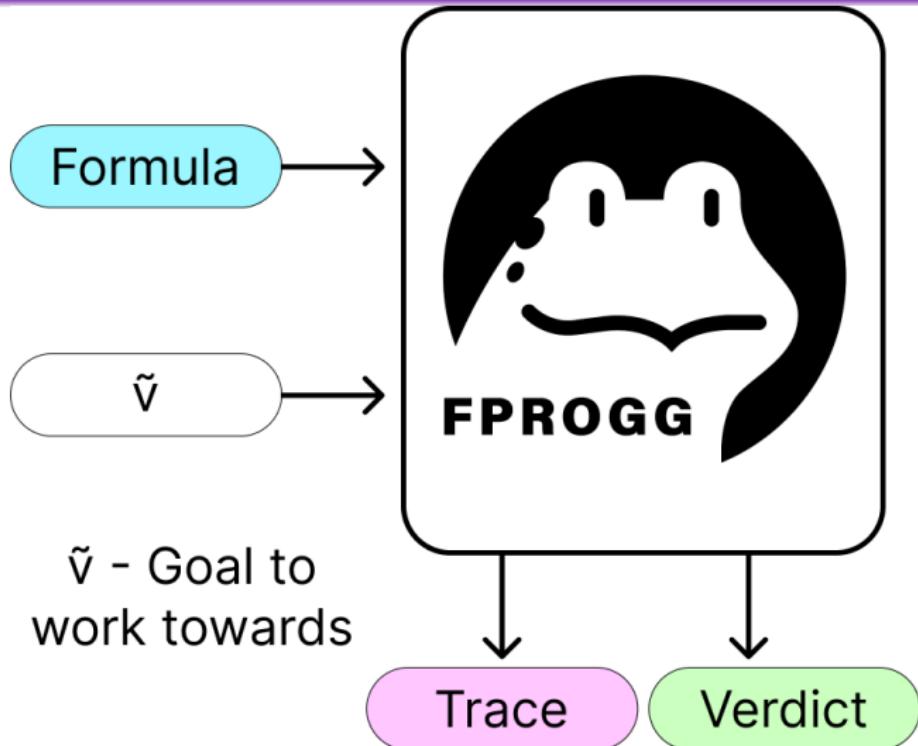


## WEST 22



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MLTL Toolbox Structure & Connections

