



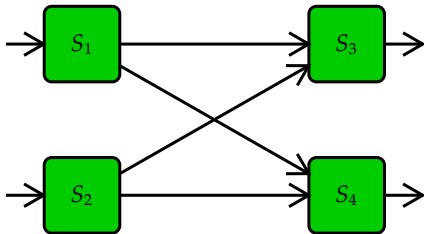
Runtime Verification for Hybrid Systems?

Martin Leucker

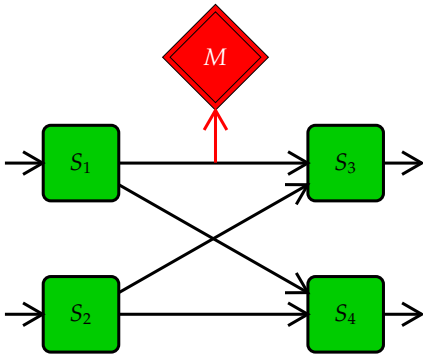
Institute for Software Engineering
Universität zu Lübeck

Beijing, Tuesday 24th of September 2013

Runtime Verification (RV)

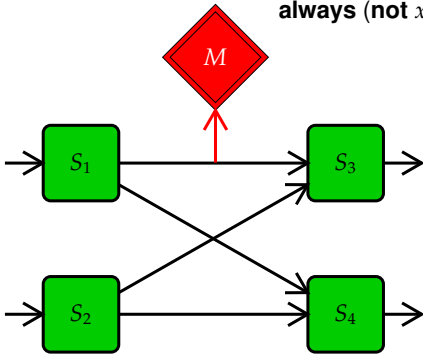


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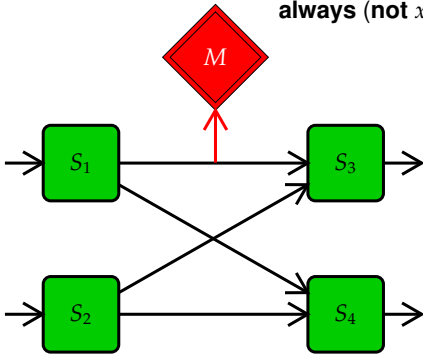
Runtime Verification (RV)

always (not $x > 0$ implies next $x > 0$)



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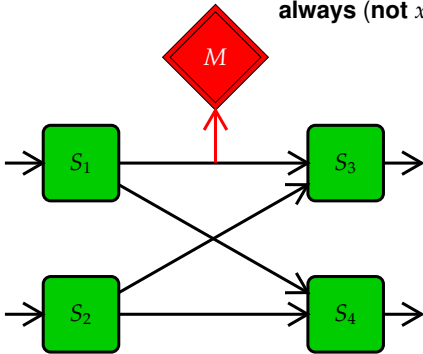


Characterisation

- ▶ Verifies (partially) correctness properties based on actual executions

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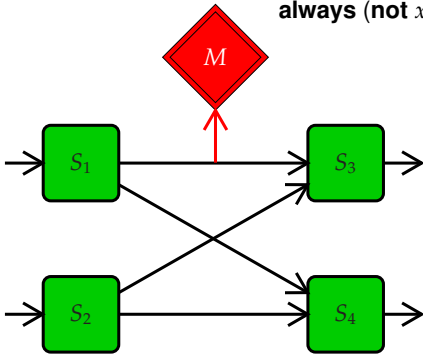


Characterisation

- ▶ Verifies (partially) correctness properties based on actual executions
- ▶ **Simple** verification technique

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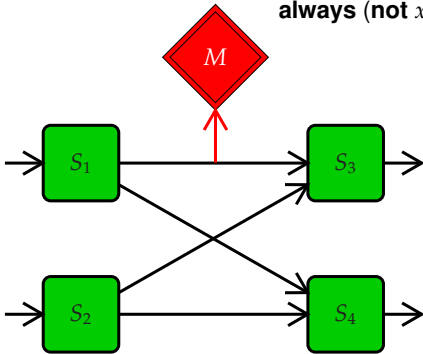


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- ▶ Complementing

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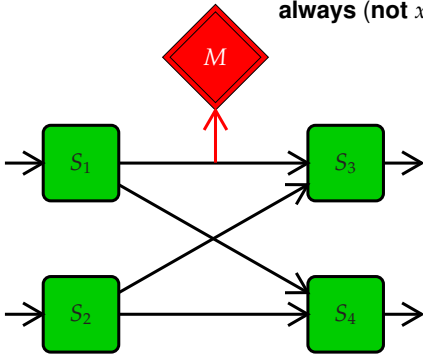


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- ▶ Verifies (partially) correctness properties based on actual executions
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- ▶ Complementing
 - ▶ **Model Checking**

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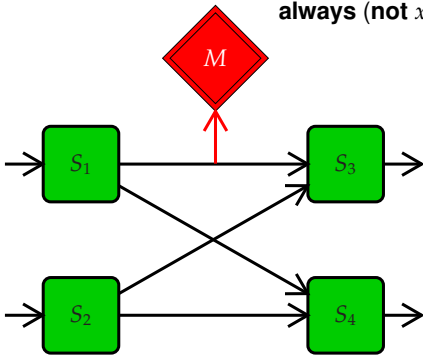


Characterisation

- ▶ Verifies (partially) correctness properties based on actual executions
- ▶ **Simple** verification technique
- ▶ Complementing
 - ▶ **Model Checking**
 - ▶ **Testing**

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Characterisation

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- ▶ **Simple** verification technique
- ▶ Complementing
 - ▶ **Model Checking**
 - ▶ **Testing**
- ▶ Formal: $w \in \mathcal{L}(\varphi)$

Model Checking

- ▶ Specification of System

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Do all runs of the system satisfy the specification

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 - ▶ as transition system S with runs $\mathcal{L}(S)$
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Do all runs of the system satisfy the specification
 - ▶ $\mathcal{L}(S) \subseteq \mathcal{L}(\varphi)$

Model Checking versus RV

- ▶ Model Checking: **infinite words**

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- ▶ Runtime Verification: **finite words**

Model Checking versus RV

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- ▶ Runtime Verification: also **Black-Box-Systems**

Testing

Testing: Input/Output Sequence

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Testing: with Oracle

- ▶ **test case**: finite sequence of input actions
- ▶ **test oracle**: monitor
- ▶ **test execution**: send test cases, let oracle report violations
- ▶ **similar to runtime verification**

Testing versus RV

- ▶ Test oracle **manual**

Testing versus RV

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- ▶ RV monitor **from high-level specification (LTL)**

Testing versus RV

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- ▶ Testing:

*How to find **good test suites**?*

Testing versus RV

- ▶ Test oracle **manual**
- ▶ RV monitor **from high-level specification (LTL)**
- ▶ Testing:
*How to find **good test suites?***
- ▶ Runtime Verification:
*How to generate **good monitors?***

Outline

Runtime Verification

Runtime Verification for LTL

LTL over Finite, Completed Words

LTL over Finite, Non-Completed Words: Impartiality

LTL over Non-Completed Words: Anticipation

LTL over Infinite Words: With Anticipation

Monitorable Properties

LTL with a Predictive Semantics

LTL wrap-up

RV with Data

Simple arithmetic computations

Generalisations: LTL with modulo Constraints

Stream-based Approaches: LoLa

Lifting the LTL approach

RV for hybrid systems

Quantitive Measures on the execution

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Runtime Verification

Definition (Runtime Verification)

Runtime verification is the discipline of computer science that deals with the study, development, and application of those verification techniques that allow checking whether a *run* of a system under scrutiny (SUS) satisfies or violates a given correctness property.

Its distinguishing research effort lies in *synthesizing monitors from high level specifications*.

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Definition (Monitor)

A **monitor** is a device that reads a finite trace and yields a certain **verdict**.

A verdict is typically a truth value from some truth domain.

Taxonomy



Presentation outline

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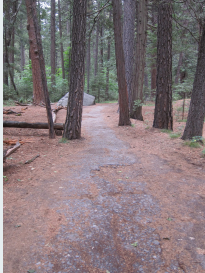
Runtime Verification for LTL

Observing executions/runs



Runtime Verification for LTL

Observing executions/runs



Idea

Specify correctness properties in LTL

Runtime Verification for LTL

Observing executions/runs



Idea

Specify correctness properties in LTL

Commercial

Specify correctness properties in Regular LTL

Runtime Verification for LTL

Definition (Syntax of LTL formulae)

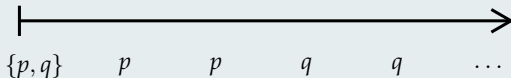
Let p be an atomic proposition from a finite set of atomic propositions AP. The set of LTL formulae, denoted with LTL, is inductively defined by the following grammar:

$$\begin{aligned} \varphi ::= & \text{true} \mid p \mid \varphi \vee \varphi \mid \varphi U \varphi \mid X\varphi \mid \\ & \text{false} \mid \neg p \mid \varphi \wedge \varphi \mid \varphi R \varphi \mid \bar{X}\varphi \mid \\ & \neg\varphi \end{aligned}$$

Linear-time Temporal Logic (LTL)

Semantics

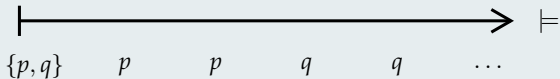
over $w \in (2^{AP})^\omega = \Sigma^\omega$



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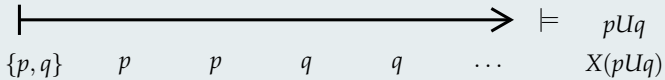
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Linear-time Temporal Logic (LTL)

Semantics

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$\{p, q\}$

p

p

q

q

\dots

\models

p



$\neg p$

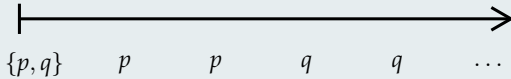
$p \cup q$

$X(p \cup q)$

Linear-time Temporal Logic (LTL)

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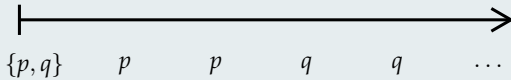


p	✓
$\neg p$	✗
$p \cup q$	
$X(p \cup q)$	

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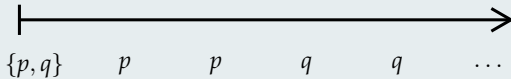


p	✓
$\neg p$	✗
pUq	✓
$X(pUq)$	

Linear-time Temporal Logic (LTL)

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p	✓
$\neg p$	✗
$p \cup q$	✓
$X(p \cup q)$	✓

Linear-time Temporal Logic (LTL)

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Abbreviation

$F\varphi \equiv \text{true}U\varphi$ $G\varphi \equiv \neg F\neg\varphi$

Linear-time Temporal Logic (LTL)

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Abbreviation

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Example

$G\neg(\text{critic}_1 \wedge \text{critic}_2), G(\neg\text{alive} \rightarrow X\text{alive})$

LTL on infinite words

Definition (LTL semantics (traditional))

Semantics of LTL formulae over an infinite word $w = a_0a_1 \dots \in \Sigma^\omega$, where

$$w^i = a_i a_{i+1} \dots$$

$$w \models \text{true}$$

$$w \models p \quad \text{if } p \in a_0$$

$$w \models \neg p \quad \text{if } p \notin a_0$$

$$w \models \neg \varphi \quad \text{if } \text{not } w \models \varphi$$

$$w \models \varphi \vee \psi \quad \text{if } w \models \varphi \text{ or } w \models \psi$$

$$w \models \varphi \wedge \psi \quad \text{if } w \models \varphi \text{ and } w \models \psi$$

$$w \models X\varphi \quad \text{if } w^1 \models \varphi$$

$$w \models \bar{X}\varphi \quad \text{if } w^1 \not\models \varphi$$

$$w \models \varphi U \psi \quad \text{if } \text{there is } k \text{ with } 0 \leq k < |w|: w^k \models \psi \\ \text{and for all } l \text{ with } 0 \leq l < k \ w^l \not\models \varphi$$

$$w \models \varphi R \psi \quad \text{if } \text{for all } k \text{ with } 0 \leq k < |w|: (w^k \models \psi \\ \text{or there is } l \text{ with } 0 \leq l < k \ w^l \models \varphi)$$

LTL for the working engineer??

Simple??

“LTL is for theoreticians—but for practitioners?”

LTL for the working engineer??

Simple??

“LTL is for theoreticians—but for practitioners?”

SALT

Structured Assertion Language for Temporal Logic

“Syntactic Sugar for LTL” [Bauer, L., Streit@ICFEM'06]



SALT – <http://www.isp.uni-luebeck.de/salt>



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SALT - Smart Assertion Language for Temporal Logic

SALT

Goal

Do you want to specify the behavior of your program in a rigorously yet comfortable manner?
Do you see the benefits of temporal specifications but are bothered by the awkward formalisms available?
Do you want to use

- the power of a *Model Checker* to improve the quality of your systems or
- the powerful runtime reflection approach for bug hunting and elimination

Runtime Verification for LTL

Idea

Specify correctness properties in LTL

Definition (Syntax of LTL formulae)

Let p be an atomic proposition from a finite set of atomic propositions AP. The set of LTL formulae, denoted with LTL, is inductively defined by the following grammar:

$$\begin{aligned} \varphi ::= & \text{true} \mid p \mid \varphi \vee \varphi \mid \varphi \mathbf{U} \varphi \mid \mathbf{X}\varphi \mid \\ & \text{false} \mid \neg p \mid \varphi \wedge \varphi \mid \varphi \mathbf{R} \varphi \mid \bar{\mathbf{X}}\varphi \mid \\ & \neg\varphi \end{aligned}$$

Truth Domains

Lattice

- ▶ A **lattice** is a partially ordered set $(\mathcal{L}, \sqsubseteq)$ where for each $x, y \in \mathcal{L}$, there exists
 1. a unique **greatest lower bound** (glb), which is called the **meet** of x and y , and is denoted with $x \sqcap y$, and
 2. a unique **least upper bound** (lub), which is called the **join** of x and y , and is denoted with $x \sqcup y$.
- ▶ A lattice is called **finite** iff \mathcal{L} is finite.
- ▶ Every finite lattice has a well-defined unique least element, called **bottom**, denoted with \perp ,
- ▶ and analogously a greatest element, called **top**, denoted with \top .

Truth Domains (cont.)

Lattice (cont.)

- ▶ A lattice is **distributive**, iff $x \sqcap (y \sqcup z) = (x \sqcap y) \sqcup (x \sqcap z)$, and, dually, $x \sqcup (y \sqcap z) = (x \sqcup y) \sqcap (x \sqcup z)$.
- ▶ In a **de Morgan** lattice, every element x has a unique **dual** element \bar{x} , such that $\bar{\bar{x}} = x$ and $x \sqsubseteq y$ implies $\bar{y} \sqsubseteq \bar{x}$.

Definition (Truth domain)

We call \mathcal{L} a **truth domain**, if it is a finite distributive de Morgan lattice.

LTl's semantics using truth domains

Definition (LTl semantics (common part))

Semantics of LTl formulae over a finite or infinite word $w = a_0 a_1 \dots \in \Sigma^\infty$

Boolean constants

Boolean combinations

$$[w \models \text{true}]_{\Sigma} = \top$$

$$[w \models \text{false}]_{\Sigma} = \perp$$

$$[w \models \neg \varphi]_{\Sigma} = \overline{[w \models \varphi]_{\Sigma}}$$

$$[w \models \varphi \vee \psi]_{\Sigma} = [w \models \varphi]_{\Sigma} \sqcup [w \models \psi]_{\Sigma}$$

$$[w \models \varphi \wedge \psi]_{\Sigma} = [w \models \varphi]_{\Sigma} \sqcap [w \models \psi]_{\Sigma}$$

atomic propositions

$$[w \models p]_{\Sigma} = \begin{cases} \top & \text{if } p \in a_0 \\ \perp & \text{if } p \notin a_0 \end{cases}$$

$$[w \models \neg p]_{\Sigma} = \begin{cases} \top & \text{if } p \notin a_0 \\ \perp & \text{if } p \in a_0 \end{cases}$$

next X/weak next X **TBD**

until/release

$$[w \models \varphi U \psi]_{\Sigma} = \begin{cases} \top & \text{there is a } k, 0 \leq k < |w| : [w^k \models \psi]_{\Sigma} = \top \text{ and} \\ & \text{for all } l \text{ with } 0 \leq l < k : [w^l \models \varphi] = \top \\ \text{TBD} & \text{else} \end{cases}$$

$$\varphi R \psi \equiv \neg(\neg \varphi U \neg \psi)$$

Outline

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LTL over Finite, Completed Words

LTL over Finite, Non-Completed Words: Impartiality

LTL over Non-Completed Words: Anticipation

LTL over Infinite Words: With Anticipation

Monitorable Properties

LTL with a Predictive Semantics

LTL wrap-up

RV with Data

Simple arithmetic computations

Generalisations: LTL with modulo Constraints

Stream-based Approaches: LoLa

Lifting the LTL approach

RV for hybrid systems

Quantitive Measures on the execution

Conclusion

LTL on finite words

Application area: Specify properties of finite word



LTL on finite words

Definition (FLTL)

Semantics of FLTL formulae over a word $u = a_0 \dots a_{n-1} \in \Sigma^*$

next

$$[u \models X\varphi]_F = \begin{cases} [u^1 \models \varphi]_F & \text{if } u^1 \neq \epsilon \\ \perp & \text{otherwise} \end{cases}$$

weak next

$$[u \models \bar{X}\varphi]_F = \begin{cases} [u^1 \models \varphi]_F & \text{if } u^1 \neq \epsilon \\ \top & \text{otherwise} \end{cases}$$



Monitoring LTL on finite words

(Bad) Idea

just compute semantics. . .

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LTL on finite, but not completed words

Application area: Specify properties of finite but expanding word



LTL on finite, but not completed words

Be Impartial!

- ▶ go for a final verdict (\top or \perp) only if you really know

LTL on finite, but not completed words

Be Impartial!

- ▶ go for a final verdict (\top or \perp) only if you really know
- ▶ be a man: stick to your word

LTL on finite, but not complete words

Impartiality implies multiple values

Every two-valued logic is not impartial.

Definition (FLTL)

Semantics of FLTL formulae over a word $u = a_0 \dots a_{n-1} \in \Sigma^*$

next

$$[u \models X\varphi]_F = \begin{cases} [u^1 \models \varphi]_F & \text{if } u^1 \neq \epsilon \\ \perp^p & \text{otherwise} \end{cases}$$

weak next

$$[u \models \bar{X}\varphi]_F = \begin{cases} [u^1 \models \varphi]_F & \text{if } u^1 \neq \epsilon \\ \top^p & \text{otherwise} \end{cases}$$

Monitoring LTL on finite but expanding words

Left-to-right!



Monitoring LTL on finite but expanding words

Rewriting

Idea: Use rewriting of formula

Evaluating FLTL4 for each subsequent letter

- ▶ evaluate atomic propositions
- ▶ evaluate next-formulas
- ▶ that's it thanks to

$$\varphi U \psi \equiv \psi \vee (\varphi \wedge X\varphi U \psi)$$

and

$$\varphi R \psi \equiv \psi \wedge (\varphi \vee \bar{X}\varphi R \psi)$$

- ▶ and remember what to evaluate for the next letter

Evaluating FLTL4 for each subsequent letter

Pseudo Code

```
evalFLTL4 true   a = ( $\top$ ,  $\top$ )
evalFLTL4 false  a = ( $\perp$ ,  $\perp$ )
evalFLTL4 p      a = ((p in a), (p in a))
evalFLTL4  $\neg\varphi$  a = let (valPhi, phiRew) = evalFLTL4  $\varphi$  a
                       in ( $\overline{\text{valPhi}}$ ,  $\neg\text{phiRew}$ )
evalFLTL4  $\varphi \vee \psi$  a = let
                       (valPhi, phiRew) = evalFLTL4  $\varphi$  a
                       (valPsi, psiRew) = evalFLTL4  $\psi$  a
                       in (valPhi  $\sqcup$  valPsi, phiRew  $\vee$  psiRew)
evalFLTL4  $\varphi \wedge \psi$  a = let
                       (valPhi, phiRew) = evalFLTL4  $\varphi$  a
                       (valPsi, psiRew) = evalFLTL4  $\psi$  a
                       in (valPhi  $\sqcap$  valPsi, phiRew  $\wedge$  psiRew)
evalFLTL4  $\varphi U \psi$  a = evalFLTL4  $\psi \vee (\varphi \wedge X(\varphi U \psi))$  a
evalFLTL4  $\varphi R \psi$  a = evalFLTL4  $\psi \wedge (\varphi \vee \bar{X}(\varphi R \psi))$  a
evalFLTL4  $X\varphi$      a = ( $\perp^p$ ,  $\varphi$ )
evalFLTL4  $\bar{X}\varphi$     a = ( $\top^p$ ,  $\varphi$ )
```

Monitoring LTL on finite but expanding words

Automata-theoretic approach

- ▶ Synthesize automaton
- ▶ Monitoring = stepping through automaton

Rewriting vs. automata

Rewriting function defines transition function

```

evalFLTL4 true  a = (⊤, ⊤)
evalFLTL4 false a = (⊥, ⊥)
evalFLTL4 p     a = ((p in a), (p in a))
evalFLTL4 ¬φ    a = let (valPhi, phiRew) = evalFLTL4 φ a
                   in (valPhi, ¬phiRew)
evalFLTL4 φ ∨ ψ a = let
                   (valPhi, phiRew) = evalFLTL4 φ a
                   (valPsi, psiRew) = evalFLTL4 ψ a
                   in (valPhi ⊔ valPsi, phiRew ∨ psiRew)
evalFLTL4 φ ∧ ψ a = let
                   (valPhi, phiRew) = evalFLTL4 φ a
                   (valPsi, psiRew) = evalFLTL4 ψ a
                   in (valPhi ⊓ valPsi, phiRew ∧ psiRew)
evalFLTL4 φ U ψ a = evalFLTL4 ψ ∨ (φ ∧ X(φ U ψ)) a
evalFLTL4 φ R ψ a = evalFLTL4 ψ ∧ (φ ∨ X̄(φ R ψ)) a
evalFLTL4 Xφ    a = (⊥p, φ)
evalFLTL4 X̄φ    a = (⊤p, φ)
  
```

Automata-theoretic approach

The roadmap

- ▶ alternating Mealy machines

Automata-theoretic approach

The roadmap

- ▶ alternating Mealy machines
- ▶ Moore machines

Automata-theoretic approach

The roadmap

- ▶ alternating Mealy machines
- ▶ Moore machines
- ▶ alternating machines

Automata-theoretic approach

The roadmap

- ▶ alternating Mealy machines
- ▶ Moore machines
- ▶ alternating machines
- ▶ non-deterministic machines

Automata-theoretic approach

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- ▶ alternating Mealy machines
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Automata-theoretic approach

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- ▶ alternating Mealy machines
- ▶ Moore machines
- ▶ alternating machines
- ▶ non-deterministic machines
- ▶ deterministic machines
- ▶ state sequence for an input word

Supporting alternating finite-state machines

Definition (Alternating Mealy Machine)

A **alternating Mealy machine** is a tuple $\mathcal{M} = (Q, \Sigma, \Gamma, q_0, \delta)$ where

- ▶ Q is a finite set of **states**,
- ▶ Σ is the **input alphabet**,
- ▶ Γ is a finite, distributive lattice, the **output lattice**,
- ▶ $q_0 \in Q$ is the **initial state** and
- ▶ $\delta : Q \times \Sigma \rightarrow B^+(\Gamma \times Q)$ is the **transition function**

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Convention

Understand $\delta : Q \times \Sigma \rightarrow B^+(\Gamma \times Q)$ as a function $\delta : Q \times \Sigma \rightarrow \Gamma \times B^+(Q)$

Supporting alternating finite-state machines

Definition (Run of an Alternating Mealy Machine)

A **run** of an alternating Mealy machine $\mathcal{M} = (Q, \Sigma, \Gamma, q_0, \delta)$ on a finite word $u = a_0 \dots a_{n-1} \in \Sigma^+$ is a sequence $t_0 \xrightarrow{(a_0, b_0)} t_1 \xrightarrow{(a_1, b_1)} \dots t_{n-1} \xrightarrow{(a_{n-1}, b_{n-1})} t_n$ such that

- ▶ $t_0 = q_0$ and
- ▶ $(t_i, b_{i-1}) = \hat{\delta}(t_{i-1}, a_{i-1})$

where $\hat{\delta}$ is inductively defined as follows

- ▶ $\hat{\delta}(q, a) = \delta(q, a)$,
- ▶ $\hat{\delta}(q \vee q', a) = (\hat{\delta}(q, a)|_1 \sqcup \hat{\delta}(q', a)|_1, \hat{\delta}(q, a)|_2 \vee \hat{\delta}(q', a)|_2)$, and
- ▶ $\hat{\delta}(q \wedge q', a) = (\hat{\delta}(q, a)|_1 \sqcap \hat{\delta}(q', a)|_1, \hat{\delta}(q, a)|_2 \wedge \hat{\delta}(q', a)|_2)$

The **output** of the run is b_{n-1} .

Transition function of an alternating Mealy machine

Transition function $\delta_4^a : Q \times \Sigma \rightarrow B^+(\Gamma \times Q)$

$$\delta_4^a(\text{true}, a) = (\top, \text{true})$$

$$\delta_4^a(\text{false}, a) = (\perp, \text{false})$$

$$\delta_4^a(p, a) = (p \in a, [p \in a])$$

$$\delta_4^a(\varphi \vee \psi, a) = \delta_4^a(\varphi, a) \vee \delta_4^a(\psi, a)$$

$$\delta_4^a(\varphi \wedge \psi, a) = \delta_4^a(\varphi, a) \wedge \delta_4^a(\psi, a)$$

$$\begin{aligned} \delta_4^a(\varphi U \psi, a) &= \delta_4^a(\psi \vee (\varphi \wedge X(\varphi U \psi)), a) \\ &= \delta_4^a(\psi, a) \vee (\delta_4^a(\varphi, a) \wedge (\varphi U \psi)) \end{aligned}$$

$$\begin{aligned} \delta_4^a(\varphi R \psi, a) &= \delta_4^a(\psi \wedge (\varphi \vee \bar{X}(\varphi R \psi)), a) \\ &= \delta_4^a(\psi, a) \wedge (\delta_4^a(\varphi, a) \vee (\varphi R \psi)) \end{aligned}$$

$$\delta_4^a(X\varphi, a) = (\perp^p, \varphi)$$

$$\delta_4^a(\bar{X}\varphi, a) = (\top^p, \varphi)$$

Outline

Runtime Verification

Runtime Verification for LTL

LTL over Finite, Completed Words

LTL over Finite, Non-Completed Words: Impartiality

LTL over Non-Completed Words: Anticipation

LTL over Infinite Words: With Anticipation

Monitorable Properties

LTL with a Predictive Semantics

LTL wrap-up

RV with Data

Simple arithmetic computations

Generalisations: LTL with modulo Constraints

Stream-based Approaches: LoLa

Lifting the LTL approach

RV for hybrid systems

Quantitive Measures on the execution

Conclusion

Anticipatory Semantics

Consider possible extensions of the non-completed word



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Runtime Verification

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LTL for RV [BLS@FSTTCS'06]

Basic idea

- ▶ LTL over infinite words is commonly used for specifying correctness properties
- ▶ finite words in RV:
prefixes of infinite, so-far unknown words
- ▶ **re-use existing semantics**

LTL for RV [BLS@FSTTCS'06]

Basic idea

- ▶ LTL over infinite words is commonly used for specifying correctness properties
- ▶ finite words in RV:
prefixes of infinite, so-far unknown words
- ▶ **re-use existing semantics**

3-valued semantics for LTL over finite words

$$[u \models \varphi] = \begin{cases} \top & \text{if } \forall \sigma \in \Sigma^\omega : u\sigma \models \varphi \\ \perp & \text{if } \forall \sigma \in \Sigma^\omega : u\sigma \not\models \varphi \\ ? & \text{else} \end{cases}$$



Impartial Anticipation

Impartial

- ▶ Stay with \top and \perp

Impartial Anticipation

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Anticipatory

- ▶ Go for \top or \perp
- ▶ Consider *XXXfalse*

$$\epsilon \models \text{XXXfalse}$$

Impartial Anticipation

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$$\epsilon \models \text{XXXfalse}$$

$$a \models \text{XXfalse}$$

Impartial Anticipation

Impartial

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Anticipatory

- ▶ Go for \top or \perp
- ▶ Consider *XXXfalse*

ϵ \models *XXXfalse*

a \models *XXfalse*

aa \models *Xfalse*

Impartial Anticipation

Impartial

- ▶ Stay with \top and \perp

Anticipatory

- ▶ Go for \top or \perp
- ▶ Consider $XXXfalse$

$$\epsilon \models XXXfalse$$

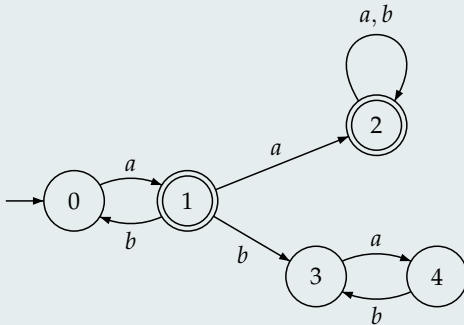
$$a \models XXfalse$$

$$aa \models Xfalse$$

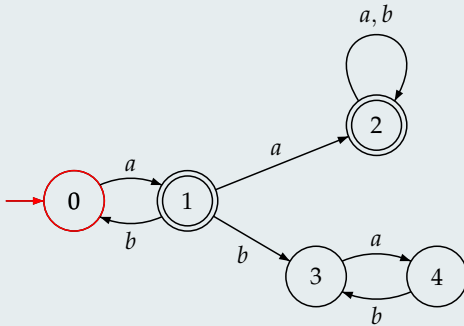
$$aaa \models false$$

$$[\epsilon \models XXXfalse] = \begin{cases} \top & \text{if } \forall \sigma \in \Sigma^\omega : \epsilon\sigma \models XXXfalse \\ \perp & \text{if } \forall \sigma \in \Sigma^\omega : \epsilon\sigma \not\models XXXfalse \\ ? & \text{else} \end{cases}$$

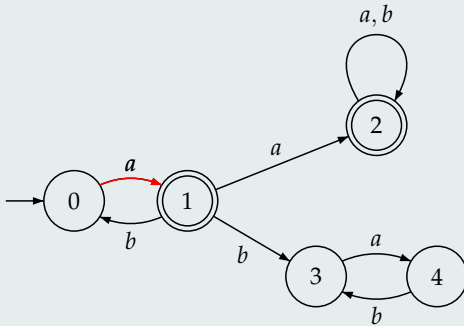
Büchi automata (BA)



Büchi automata (BA)

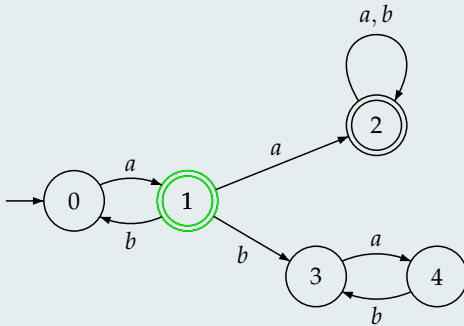


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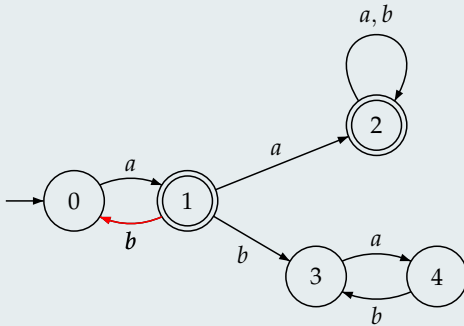
a

Büchi automata (BA)



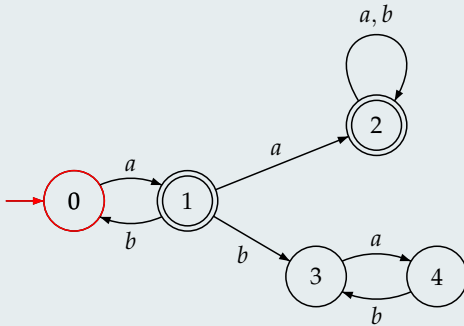
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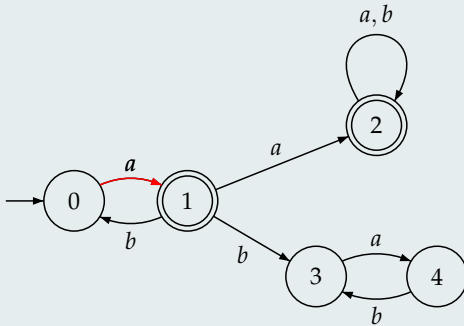
a b

Büchi automata (BA)



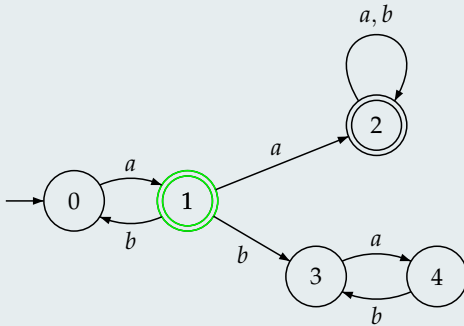
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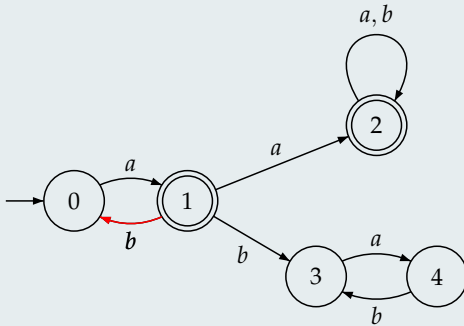
aba

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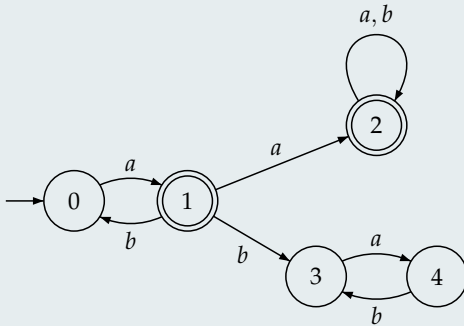
a b a

Büchi automata (BA)



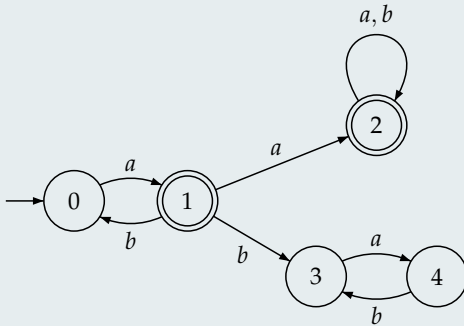
abab

Büchi automata (BA)



abab...

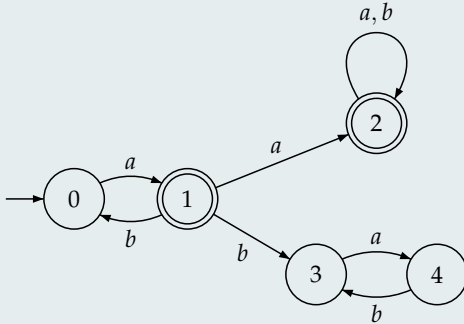
Büchi automata (BA)



$abab\dots$

$(ab)^\omega \in \mathcal{L}(\mathcal{A})$

Büchi automata (BA)



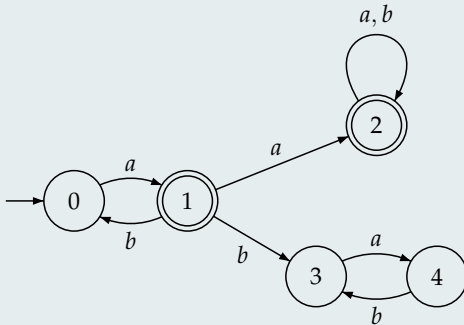
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Büchi automata (BA)

Emptiness test:



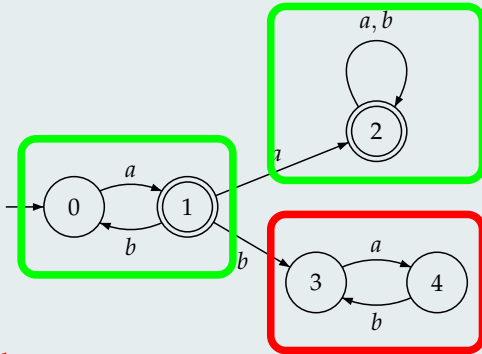
$abab\dots$

$(ab)^\omega \in \mathcal{L}(\mathcal{A})$

$(ab)^*aa\{a,b\}^\omega \subseteq \mathcal{L}(\mathcal{A})$

Büchi automata (BA)

Emptiness test: SCCC, Tarjan



$a b a b \dots$

$(ab)^\omega \in \mathcal{L}(\mathcal{A})$

$(ab)^* a a \{a, b\}^\omega \subseteq \mathcal{L}(\mathcal{A})$

LTL to BA

[Vardi & Wolper '86]

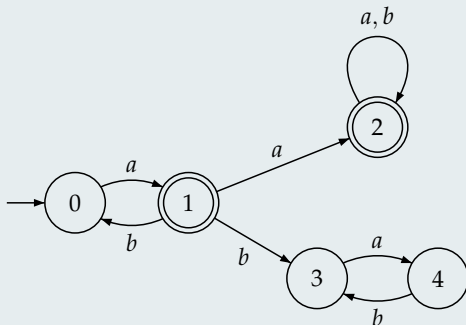
- ▶ Translation of an LTL formula φ into Büchi automata \mathcal{A}_φ with

$$\mathcal{L}(\mathcal{A}_\varphi) = \mathcal{L}(\varphi)$$

- ▶ Complexity: Exponential in the length of φ

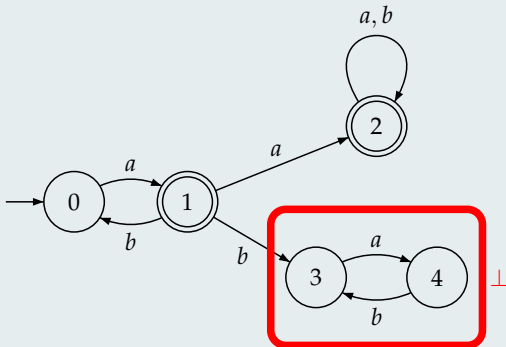
Monitor construction – Idea I

$$[u \models \varphi] = \begin{cases} \top & \text{if } \forall \sigma \in \Sigma^\omega : u\sigma \models \varphi \\ \perp & \text{if } \forall \sigma \in \Sigma^\omega : u\sigma \not\models \varphi \\ ? & \text{else} \end{cases}$$



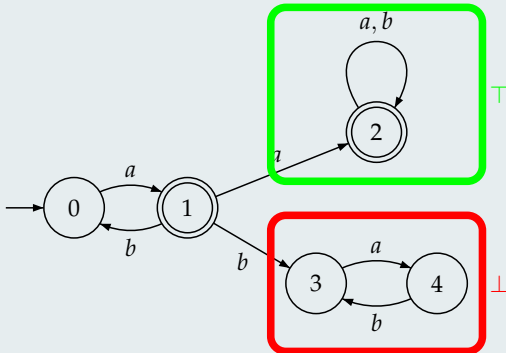
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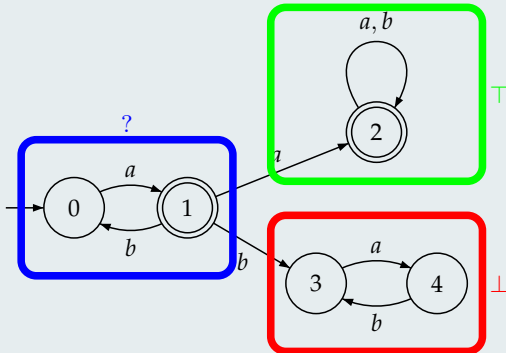
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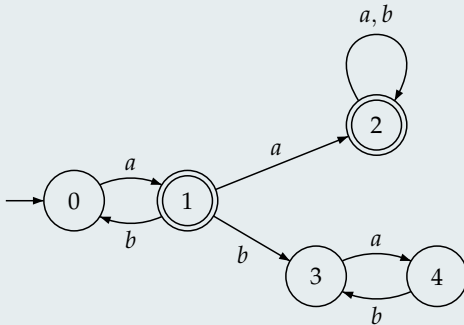


Monitor construction – Idea I

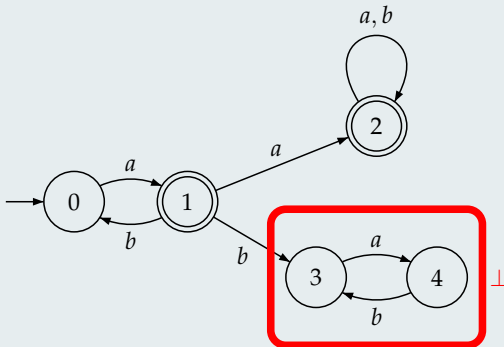
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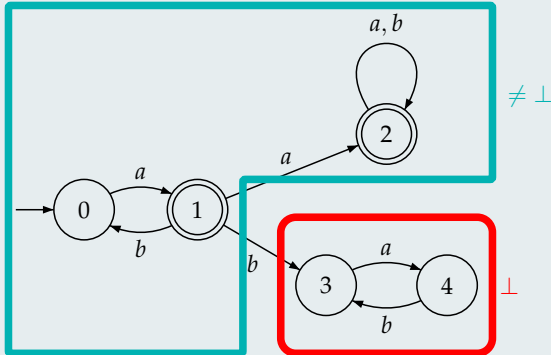
monitor construction – Idea II



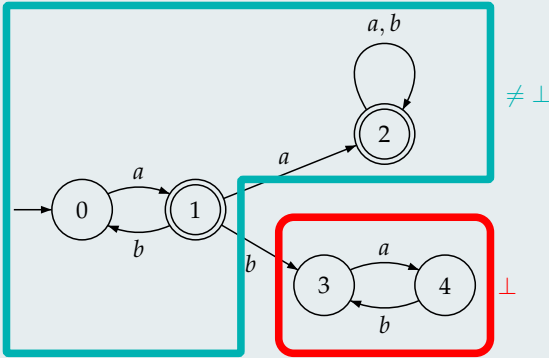
monitor construction – Idea II



monitor construction – Idea II



monitor construction – Idea II



NFA

$\mathcal{F}_\varphi : Q_\varphi \rightarrow \{\top, \perp\}$ Emptiness per state

The complete construction

The construction

$$\varphi \longrightarrow \text{BA}^\varphi \longrightarrow \mathcal{F}^\varphi \longrightarrow \text{NFA}^\varphi$$

Lemma

$$[u \models \varphi] = \begin{cases} \top & \\ \perp & \text{if } u \notin \mathcal{L}(\text{NFA}^\varphi) \\ ? & \end{cases}$$

The complete construction

The construction

$$\varphi \longrightarrow \text{BA}^\varphi \longrightarrow \mathcal{F}^\varphi \longrightarrow \text{NFA}^\varphi$$
$$\neg\varphi$$

Lemma

$$[u \models \varphi] = \begin{cases} \top & \\ \perp & \text{if } u \notin \mathcal{L}(\text{NFA}^\varphi) \\ ? & \end{cases}$$

The complete construction

The construction

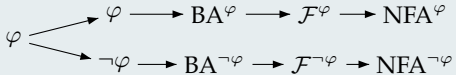
$$\begin{aligned}\varphi &\longrightarrow \text{BA}^\varphi \longrightarrow \mathcal{F}^\varphi \longrightarrow \text{NFA}^\varphi \\ \neg\varphi &\longrightarrow \text{BA}^{\neg\varphi} \longrightarrow \mathcal{F}^{\neg\varphi} \longrightarrow \text{NFA}^{\neg\varphi}\end{aligned}$$

Lemma

$$[u \models \varphi] = \begin{cases} \top & \text{if } u \notin \mathcal{L}(\text{NFA}^{\neg\varphi}) \\ \perp & \text{if } u \notin \mathcal{L}(\text{NFA}^\varphi) \\ ? & \text{else} \end{cases}$$

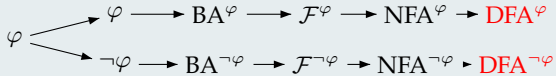
The complete construction

The construction



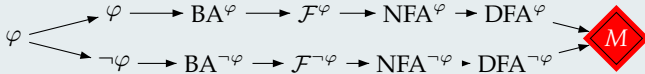
The complete construction

The construction



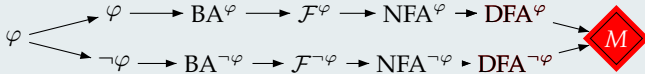
The complete construction

The construction



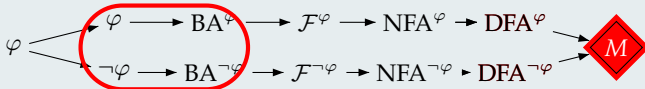
Complexity

The construction



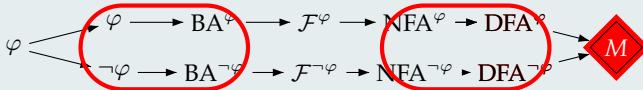
Complexity

The construction



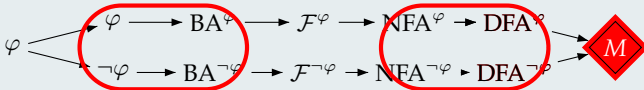
Complexity

The construction



Complexity

The construction

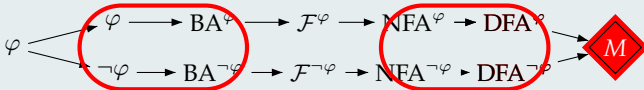


Complexity

$$|M| \leq 2^{2^{|\varphi|}}$$

Complexity

The construction



Complexity

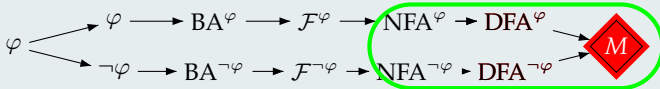
$$|M| \leq 2^{2^{|\varphi|}}$$

Optimal result!

FSM can be minimised (Myhill-Nerode)

On-the-fly Construction

The construction



Outline

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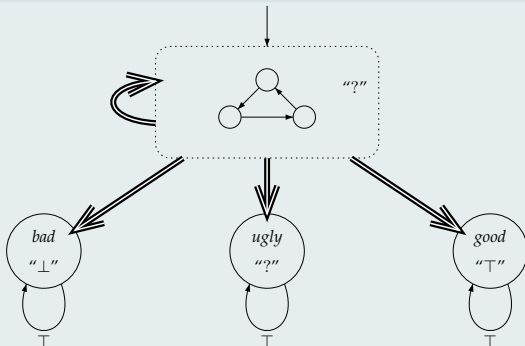
Monitorability

When does anticipation help?



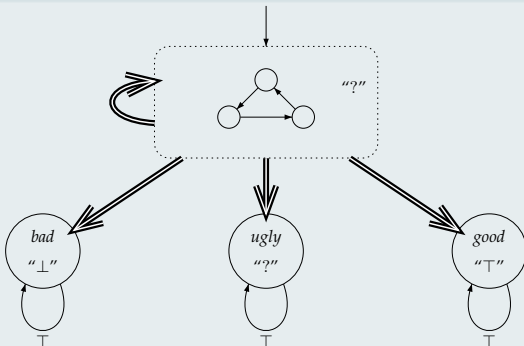
Monitors revisited

Structure of Monitors



Monitors revisited

Structure of Monitors



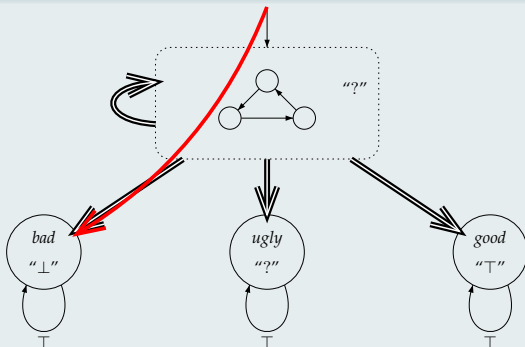
Classification of Prefixes of Words

- ▶ **Bad prefixes**

[Kupferman & Vardi'01]

Monitors revisited

Structure of Monitors



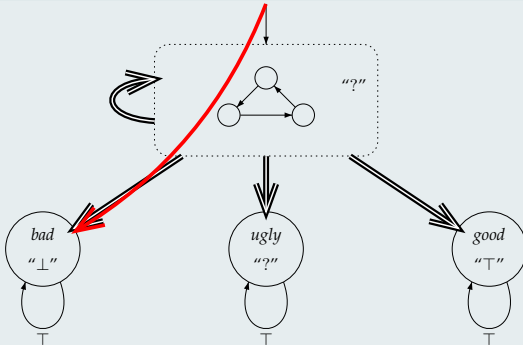
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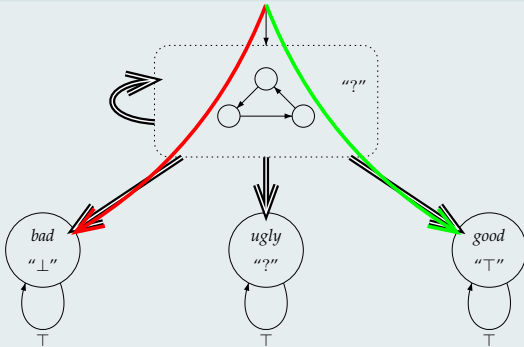
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Monitors revisited

Structure of Monitors



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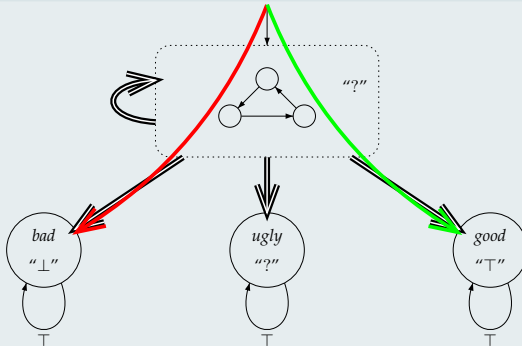
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Monitors revisited

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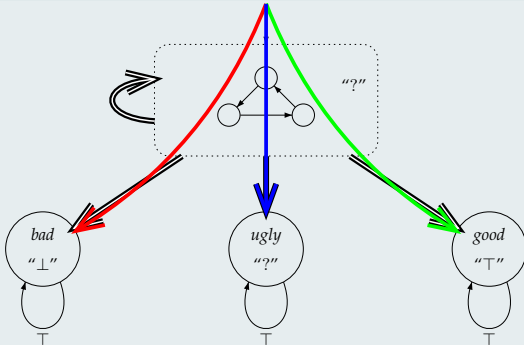
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[Kupferman & Vardi'01]

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Monitors revisited

Structure of Monitors



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- ▶ **Bad prefixes**
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[Kupferman & Vardi'01]

[Kupferman & Vardi'01]

Monitorable

Non-Monitorable [Pnueli & Zaks'07]

φ is **non-monitorable after u** , if u cannot be extended to a bad oder good prefix.

Monitorable

φ is monitorable if there is no such u .

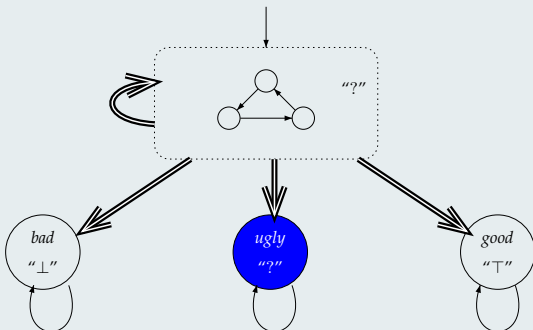
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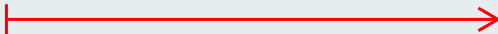
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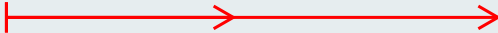
Monitorable Properties

Safety Properties



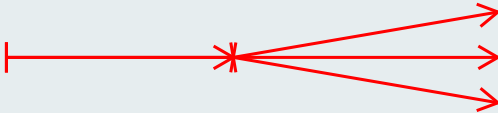
Monitorable Properties

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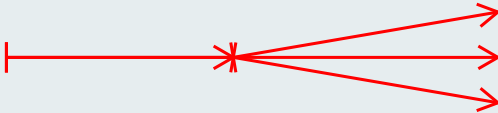
Monitorable Properties

Safety Properties



Monitorable Properties

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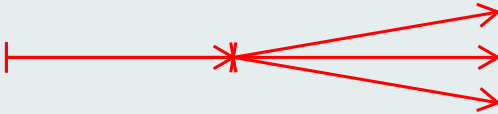


Co-Safety Properties



Monitorable Properties

Safety Properties

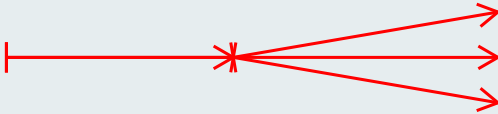


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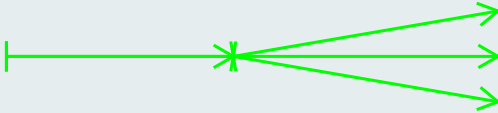


Monitorable Properties

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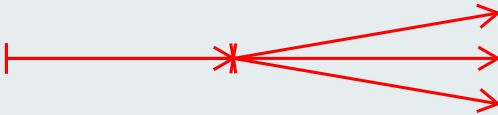


Co-Safety Properties

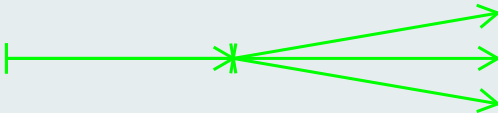


Monitorable Properties

Safety Properties



Co-Safety Properties



Note

Safety and Co-Safety Properties are monitorable

Safety- and Co-Safety-Properties

Theorem

The class of **monitored properties**

- ▶ comprises safety- and co-safety properties, but
- ▶ is strictly larger than their union.

Proof

Consider $((p \vee q)Ur) \vee Gp$

Outline

Runtime Verification

Runtime Verification for LTL

LTL over Finite, Completed Words

LTL over Finite, Non-Completed Words: Impartiality

LTL over Non-Completed Words: Anticipation

LTL over Infinite Words: With Anticipation

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Conclusion

Fusing model checking and runtime verification

LTL with a predictive semantics



Recall anticipatory LTL semantics

The truth value of a LTL_3 formula φ wrt. u , denoted by $[u \models \varphi]$, is an element of \mathbb{B}_3 defined by

$$[u \models \varphi] = \begin{cases} \top & \text{if } \forall \sigma \in \Sigma^\omega : u\sigma \models \varphi \\ \perp & \text{if } \forall \sigma \in \Sigma^\omega : u\sigma \not\models \varphi \\ ? & \text{otherwise.} \end{cases}$$

Applied to the empty word

Empty word ϵ

$$[\epsilon \models \varphi]_{\mathcal{P}} = \top$$

iff $\forall \sigma \in \Sigma^\omega$ with $\epsilon\sigma \in \mathcal{P} : \epsilon\sigma \models \varphi$

iff $\mathcal{L}(\mathcal{P}) \models \varphi$

RV more difficult than MC?

Then runtime verification implicitly answers model checking

Abstraction

An **over-abstraction** or **over-approximation** of a program \mathcal{P} is a program $\hat{\mathcal{P}}$ such that $\mathcal{L}(\mathcal{P}) \subseteq \mathcal{L}(\hat{\mathcal{P}}) \subseteq \Sigma^\omega$.

Predictive Semantics

Definition (Predictive semantics of LTL)

Let \mathcal{P} be a program and let $\hat{\mathcal{P}}$ be an over-approximation of \mathcal{P} . Let $u \in \Sigma^*$ denote a finite trace. The *truth value* of u and an LTL_3 formula φ wrt. $\hat{\mathcal{P}}$, denoted by $[u \models_{\hat{\mathcal{P}}} \varphi]$, is an element of \mathbb{B}_3 and defined as follows:

$$[u \models_{\hat{\mathcal{P}}} \varphi] = \begin{cases} \top & \text{if } \forall \sigma \in \Sigma^\omega \text{ with } u\sigma \in \hat{\mathcal{P}} : u\sigma \models \varphi \\ \perp & \text{if } \forall \sigma \in \Sigma^\omega \text{ with } u\sigma \in \hat{\mathcal{P}} : u\sigma \not\models \varphi \\ ? & \text{else} \end{cases}$$

We write $LTL_{\mathcal{P}}$ whenever we consider LTL formulas with a predictive semantics.

Properties of Predictive Semantics

Let $\hat{\mathcal{P}}$ be an over-approximation of a program \mathcal{P} over Σ , $u \in \Sigma^*$, and $\varphi \in \text{LTL}$.

- ▶ Model checking is more precise than RV with the predictive semantics:

$$\mathcal{P} \models \varphi \text{ implies } [u \models_{\hat{\mathcal{P}}} \varphi] \in \{\top, ?\}$$

- ▶ RV has no false negatives: $[u \models_{\hat{\mathcal{P}}} \varphi] = \perp$ implies $\mathcal{P} \not\models \varphi$
- ▶ The predictive semantics of an LTL formula is more precise than LTL_3 :

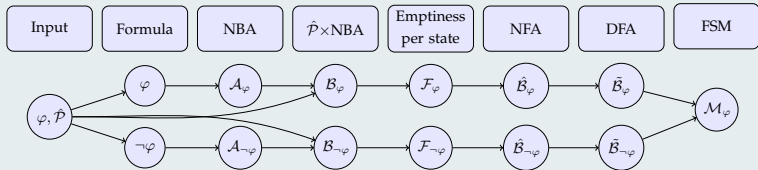
$$[u \models \varphi] = \top \quad \text{implies} \quad [u \models_{\hat{\mathcal{P}}} \varphi] = \top$$

$$[u \models \varphi] = \perp \quad \text{implies} \quad [u \models_{\hat{\mathcal{P}}} \varphi] = \perp$$

The reverse directions are in general not true.

Monitor generation

The procedure for getting $[u \models_{\hat{\mathcal{P}}} \varphi]$ for a given φ and over-approximation $\hat{\mathcal{P}}$



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Intermediate Summary

Semantics

- ▶ completed traces
 - ▶ two valued semantics
- ▶ non-completed traces
 - ▶ Impartiality
 - ▶ at least three values
 - ▶ Anticipation
 - ▶ finite traces
 - ▶ infinite traces
 - ▶ ...
 - ▶ monitorability
 - ▶ Prediction

Monitors

- ▶ left-to-right
- ▶ time versus space trade-off
 - ▶ rewriting
 - ▶ alternating automata
 - ▶ non-deterministic automata
 - ▶ deterministic automata

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Classical Logics

Evolution

- ▶ Propositional logic: $p, q, p \wedge q, x > 0, \dots$
- ▶ First-order logic: $x > y, \exists x\varphi(x), \dots$
- ▶ Second-order logic: $\forall X\exists yX(y), \dots$

Rational

- ▶ have a notion of values, functions, relations, \dots
- ▶ express properties on these

In Temporal Logics

Propositional



First-order



So ...

Are we done?

- ▶ First-order LTL is (well) understood
- ▶ Apply same methods as for LTL also in the context of FO-LTL

But ...

- ▶ FO logic is undecidable, so how to check properties in a single world?
- ▶ Restrict to decidable worlds - and finite words?
- ▶ How to do rewriting for FO-LTL?
- ▶ Impartiality: Extension to many values needed
- ▶ Anticipation: FO-LTL has an undecidable satisfiability problem, also over worlds with finite domains
- ▶ How to do automata constructions for FO-LTL?
- ▶ How to do RV with data efficiently?

- ▶ Approach only useful when restricting to special (yet general) cases
- ▶ Some work to do



Elaboration of the domain

What kind of data do we have in systems?

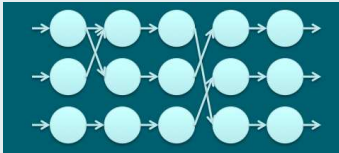
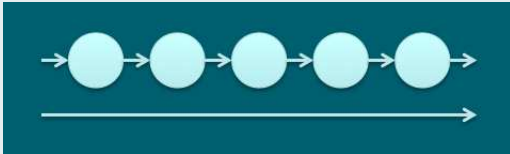
Data in computer science

What kind of data do we have in systems?

- ▶ Simple arithmetic computations along the program's execution
- ▶ Stream-based computations
- ▶ Identities especially in object orientation
- ▶ Object/Process creation
- ▶ Analog Signals
- ▶ ...

The Frames

What kind of data do we have in systems?



▶ ...

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Towards richer and more expressive logics [DLS@ATVA'08]

Many linear-time logics

- ▶ LTL with Past

Towards richer and more expressive logics [DLS@ATVA'08]

Many linear-time logics

- ▶ LTL with Past
- ▶ linear-time μ -calculus

Towards richer and more expressive logics [DLS@ATVA'08]

Many linear-time logics

- ▶ LTL with Past
- ▶ linear-time μ -calculus
- ▶ RTL

Towards richer and more expressive logics [DLS@ATVA'08]

Many linear-time logics

- ▶ LTL with Past
- ▶ linear-time μ -calculus
- ▶ RTLTL
- ▶ LTL with integer constraints

$$G(\text{fopen}_x \rightarrow ((x = Xx) U \text{fclose}_x))$$

Linear-time Logic

Definition (Linear-time Logic)

A **linear-time logic** L defines

- ▶ a set F_L of **L -formulae** and
- ▶ a two-valued **semantics** \models_L .

Every L -formula $\varphi \in F_L$ has an associated and possibly infinite **alphabet** Σ_φ .
Moreover, for every formula $\varphi \in F_L$ and every word $\sigma \in \Sigma_\varphi^\omega$, we require

$$\text{(L1)} \quad \forall \varphi \in F_L : \neg \varphi \in F_L.$$

$$\text{(L2)} \quad \forall \sigma \in \Sigma_\varphi^\omega : (\sigma \models_L \varphi \Leftrightarrow \sigma \not\models_L \neg \varphi).$$

Anticipation Semantics

Definition (Anticipation Semantics)

Let L be a linear-time logic. We define the **anticipation semantics** $[\pi \models \varphi]_L$ of an L -formula $\varphi \in F_L$ and a finite word $\pi \in \Sigma_\varphi^*$ with

$$[\pi \models \varphi]_L = \begin{cases} \top & \text{if } \forall \sigma \in \Sigma_\varphi^\omega : \pi\sigma \models_L \varphi \\ \perp & \text{if } \forall \sigma \in \Sigma_\varphi^\omega : \pi\sigma \not\models_L \varphi \\ ? & \text{otherwise} \end{cases}$$

Evaluation using decide

decide

$$[\pi \models \varphi]_L = \begin{cases} \top & \text{if } \text{decide}_{\neg\varphi}(\pi) = \perp \\ \perp & \text{if } \text{decide}_{\varphi}(\pi) = \perp \\ ? & \text{otherwise} \end{cases}$$

where $\text{decide}_{\varphi}(\pi)$ is defined to return \top for $\varphi \in F_L$ and $\pi \in \Sigma_{\varphi}$ if $\exists \sigma \in \Sigma_{\varphi}^{\omega} : \pi \sigma \models_L \varphi$ holds, and \perp otherwise.

The automata theoretic approach to SAT

Definition (Satisfiability Check by Automata Abstraction)

Given a linear-time logic L with its formulae F_L , the **satisfiability check by automata abstraction** proceeds as follows. For formula $\varphi \in F_L$,

1. define **alphabet abstraction** $\Sigma_\varphi \rightarrow \bar{\Sigma}_\varphi$ **finite, abstract alphabet**
2. define a **word abstraction** $\alpha(\cdot) : \Sigma_\varphi^\omega \rightarrow \bar{\Sigma}_\varphi^\omega$
3. define an **automaton construction** $\varphi \mapsto \omega$ -automaton \mathcal{A}_φ over $\bar{\Sigma}_\varphi$ such that for all $\bar{\sigma} \in \bar{\Sigma}_\varphi^\omega$ it holds

$$\bar{\sigma} \in \mathcal{L}(\mathcal{A}_\varphi) \text{ iff } \exists \sigma \in \Sigma_\varphi^\omega : \bar{\sigma} = \alpha(\sigma) \text{ and } \sigma \models \varphi$$

Then

$$\varphi \text{ satisfiable iff } \mathcal{L}(\mathcal{A}_\varphi) \neq \emptyset \text{ iff non-empty}(\mathcal{A}_\varphi)$$

From finite to infinite

Definition (extrapolate)

$$\text{extrapolate}(\pi) = \left\{ \alpha(\pi\sigma)^{0\dots i} \mid i + 1 = |\pi|, \sigma \in \Sigma^\omega \right\}$$

Definition (Accuracy of Abstract Automata)

accuracy of abstract automata property holds, if, for all $\pi \in \Sigma^*$,

- ▶ $(\exists \sigma : \pi\sigma \models_L \varphi) \Rightarrow (\exists \bar{\pi}\bar{\sigma} : \bar{\pi}\bar{\sigma} \in \mathcal{L}(\mathcal{A}_\varphi))$ with $\bar{\pi} \in \text{extrapolate}(\pi)$,
- ▶ $(\exists \bar{\sigma} : \bar{\pi}\bar{\sigma} \in \mathcal{L}(\mathcal{A}_\varphi)) \Rightarrow (\exists \pi\exists \sigma : \pi\sigma \models_L \varphi)$ with $\bar{\pi} \in \text{extrapolate}(\pi)$.

Non-incremental version

Theorem (Correctness of decide)

Given a satisfiability check by automata abstraction for a linear-time logic L satisfying the *accuracy of automata* property, we have

$$\text{decide}(\pi) = \text{non-empty} \left(\bigcup_{q \in Q_0, \bar{\pi} \in \text{extrapolate}(\pi)} \delta(q, \bar{\pi}) \right)$$

Faithful abstraction

Definition (Forgettable Past and Faithful Abstraction)

Given α of a satisfiability check by automata abstraction. We say that

- ▶ α satisfies the **forgettable past property**, iff

$$\alpha(\pi a \sigma)^{i+1 \dots i+1} = \alpha(a \sigma)^{0 \dots 0}$$

for all $\pi \in \Sigma^*$, $|\pi| = i + 1$, $a \in \Sigma$, and $\sigma \in \Sigma^\omega$.

- ▶ α is called **faithful**, iff for all $\pi \in \Sigma^*$, $|\pi| = i + 1$, $a \in \Sigma$, $\sigma, \sigma' \in \Sigma^\omega$ for which there is some $\sigma'' \in \Sigma^\omega$ with $\alpha(\pi \sigma)^{0 \dots i} \alpha(a \sigma')^{0 \dots 0} = \alpha(\sigma'')^{0 \dots i+1}$ there also exists a $\sigma''' \in \Sigma^\omega$ with

$$\alpha(\pi \sigma)^{0 \dots i} \alpha(a \sigma')^{0 \dots 0} = \alpha(\pi a \sigma''')^{0 \dots i+1}$$

Incremental version

Theorem (Incremental Emptiness for Extrapolation)

Let \mathcal{A} be a Büchi automaton obtained via a satisfiability check by automata abstraction satisfying the accuracy of automaton abstraction property with a faithful abstraction function having the forgettable past property. Then, for all $\pi \in \Sigma^$ and $a \in \Sigma$, it holds*

$$\mathcal{L}(\mathcal{A}(\text{extrapolate}(\pi a))) = \mathcal{L}(\mathcal{A}(\text{extrapolate}(\pi)\text{extrapolate}(a)))$$

Further logics

Indeed works

- ▶ LTL with Past
- ▶ linear-time μ -calculus
- ▶ RLTL
- ▶ *LTL* with integer constraints

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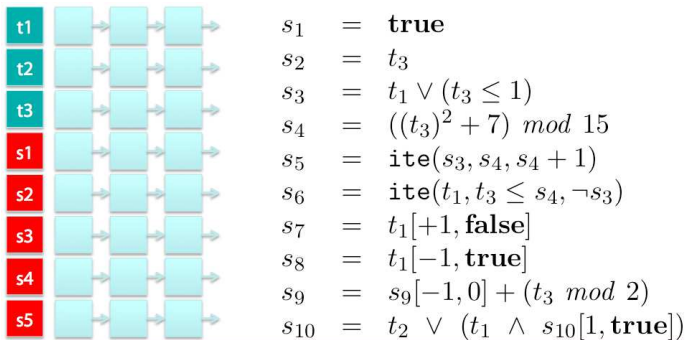
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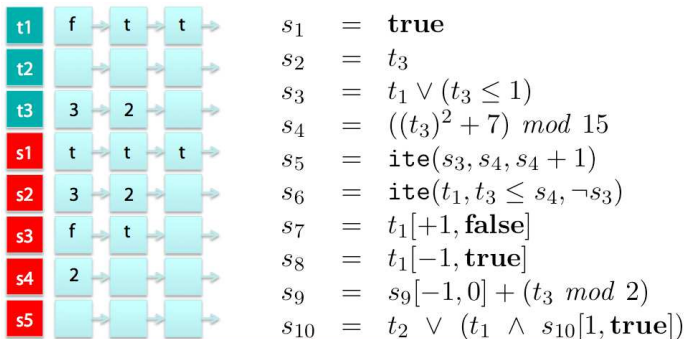
Conclusion

LOLA



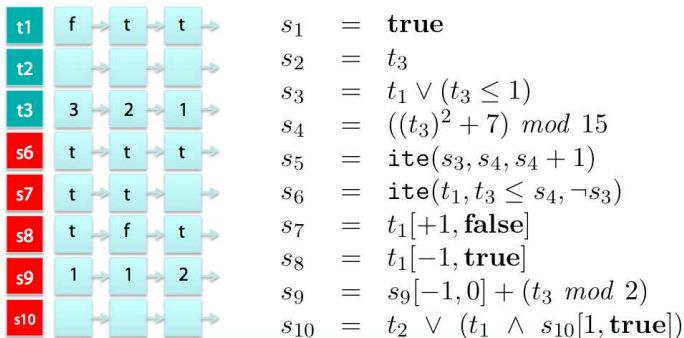
[Ben D'Angelo, Sriram Sankaranarayanan, Csar Snchez, Will Robinson, Bernd Finkbeiner, Henny B. Sipma, Sandeep Mehrotra, Zohar Manna: LOLA: Runtime Monitoring of Synchronous Systems. TIME 2005: 166-174]

LOLA



[Ben D'Angelo, Sriram Sankaranarayanan, Csar Snchez, Will Robinson, Bernd Finkbeiner, Henny B. Sipma, Sandeep Mehrotra, Zohar Manna: LOLA: Runtime Monitoring of Synchronous Systems. TIME 2005: 166-174]

LOLA



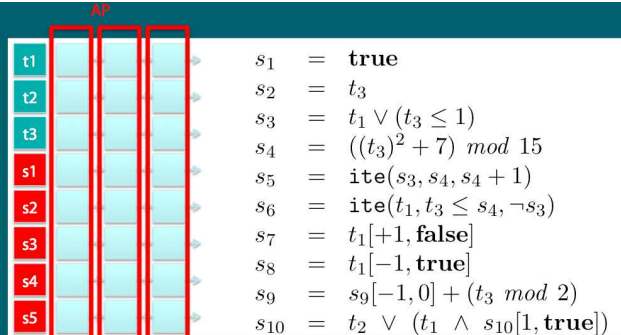
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LOLA and the linear μ -calculus

LTL vs. lin. μ -calculus

- ▶ $p U q \equiv q \vee (p \wedge X(p U q))$
- ▶ $\mu X.q \vee \vee(p \wedge \diamond X)$

AP



t1					$s_1 = \mathbf{true}$
t2					$s_2 = t_3$
t3					$s_3 = t_1 \vee (t_3 \leq 1)$
s1					$s_4 = ((t_3)^2 + 7) \bmod 15$
s2					$s_5 = \mathbf{ite}(s_3, s_4, s_4 + 1)$
s3					$s_6 = \mathbf{ite}(t_1, t_3 \leq s_4, \neg s_3)$
s4					$s_7 = t_1[+1, \mathbf{false}]$
s5					$s_8 = t_1[-1, \mathbf{true}]$
					$s_9 = s_9[-1, 0] + (t_3 \bmod 2)$
					$s_{10} = t_2 \vee (t_1 \wedge s_{10}[1, \mathbf{true}])$

Discussion on LOLA

Extensions

- ▶ LOLA over infinite frames
- ▶ Impartial Semantics
- ▶ Anticipatory Semantics

Applicability

- ▶ Rich computations
- ▶ Fixed set of variables
- ▶ May be efficient

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Parameterized Propositions

Query-Response Properties

- ▶ Always request implies eventually answered

Observations

- ▶ Implicitly universally quantified property
- ▶ No computation on x needed
- ▶ Goal: Reasoning with *names*

Parameterized Propositions

Query-Response Properties

- ▶ Always request implies eventually answered
- ▶ Always request(x) implies eventually answered(x)

Observations

- ▶ Implicitly universally quantified property
- ▶ No computation on x needed
- ▶ Goal: Reasoning with *names*

Rosu et al.

- ▶ These properties can be checked “individually”

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- ▶ $\varphi \rightarrow M_\varphi$

Rosu et al.

- ▶ These properties can be checked “individually”
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- ▶ handle each $\varphi(a)$ separately
- ▶ $\varphi \rightarrow M_\varphi$
- ▶ $\bigwedge_{x \in D} \varphi(x) \rightarrow \prod_{x \in D} M_{\varphi(x)}$

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Hybrid systems

Hybrid System

Continuous Behaviour in different states

Specification of Correctness Properties for Hybrid System

- ▶ Hybrid automata
- ▶ Linear Temporal Logic
- ▶ Discretized Specification (Specify samples)
- ▶ DSL: Check for limits etc.

Monitoring

- ▶ Sampling and checking samples
- ▶ Sampling and Interpolation
- ▶ Anticipation?

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Quantitative Specifications

Usa Sammapun, Insup Lee, Oleg Sokolsky, John Regehr: Statistical Runtime Checking of Probabilistic Properties. RV 2007: 164-175

Frequency LTL

The syntax of Frequency Linear-time Temporal Logic (*fLTL*) formulae is given by

$$\varphi ::= \text{true} \mid \neg\varphi \mid \varphi \wedge \varphi \mid X\varphi \mid \varphi \ U^c \ \varphi \mid p \quad (p \in \mathbf{AP})$$

where each *U*-operator is annotated by a rational number $c \in \mathbb{Q}$ with $0 \leq c \leq 1$. *fLTL* formulae are interpreted over words $w \in \Sigma^\omega$, $w = a_0a_1a_2$ as follows:

$$w \models \varphi \ U^c \ \psi \quad \text{if} \quad \exists_n : w|^{n+1} \models \psi \text{ and} \\ \#_{\varphi, w}(n) \geq c \cdot n$$



?

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Summary

- ▶ RV needs similar temporal logics as model checking, but adaptations for
 - ▶ finite runs
 - ▶ impartiality
 - ▶ anticipation
 - ▶ prediction
- ▶ RV in the presence of data is a challenge
 - ▶ anticipation often not possible
 - ▶ efficient monitoring is more challenging
- ▶ RV for hybrid systems?
 - ▶ what is the right specification formalism?
 - ▶ discretization and then as for typical data?
 - ▶ interpolation of dynamic behaviour?
 - ▶ anticipation?
 - ▶ we hear something about it
- ▶ Quantitative Aspects would be interesting, too

That's it!

Thanks! - Questions?

