



**Symbolic Methods for Formal Verification of
Industrial Control Software**

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PhD thesis defence, Aachen, 23rd September 2021

Outline

Introduction

- Formal Methods
- Setting
- Contributions & Related Work

CHC-based Safety Verification

Design and Verification of Restart-robust Software

Software-driven Systems



- ▶ Software drives the systems we rely on – hardware often off-the-shelf
- ▶ While many software bugs are not grave, some may be catastrophic:
 - Misinterpretation & no input validation led to radiation fatalities [Bor06]
 - Blackout after race condition affected 50 million people [Pow04]
- ▶ Writing “correct” software is hard – 50% of resources in testing [Mye12]

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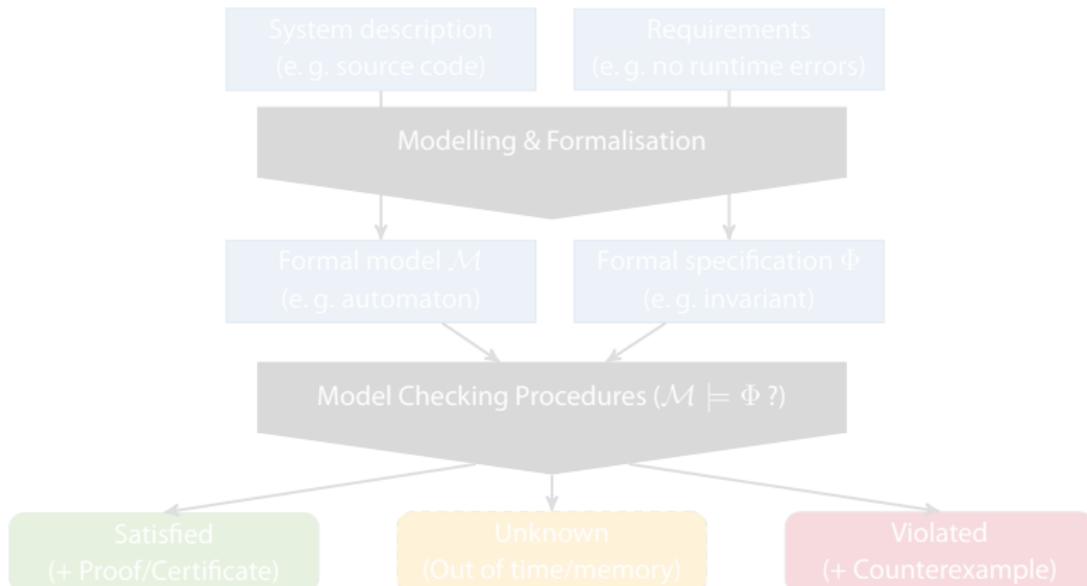
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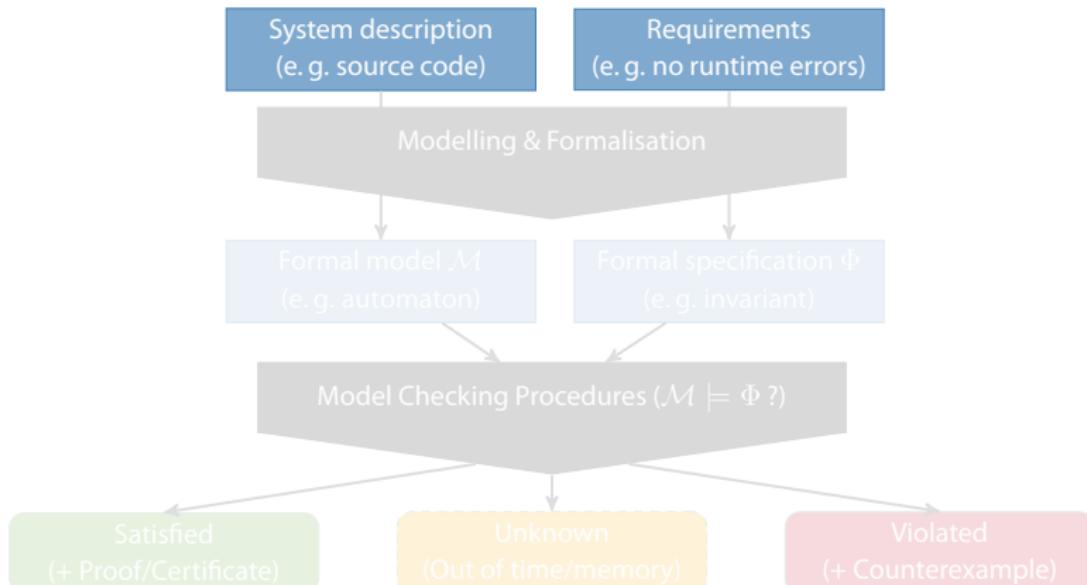
Formal Methods

- ▶ Based on mathematics, they enable **rigorous modelling & reasoning**
- ▶ Model checking (dis-)proves properties of interest



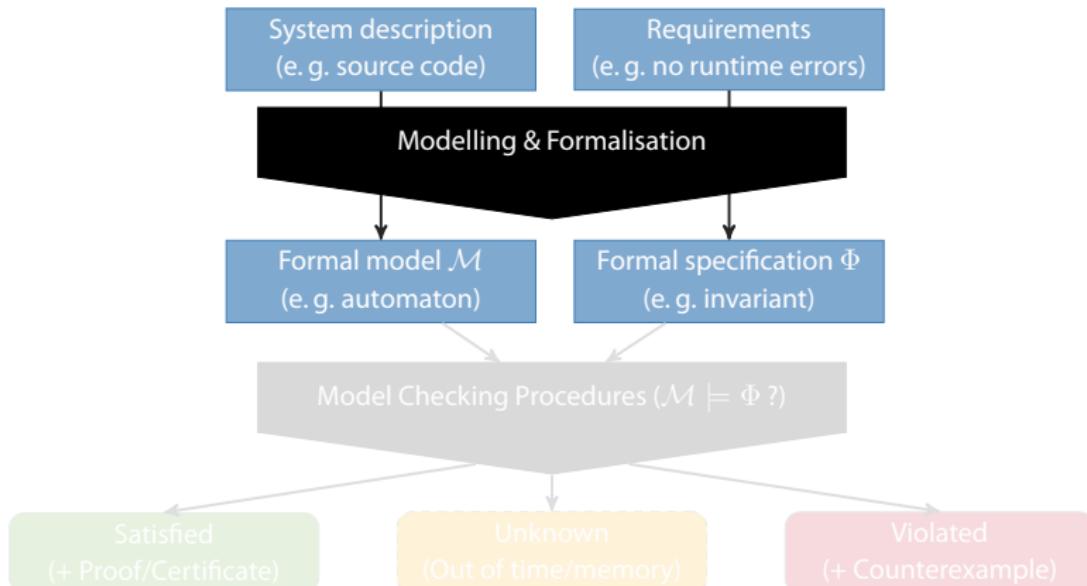
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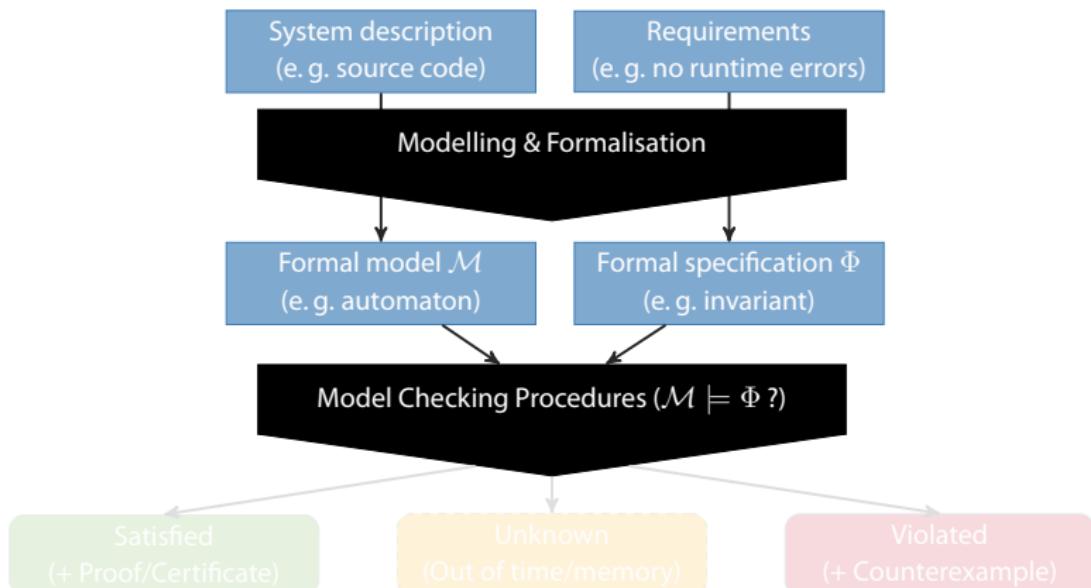
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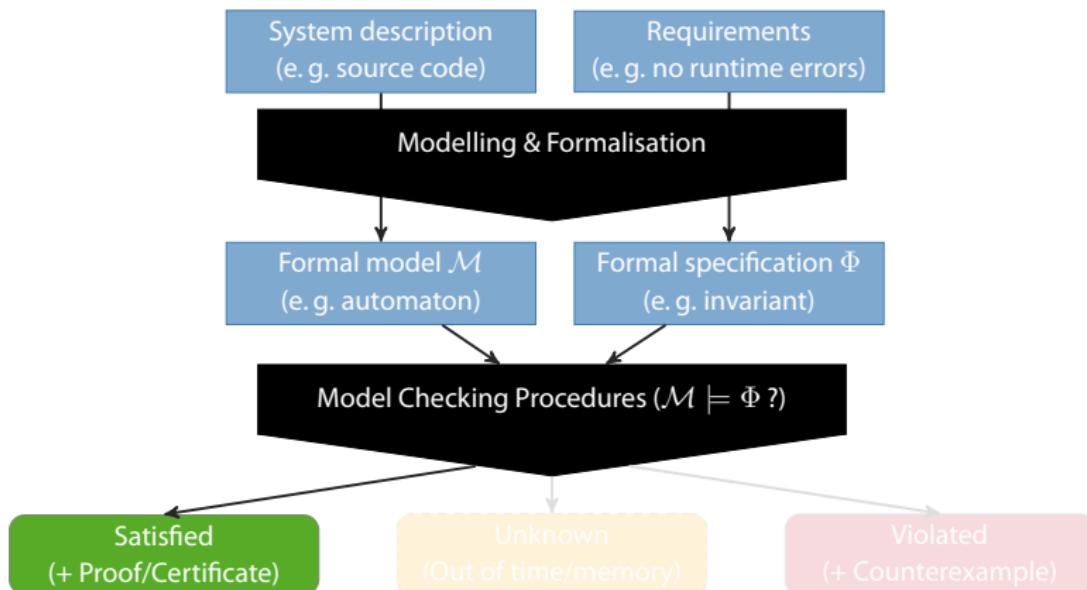
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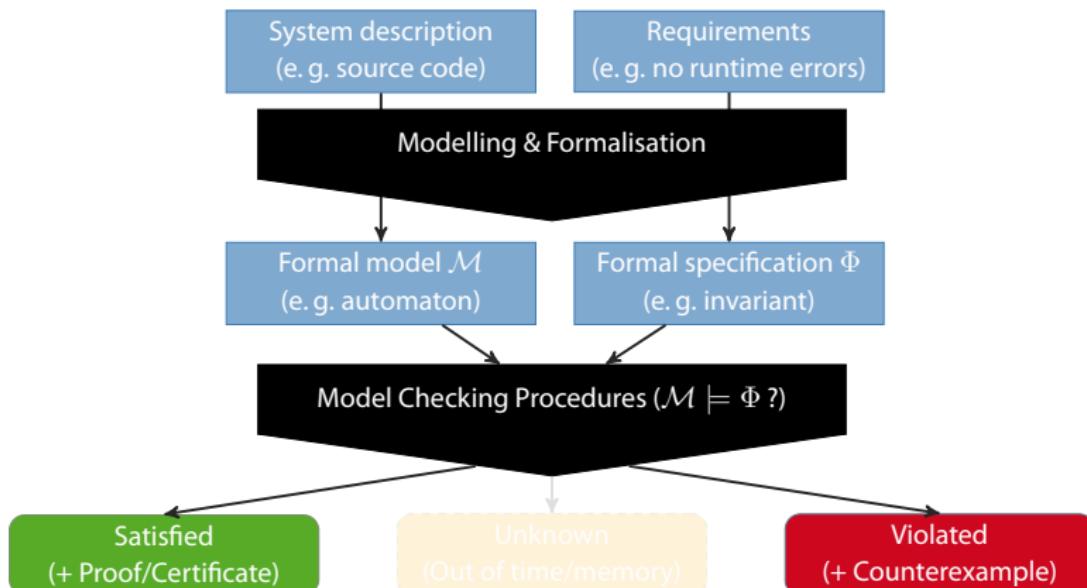
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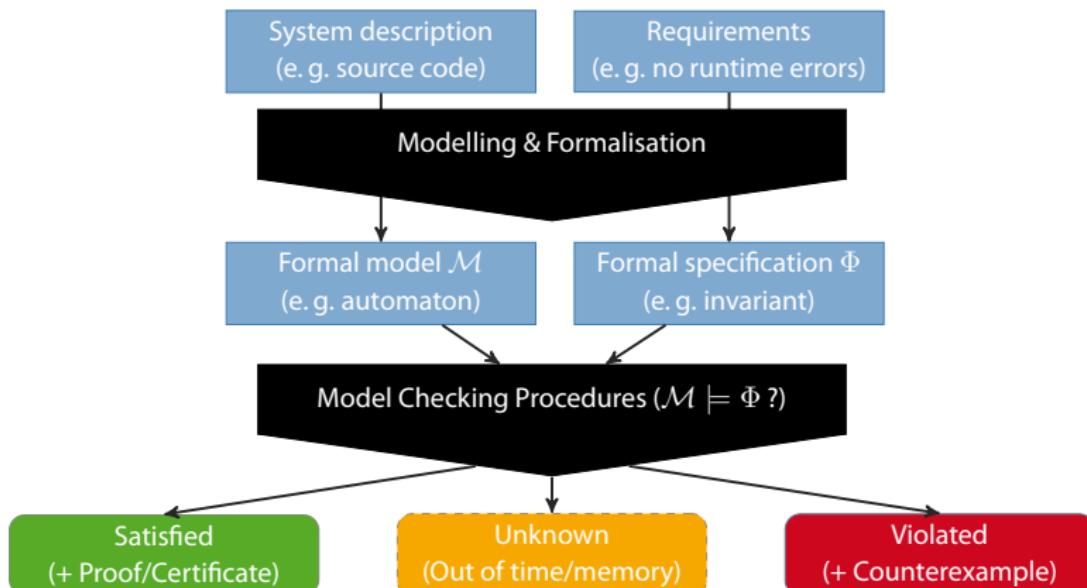
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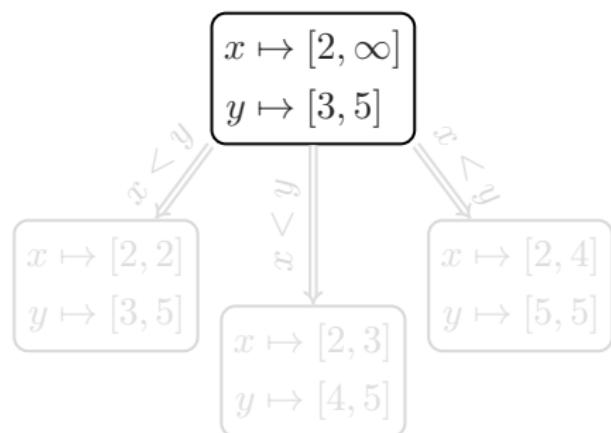


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Explicit vs. Symbolic Methods



$$\text{src}(x, y) := 2 \leq x$$

$$\wedge 3 \leq y \leq 5$$

$$T(x, y, x', y') := x < y$$

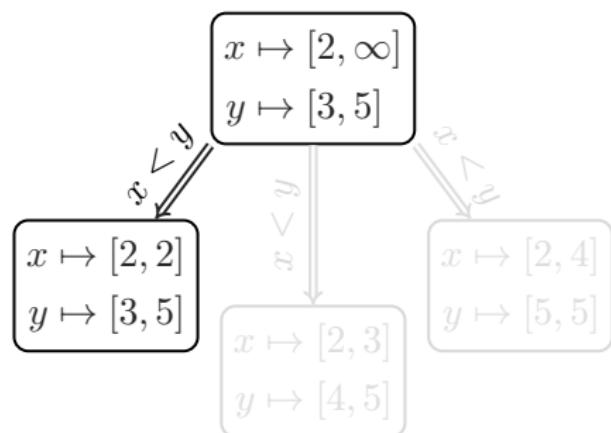
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$$\text{bad}(x', y') := x = 4$$

- ▶ Explicit construction & search
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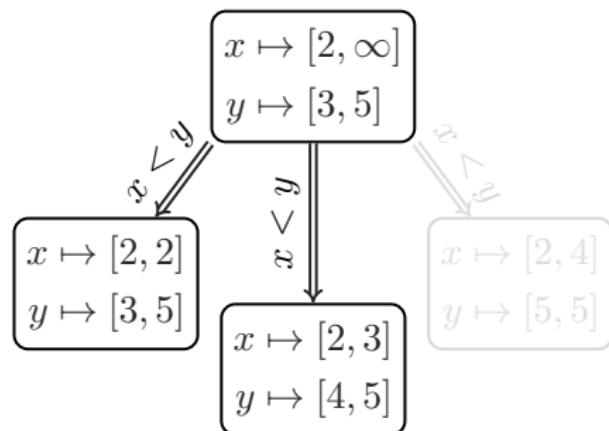
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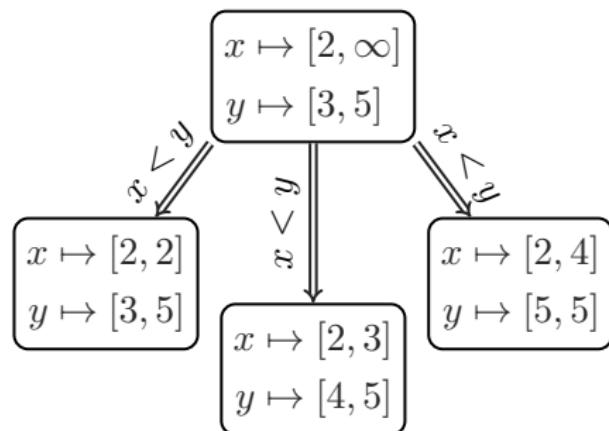
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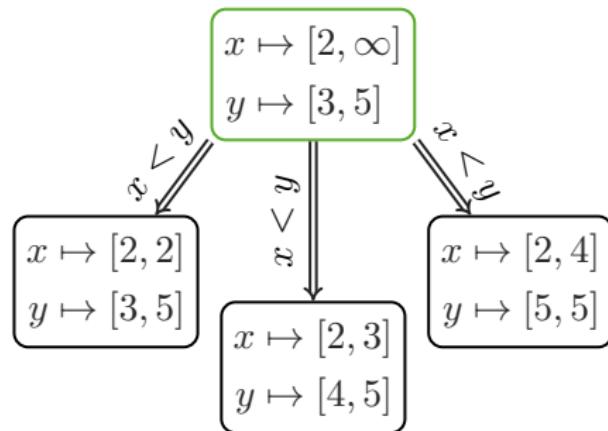
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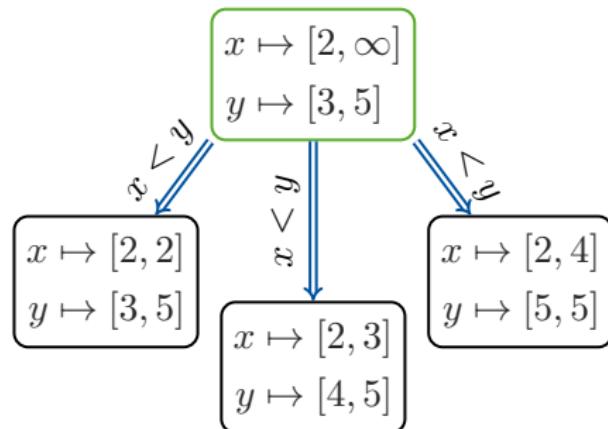
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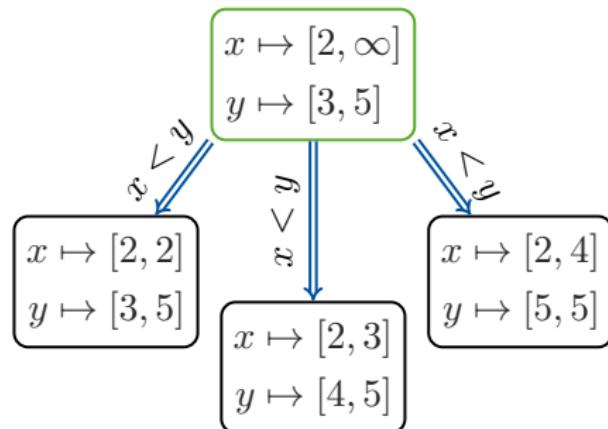
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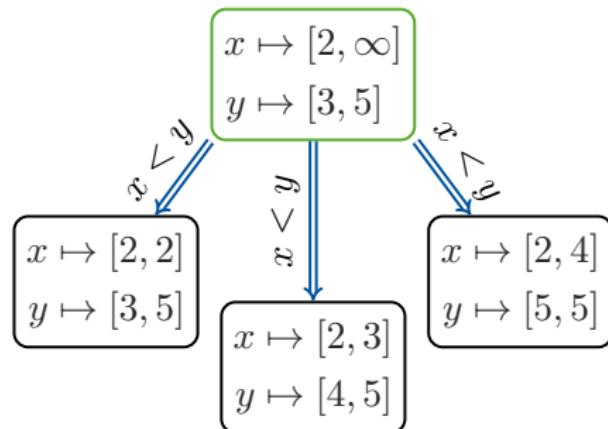
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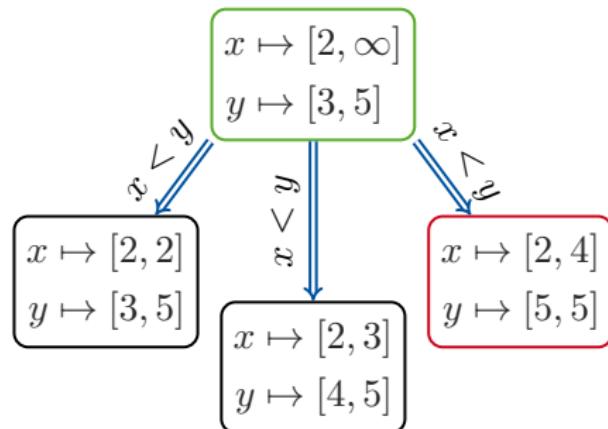


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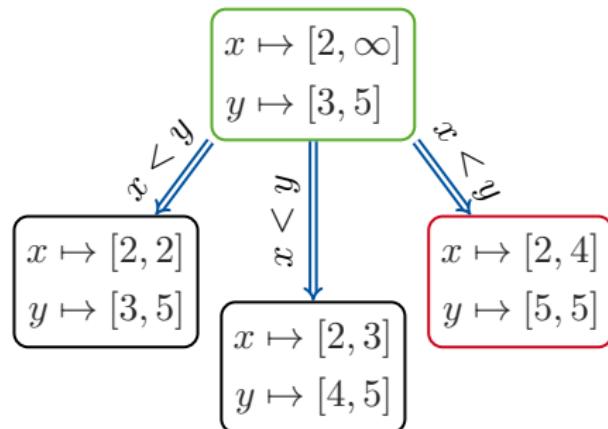
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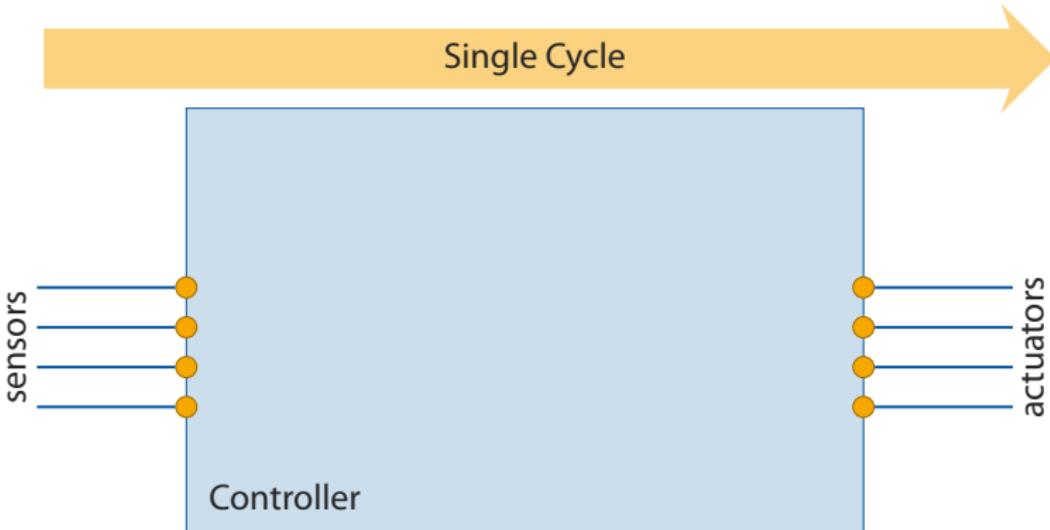
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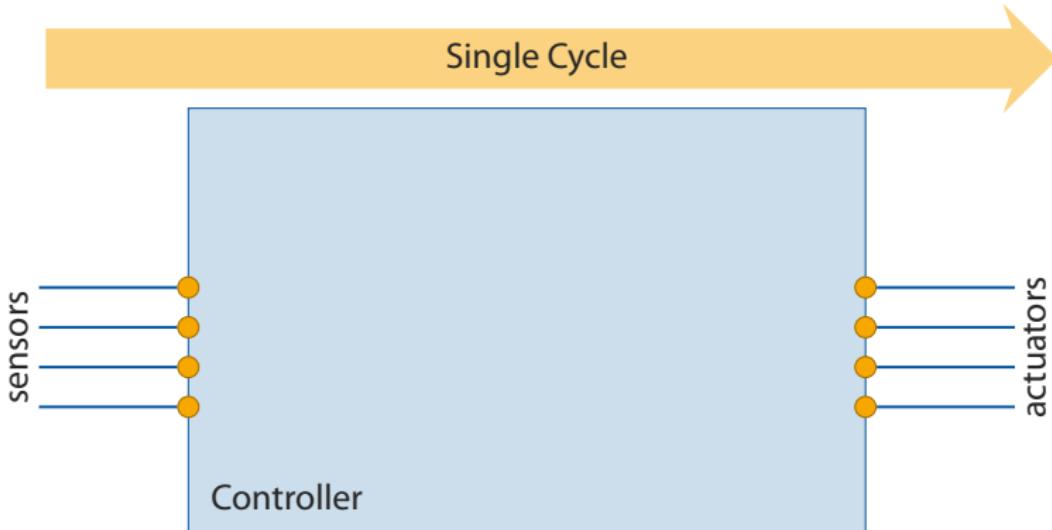
Programmable Logic Controllers (PLCs)

- ▶ Controllers realise **reactive systems**, repeatedly executing some task
- ▶ PLCs are rugged computers especially tailored to **industrial control**, e.g. for actuating assembly lines



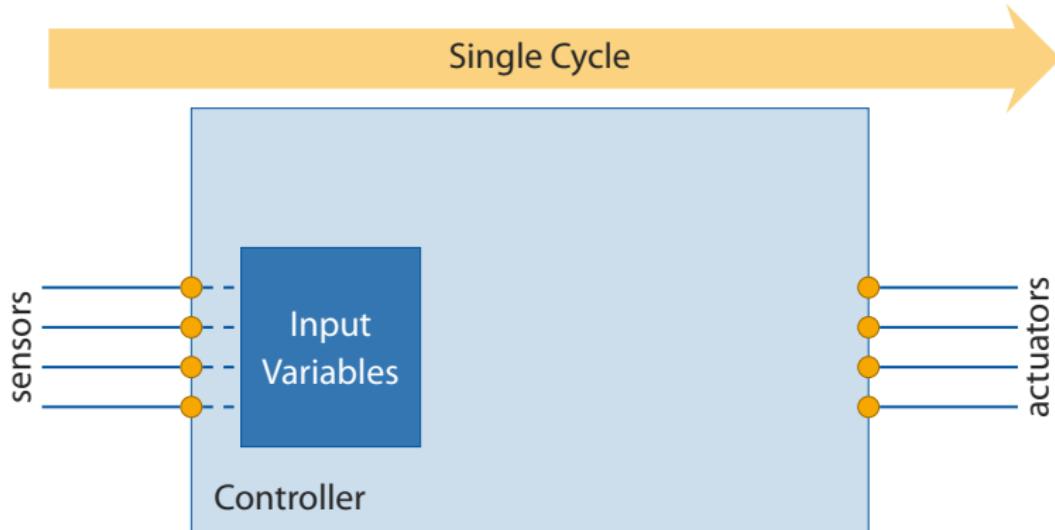
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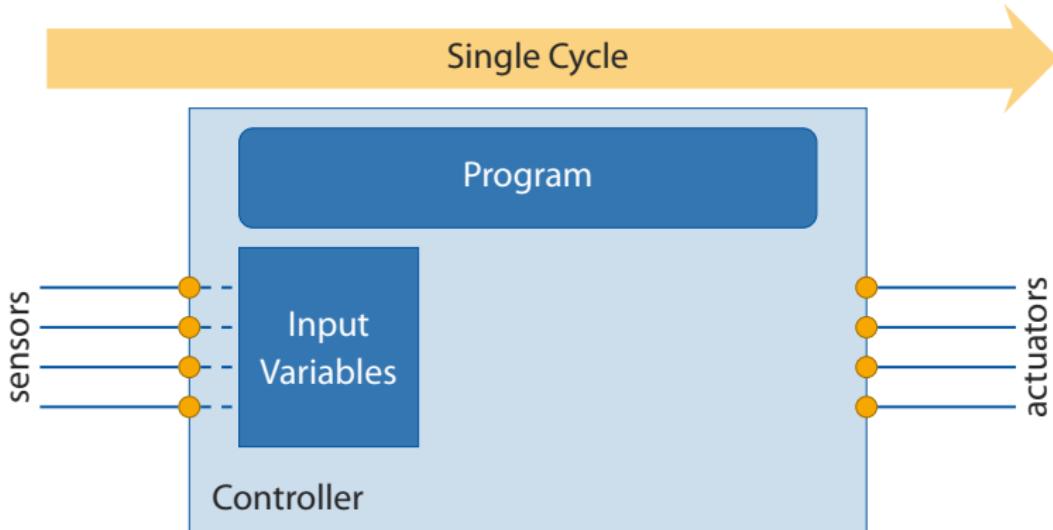
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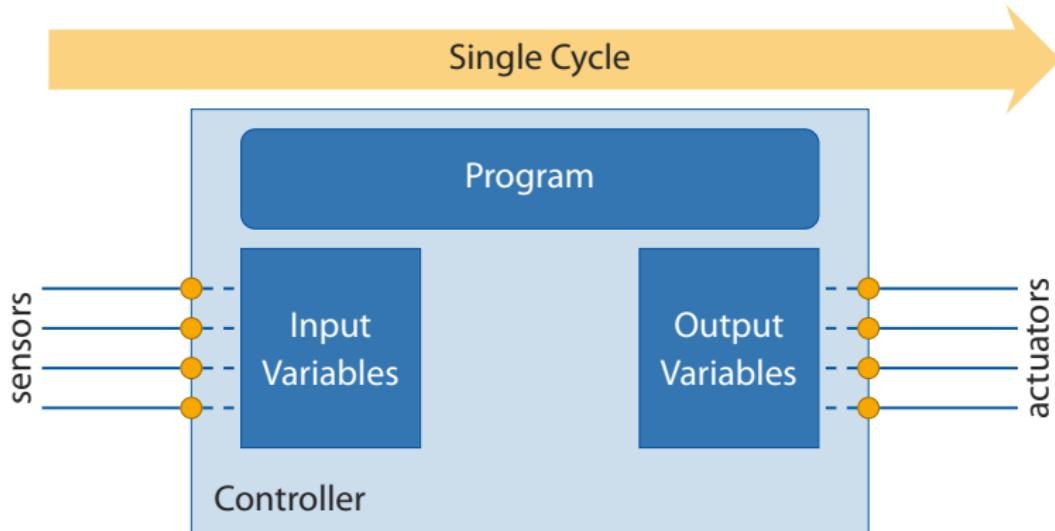
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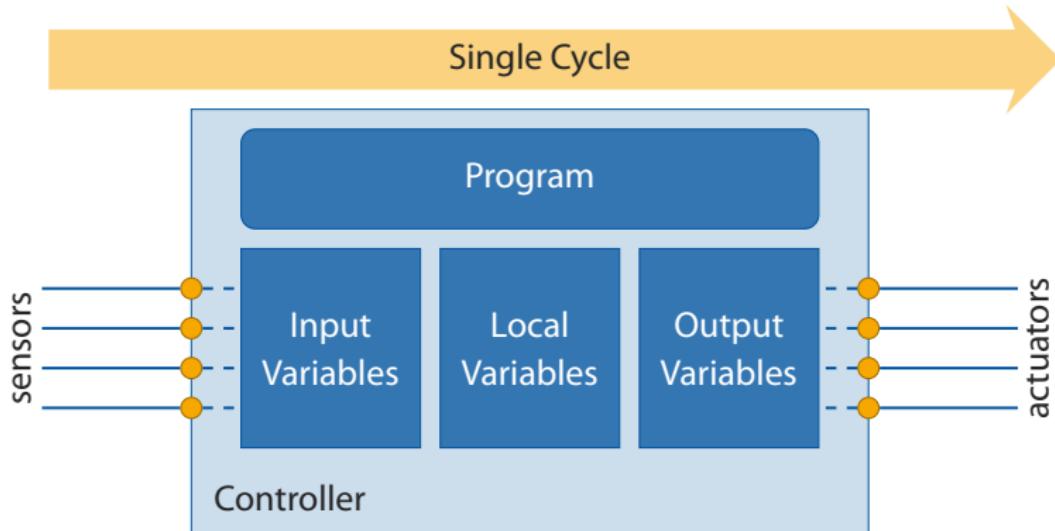
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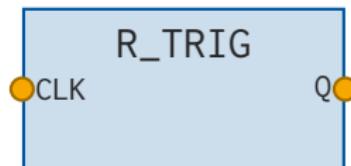
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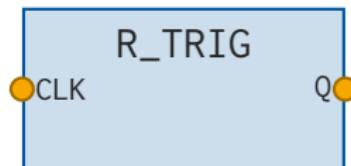
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2   VAR_INPUT
3     CLK:BOOL;
4   END_VAR
5   VAR
6     M:BOOL;
7   END_VAR
8   VAR_OUTPUT
9     Q:BOOL;
10  END_VAR
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12  IF CLK AND NOT M THEN
13    Q:=TRUE;
14  ELSE
15    Q:=FALSE;
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- ▶ Modularisation via function blocks
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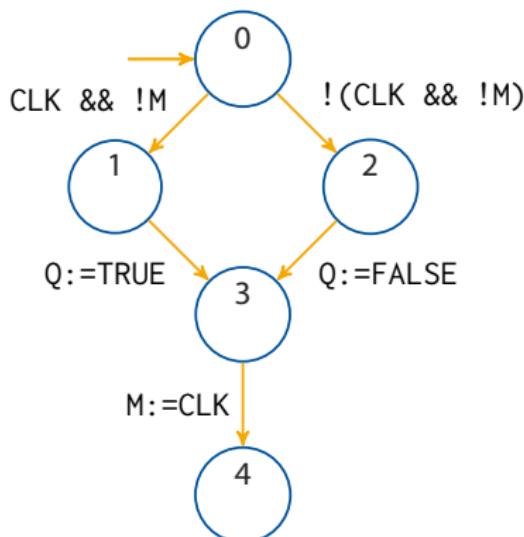
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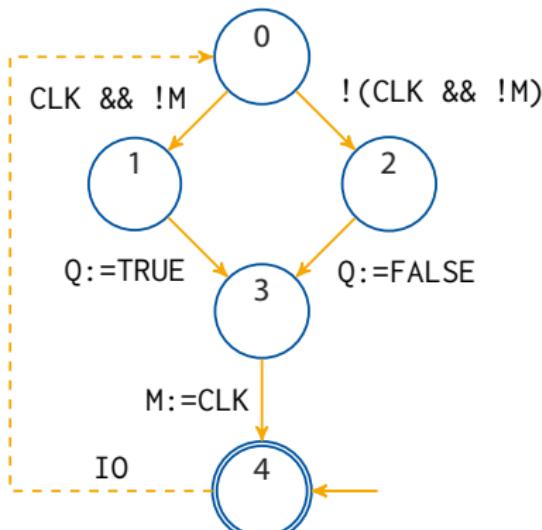
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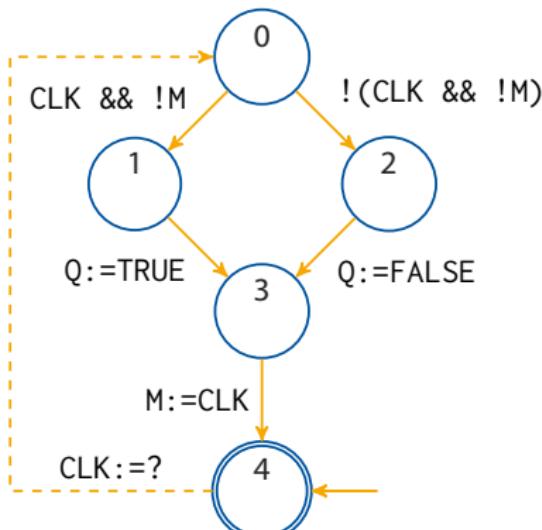
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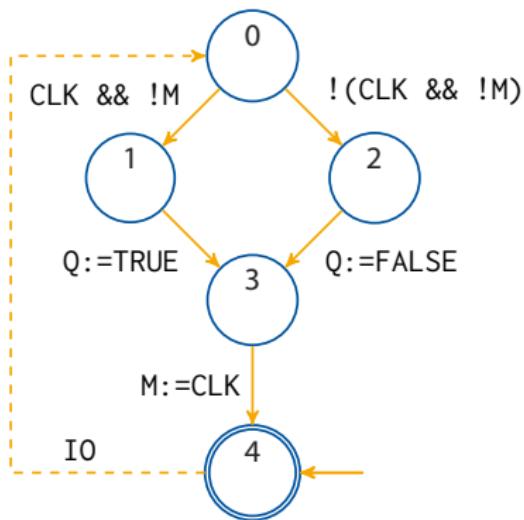
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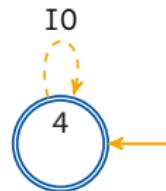
Specifications

- ▶ Intermediate states are not observable
- ⇒ Automation engineers and specifications always refer to the observable state
- ▶ Common specifications can be adapted to such cycle-step semantics, e. g.
 - ($M = CLK$) \rightsquigarrow □($pc = 4 \rightarrow M = CLK$)
 - and checked with off-the-shelf backends
- ▶ Unique specs need dedicated procedures



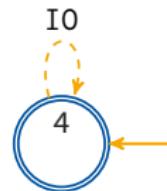
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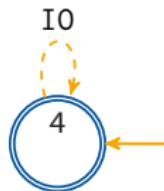
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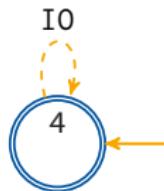
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- ▶ Focus on **technical specifications** around IEC 61131-3, e. g.

Performed most experiments on implementation of PLCopen Safety library:

- ▶ Elementary modules implementing particular safety concepts
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Exchange format



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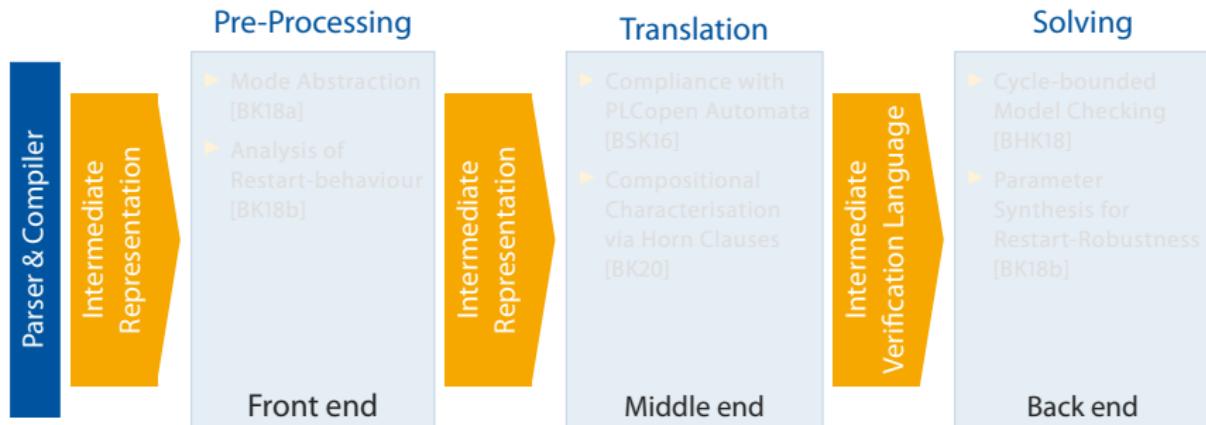
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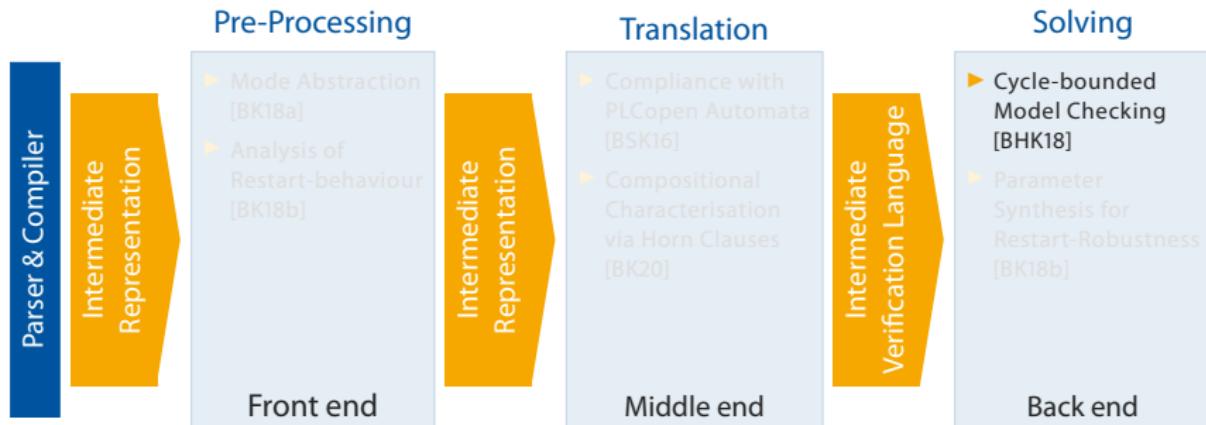
Contributions

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- ▶ Implemented in **ARCADE.PLC**, but formulated for CFAs and transferable
- ▶ Not included: Test generation [Boh+16], Explainability [Kö+19]



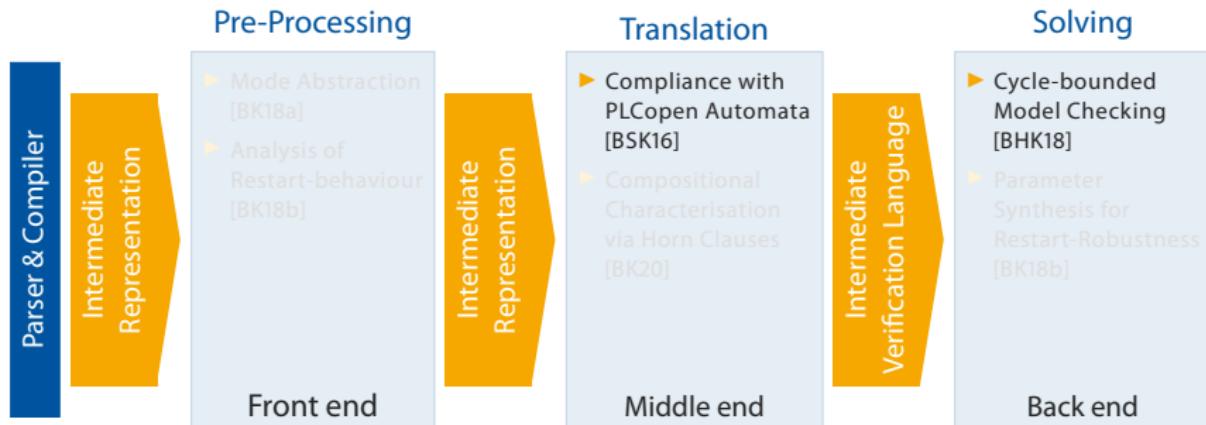
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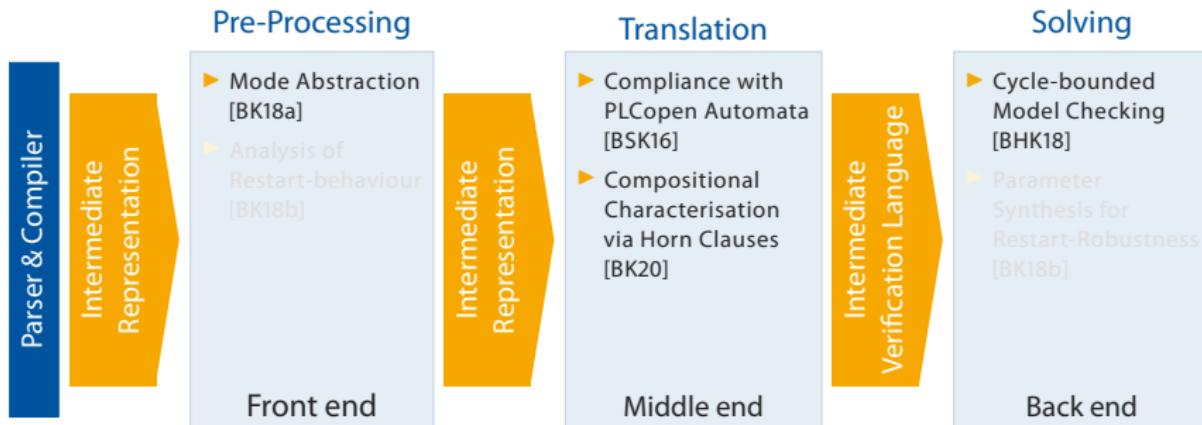
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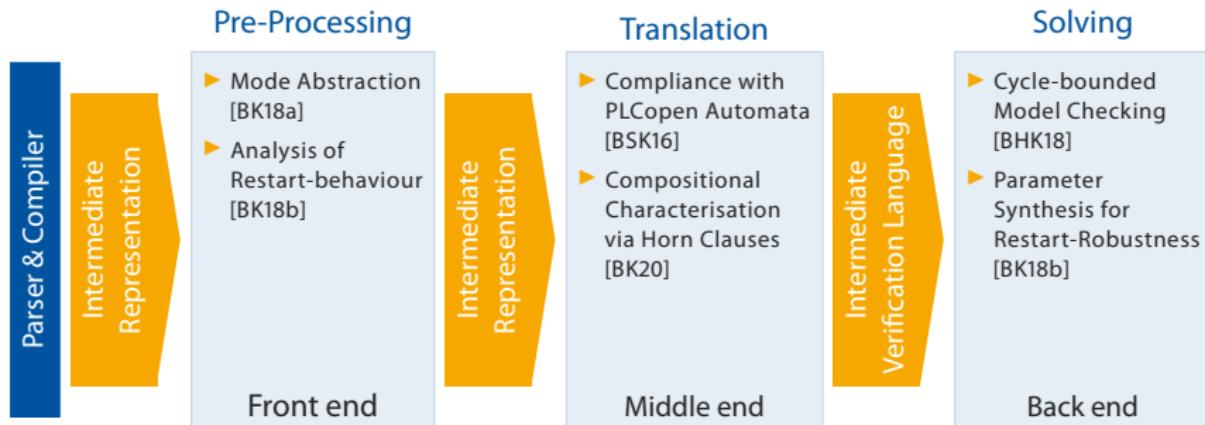
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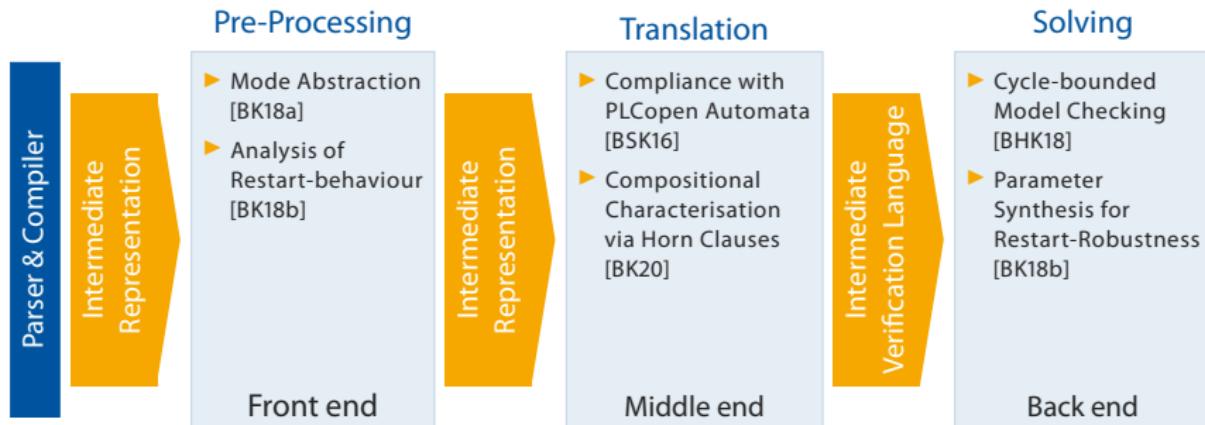
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Related Work

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 - reasoning on **model-level** – problems akin to hardware verification
 - using **binary decision diagrams** (BDDs) based backends [Ova+16]
- ▶ Darvas focuses on translation [DVA15] & BDD-based verification [Dar17]
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- ▶ Lange worked on property directed reachability (PDR) for CFAs [Lan18]
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- ▶ Lange worked on **property directed reachability** (PDR) for CFAs [Lan18]
- ▶ Weigl develops methods to assist **software evolution** [Bec+15; Bec+17]
- ⇒ Although common for “ordinary” software, besides Weigl no one targets **SAT-based verification of PLC software or domain-specifics**

Constrained Horn Clauses (CHCs)

- ▶ A reactive system is safe if an **inductive invariant** $\text{Reach}(\vec{X})$ exists, s.t. the following is SAT [MP95]:

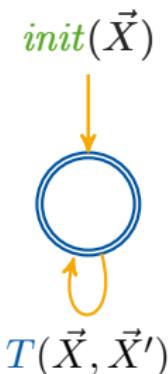
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- ▶ Given sets of **variables** \mathcal{V} , **function symbols** \mathcal{F} , and **predicates** \mathcal{P} , a CHC is a formula

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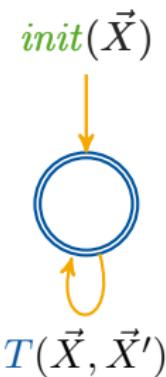
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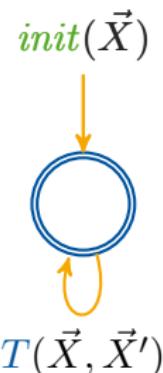
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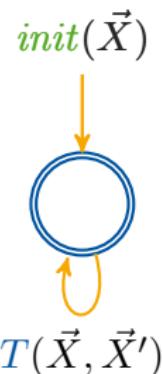
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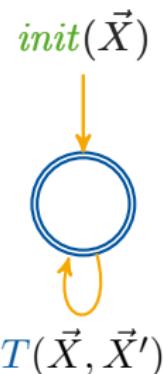
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CHCs as Intermediate Verification Language

- ▶ In 2010, Bradley proposed a novel hardware model checking algorithm
 - IC3/PDR constructs inductive invariants incrementally
 - Was competitive with highly tuned solvers – 3rd place at HWMCC'10
- ⇒ Incentive for lifting it to software verification – no approach prevailed
- ▶ CHCs are a logical match for Hoare logic and correspond to proof rules
- ▶ GPDR and SPACER generalised PDR to CHCs
- ⇒ Using CHC-solving, emerging tools were competitive at SV-COMP'15

Practical advantages:

- ▶ CHC solving is just a case of SMT – keeping its flexibility and techniques
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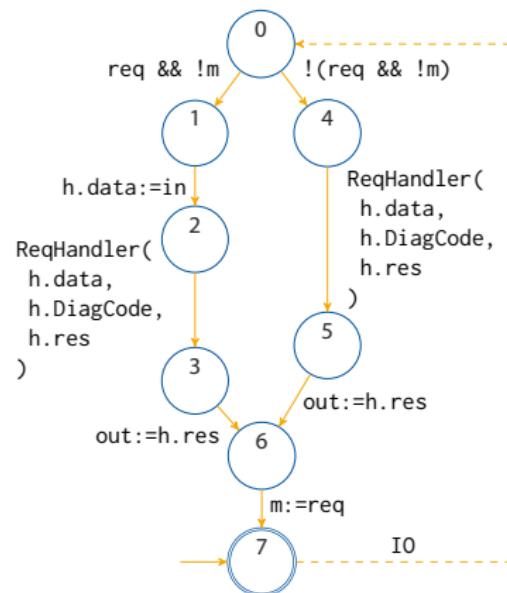
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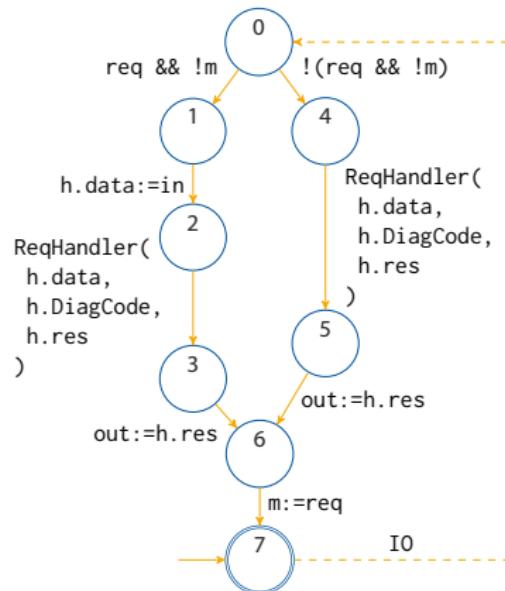
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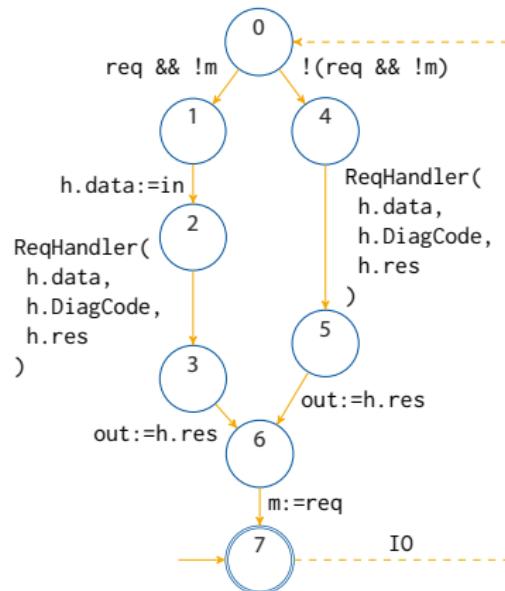
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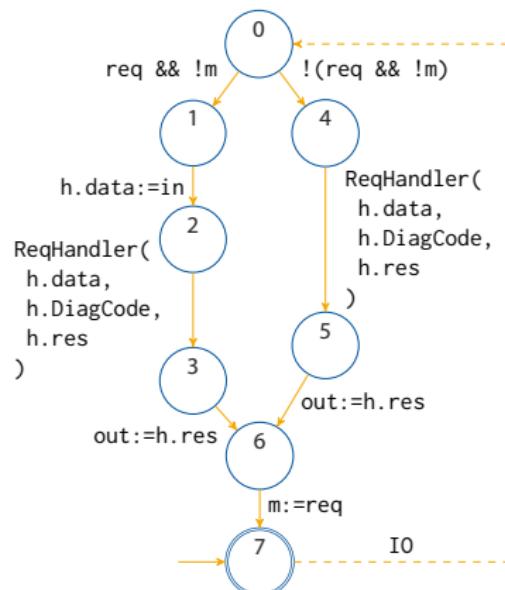
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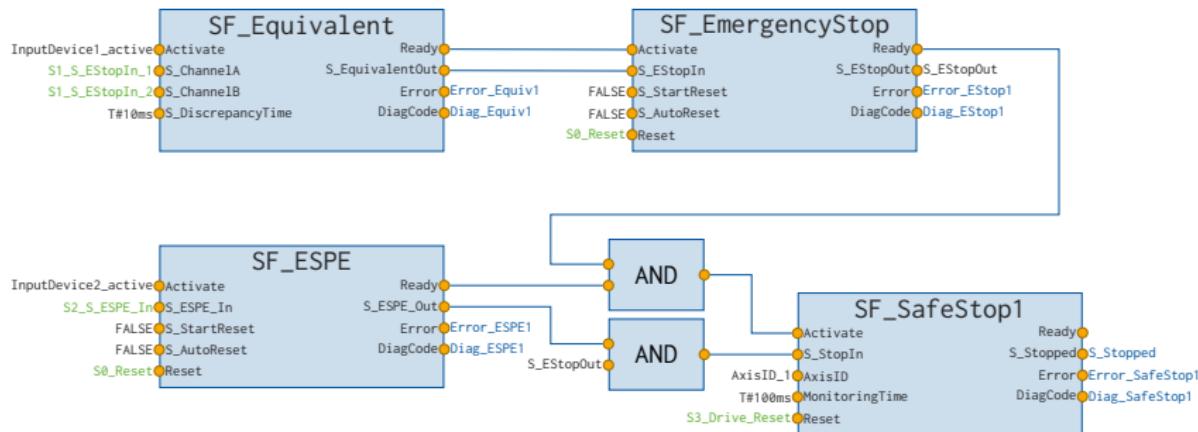
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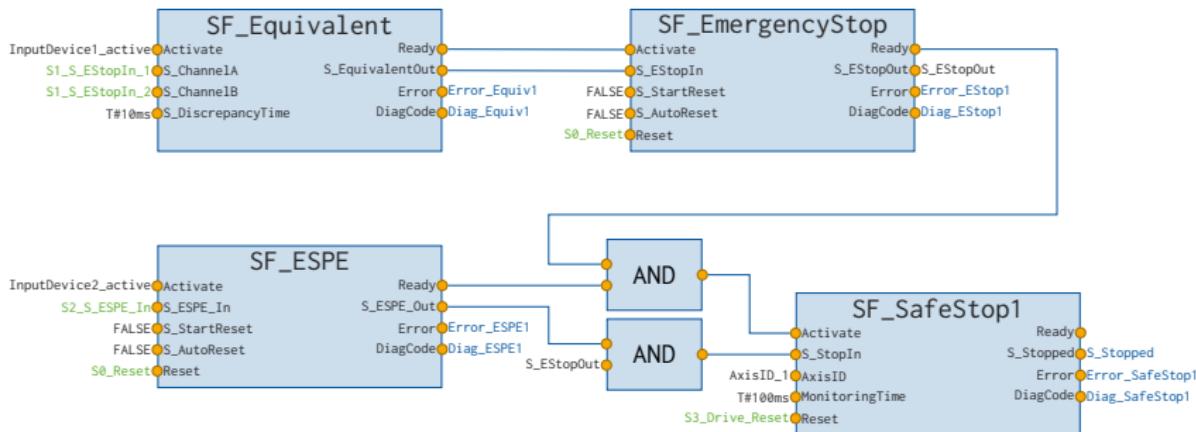
Approach

PLCopen Safety Application



- Real-world software consists of many blocks – potentially same ones
- However, existing approaches are non-compositional or BDD-based
- Effectively model checking a flattened all-encompassing block

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Compositional Characterisation

- Let P_i characterise a state \vec{X}' at i ,
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$Main_0(\vec{X}, \vec{X}') \wedge req' \wedge \neg m' \wedge \vec{X}'' = \vec{X}'$

$\rightarrow Main_1(\vec{X}, \vec{X}'')$

- Gives a way to capture a block's I/O:

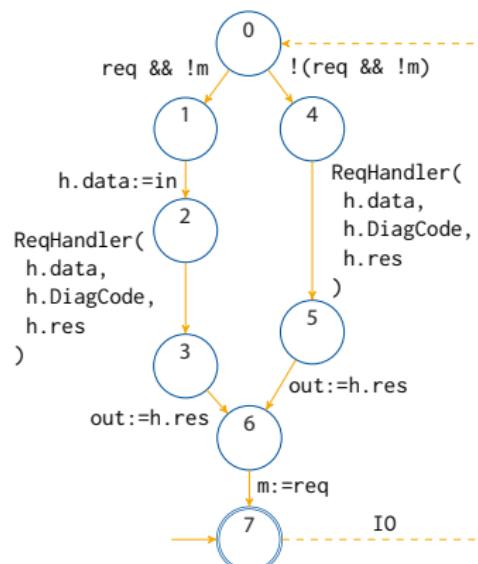
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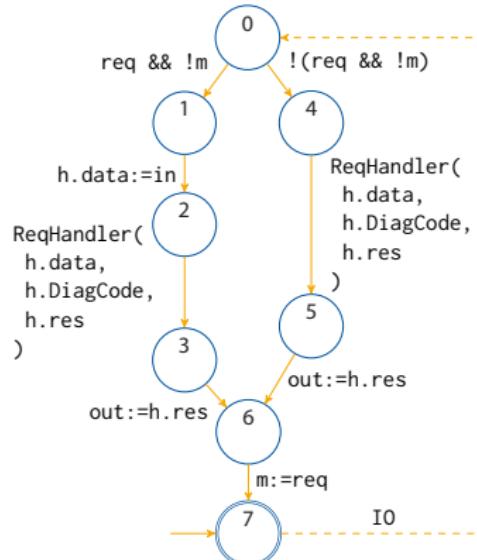
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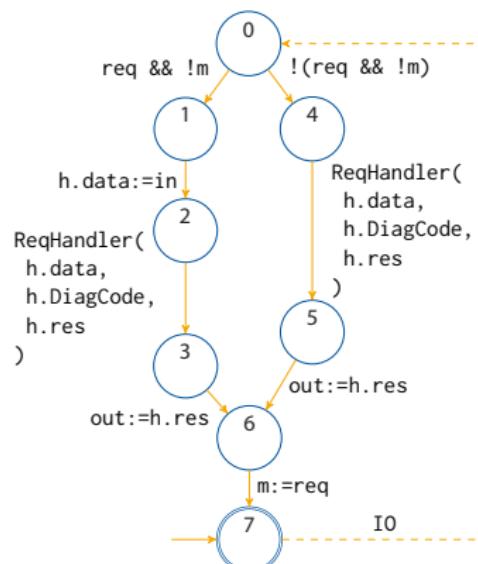
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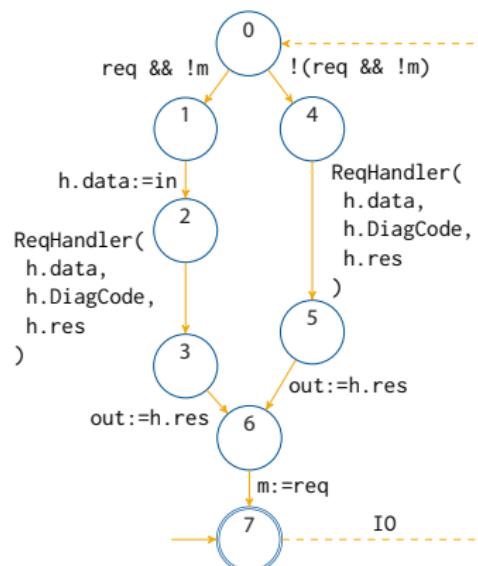
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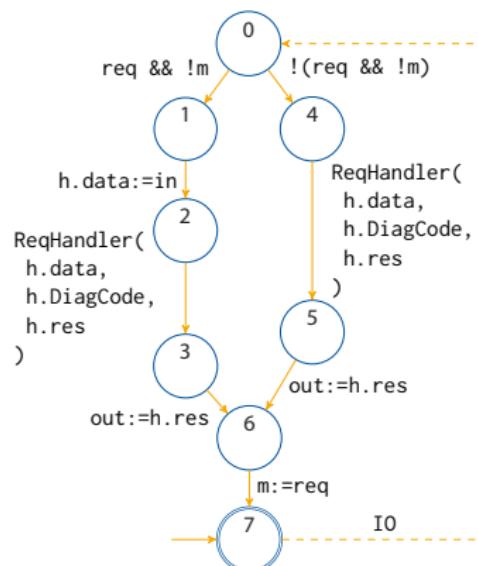
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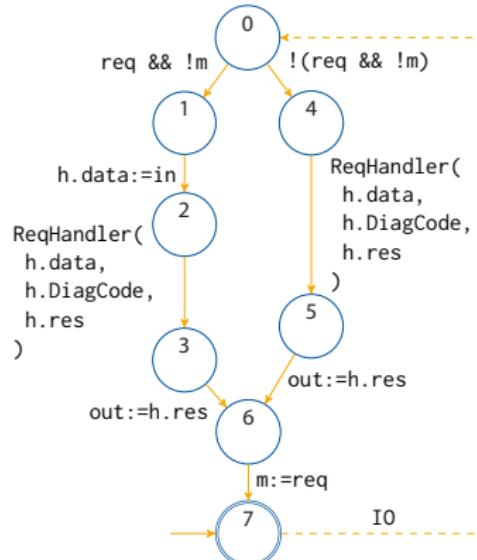
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Experiments

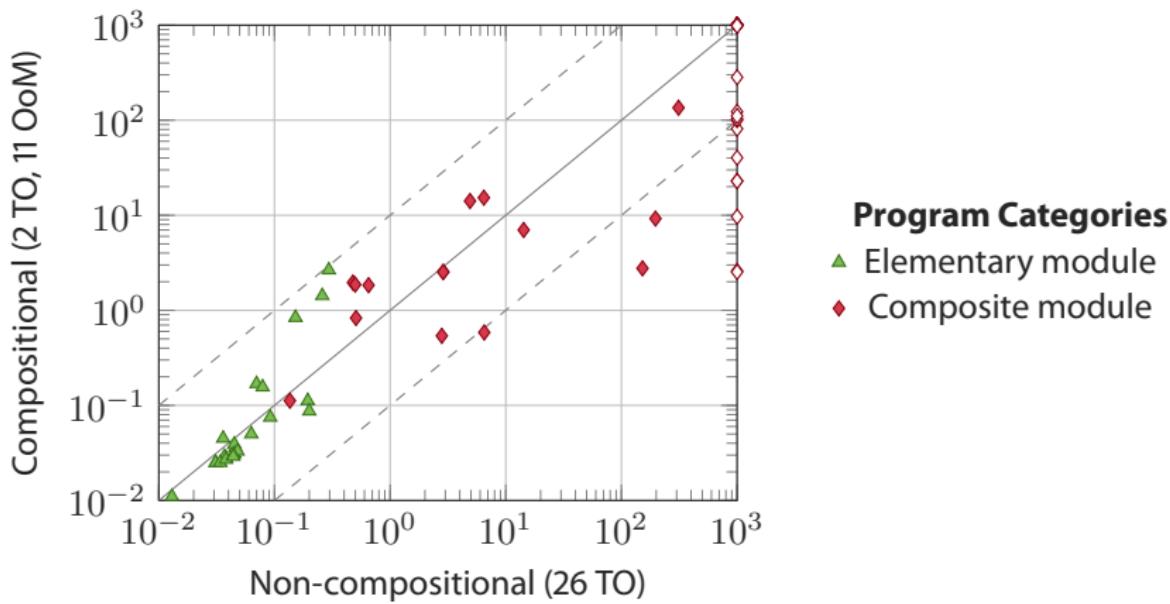
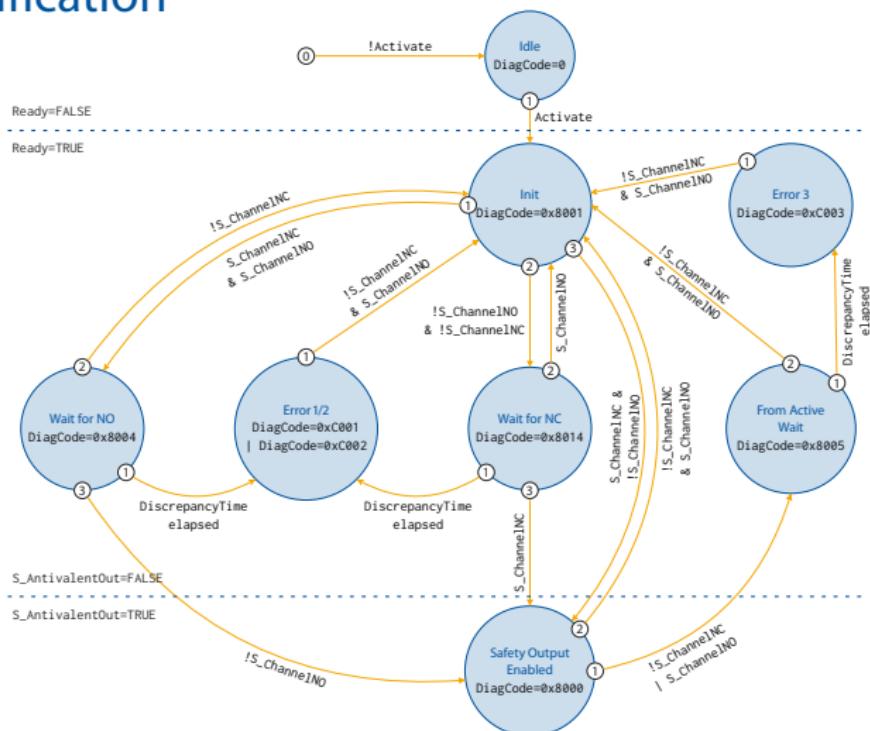


Figure: Time [s] spent on each verification task (n=64)

Mode Abstraction

PLCopen Block Specification

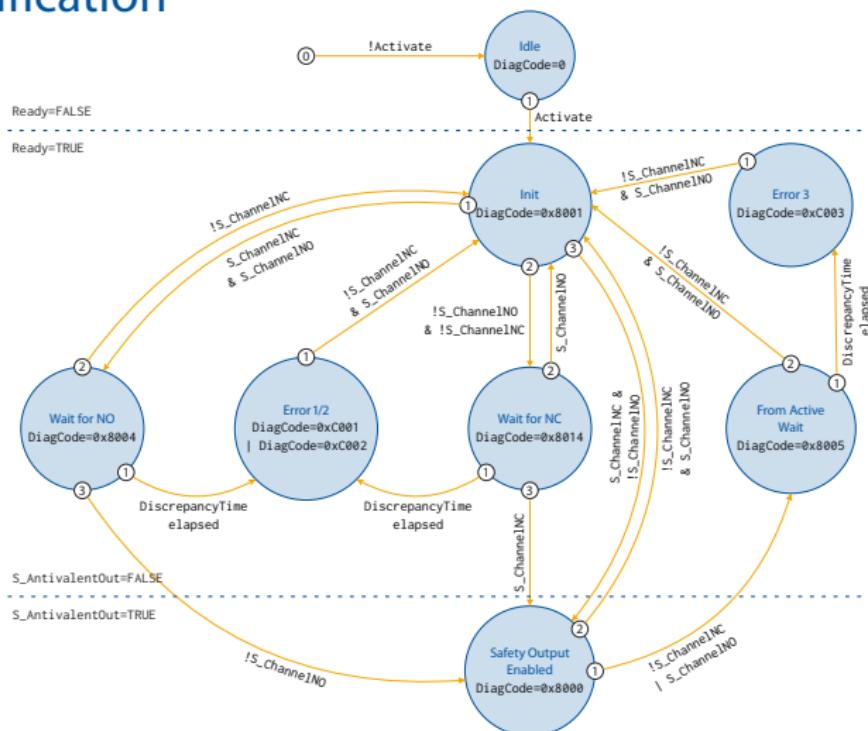
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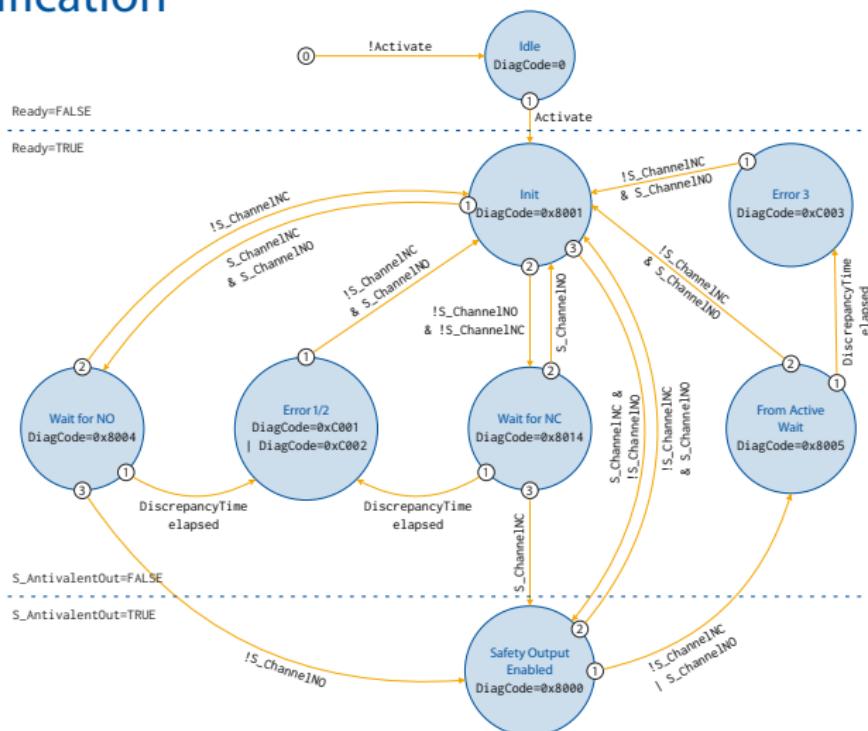
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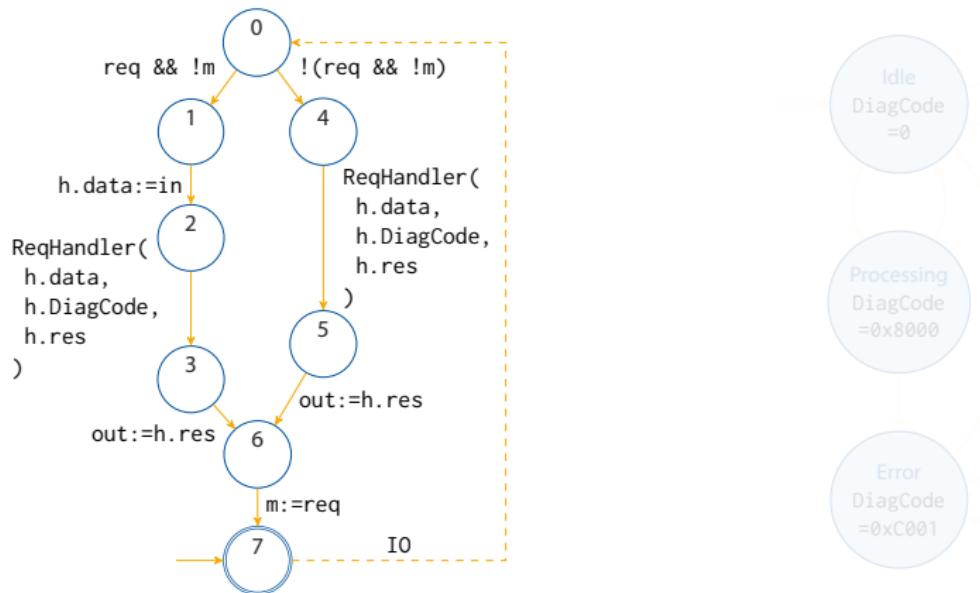
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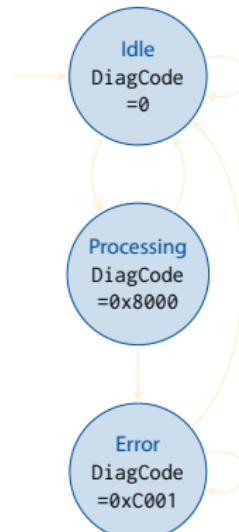
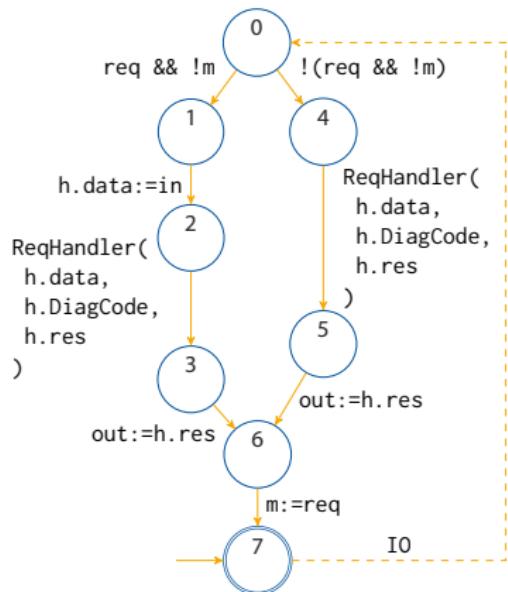
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- Are requests processed in \leq two execution cycles?
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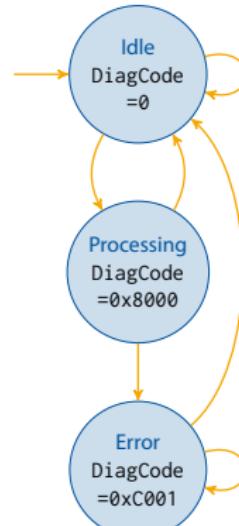
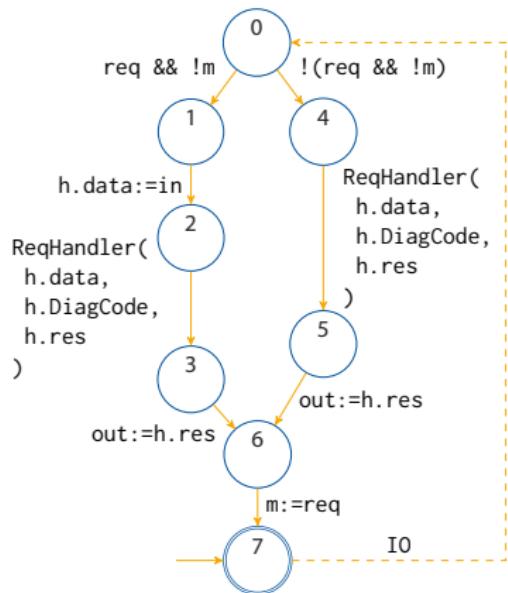
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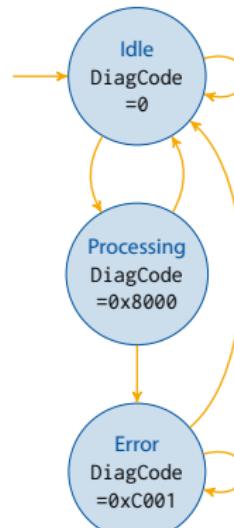
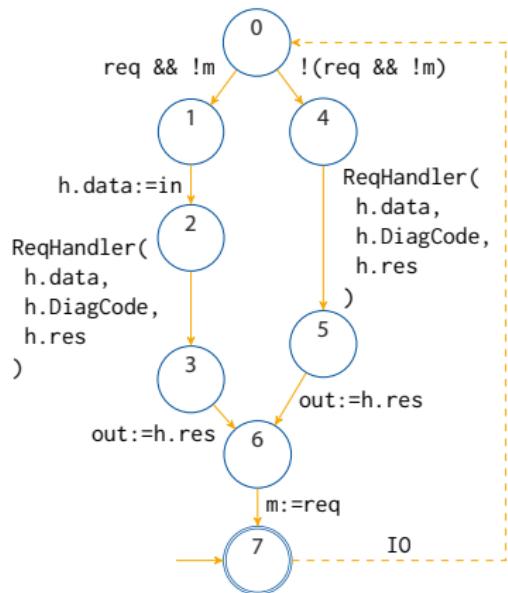
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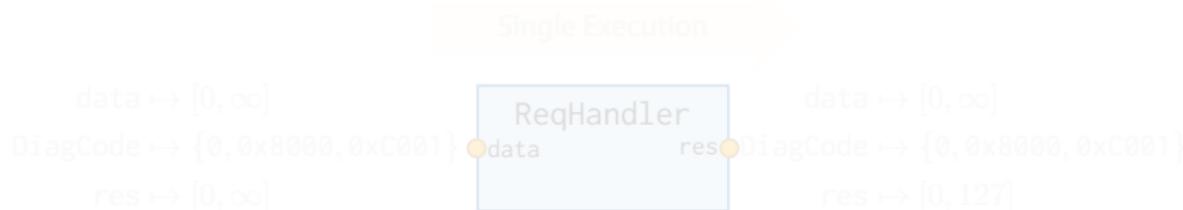
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1. Perform VSA on main CFA to approximate all variables' values
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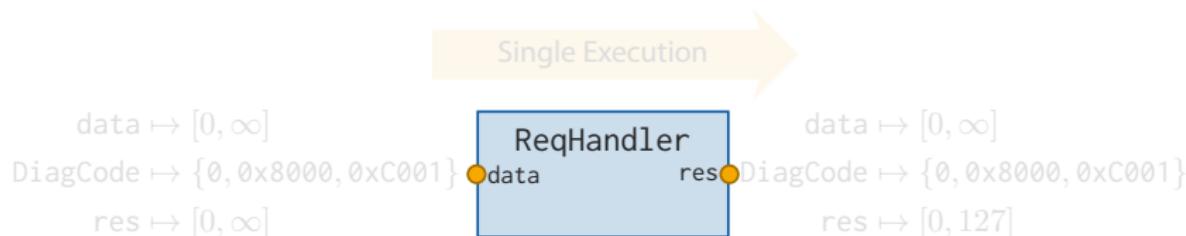


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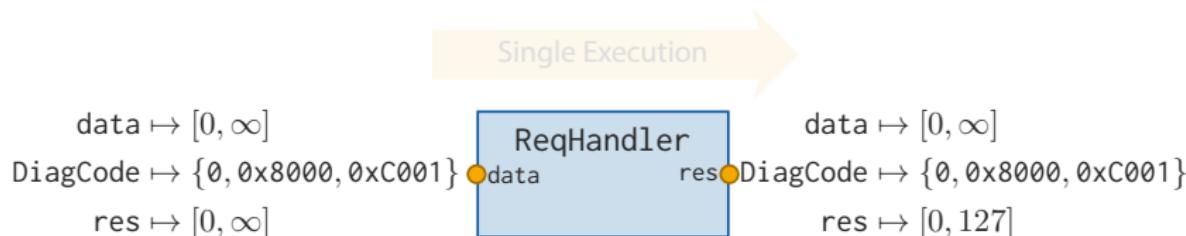


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Idea: Procedure's complexity needs to be low w.r.t. CHC-solving

⇒ Adapt value-set analysis (VSA)

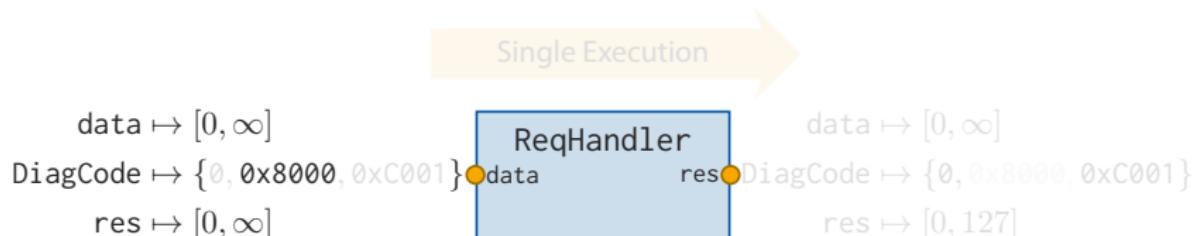


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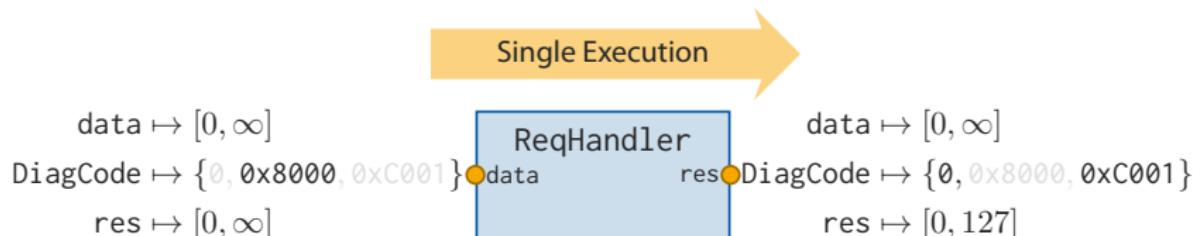


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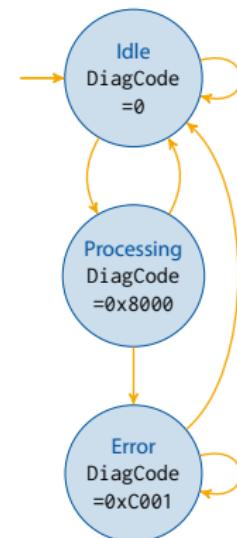
Mode Space as Call Summary

- Mode space **constrains** possible transitions

⇒ Yields call summary $S_{ReqHandler}(\vec{X}_h, \vec{X}'_h)$:

$$\begin{aligned} & (h.DiagCode = 0 \rightarrow h.DiagCode' = 0 \\ & \quad \vee h.DiagCode' = 0x8000) \\ & \wedge (h.DiagCode = 0x8000 \rightarrow h.DiagCode' = 0 \\ & \quad \vee h.DiagCode' = 0xC001) \\ & \wedge (h.DiagCode = 0xC001 \rightarrow h.DiagCode' = 0 \\ & \quad \vee h.DiagCode' = 0xC001) \end{aligned}$$

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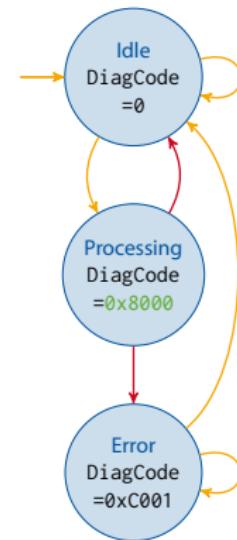


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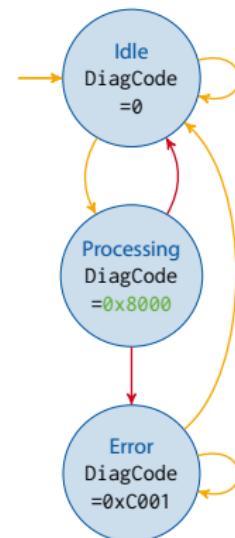
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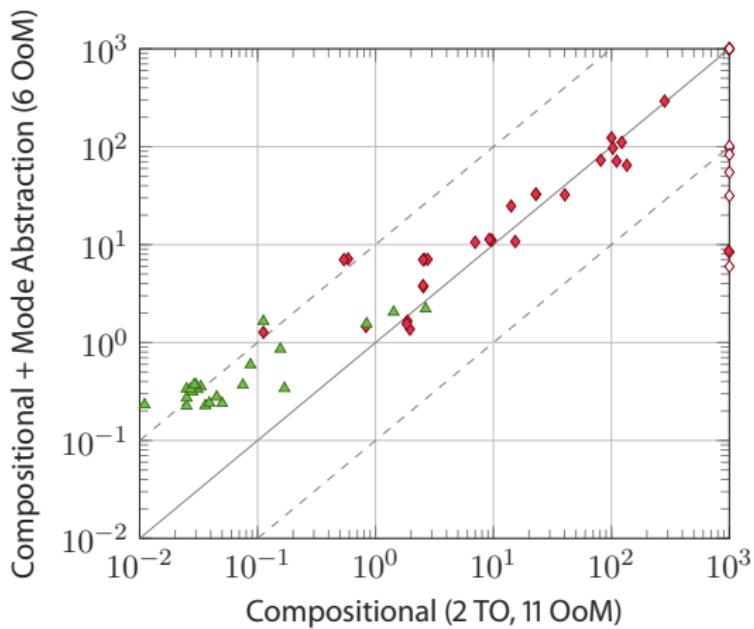


Figure: Time [s] spent on mode abstraction and solving CHCs ($n = 64$)

Restart-Behaviour

However:

- ▶ A proof holds w.r.t. the formal model – not the real system
 - ⇒ Model is usually **missing behaviour** enabled by hardware

Battery-backed memory & restart-functionality:

- ▶ Non-volatile state variables allow for “restart-robust” designs
 - ▶ Restarts may be triggered by a watchdog timer, power surge, ...
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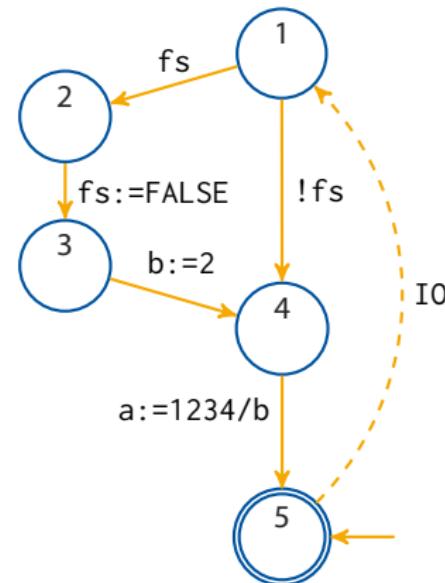
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- ▶ Initially $fs \mapsto true, a \mapsto 0, b \mapsto 0$
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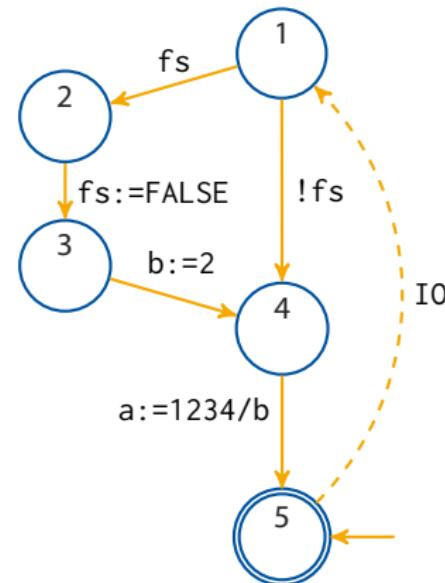


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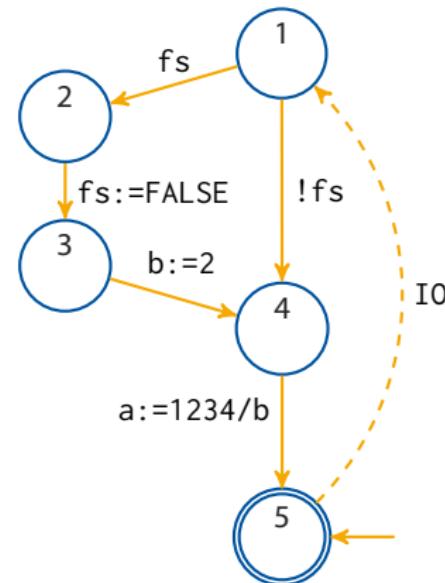


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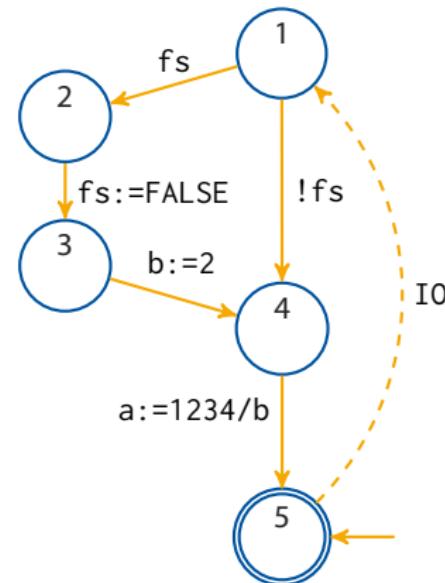


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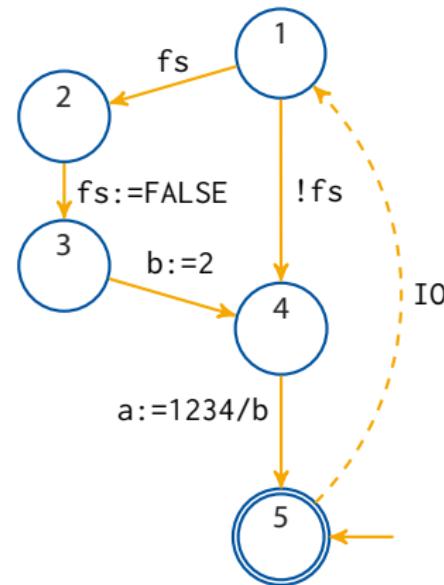


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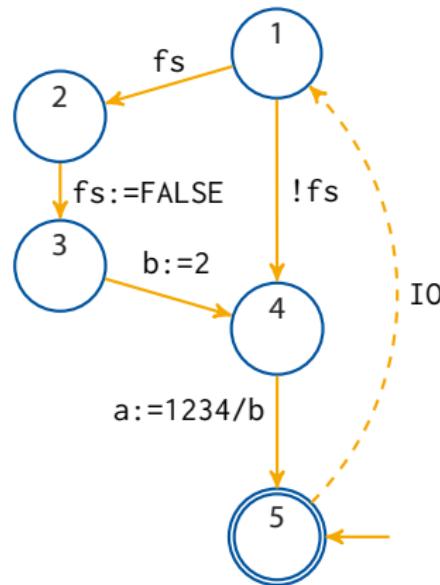


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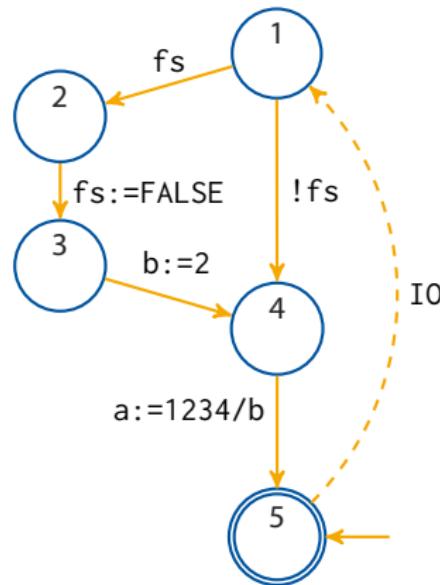


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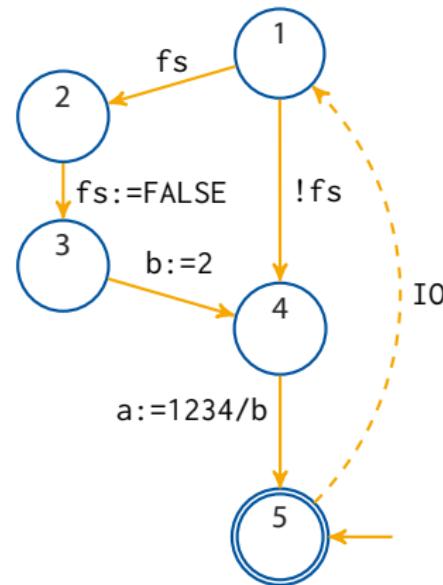


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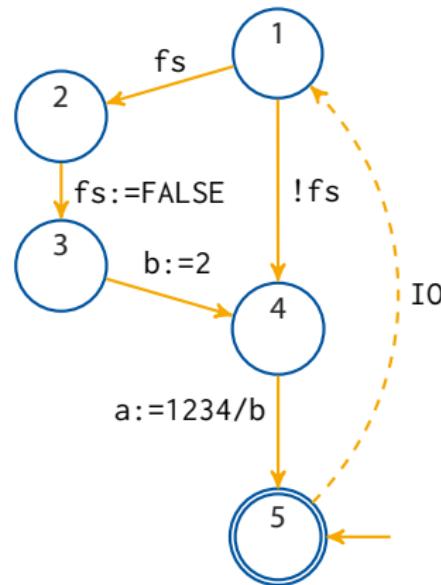


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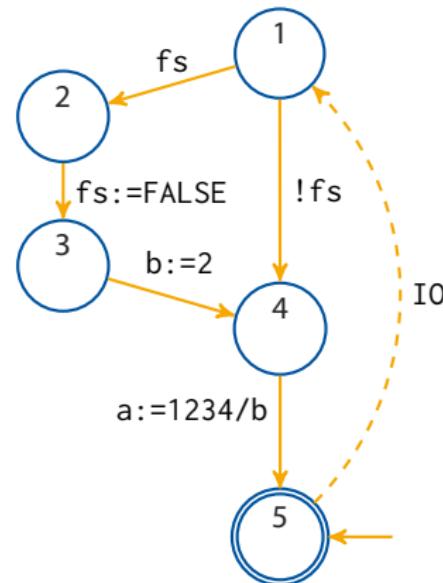


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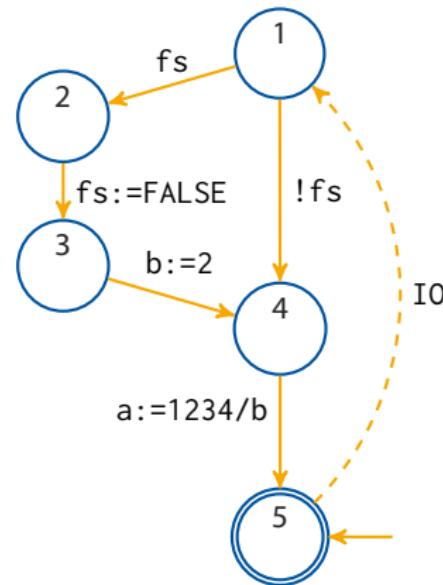


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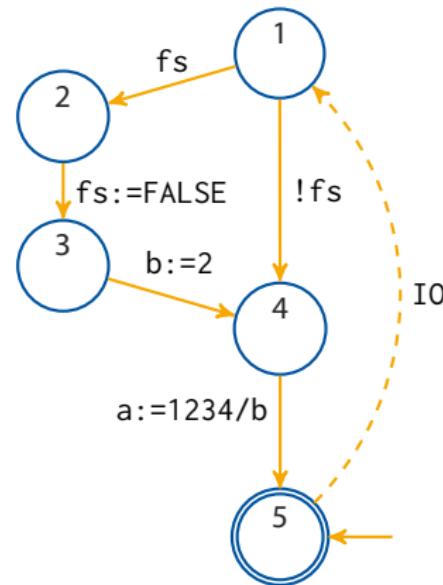


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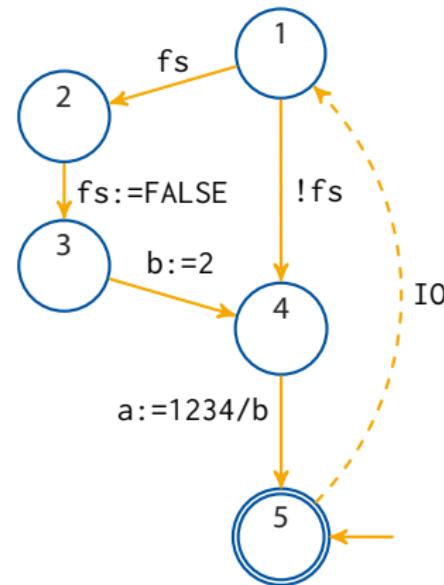


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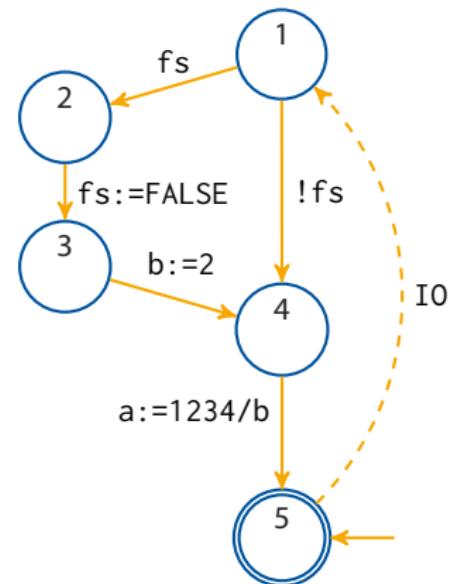
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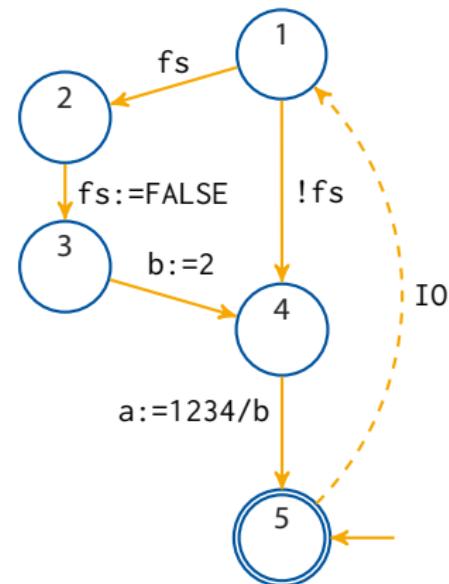
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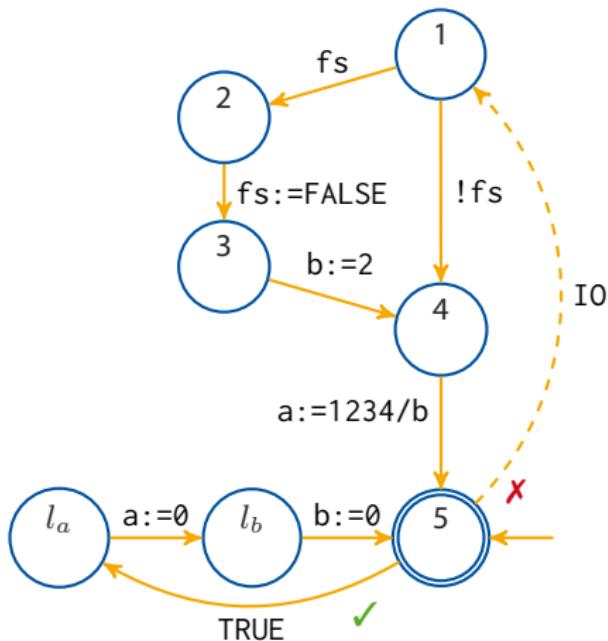
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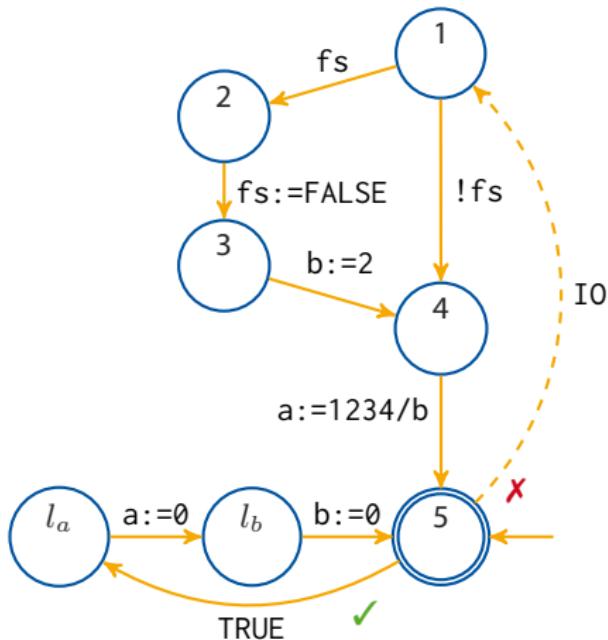
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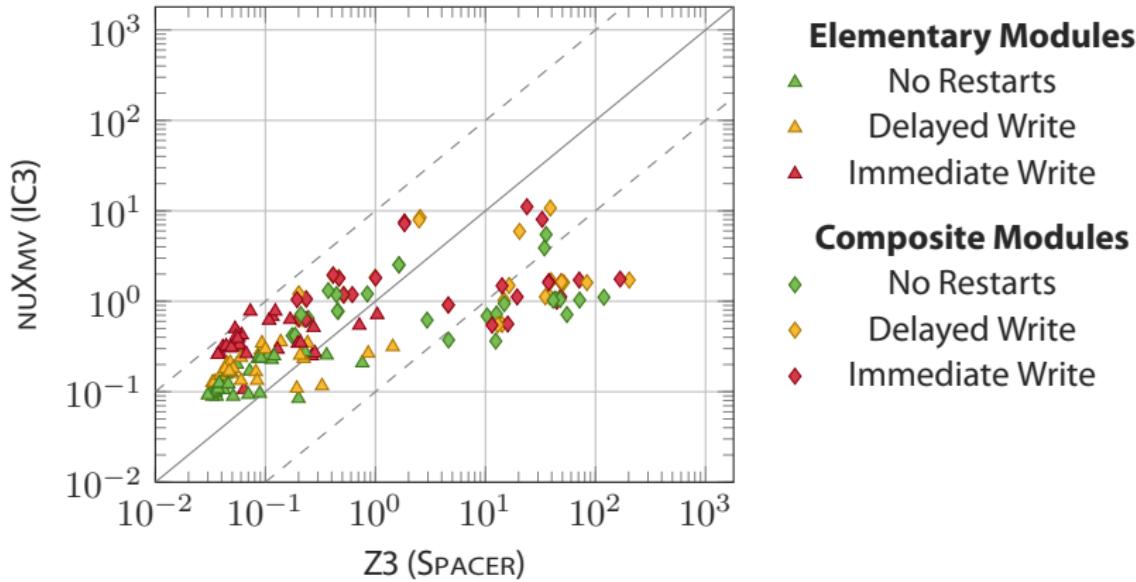


Figure: Time [s] spent checking restart-robustness w.r.t. each spec ($n = 3 \cdot 56$)

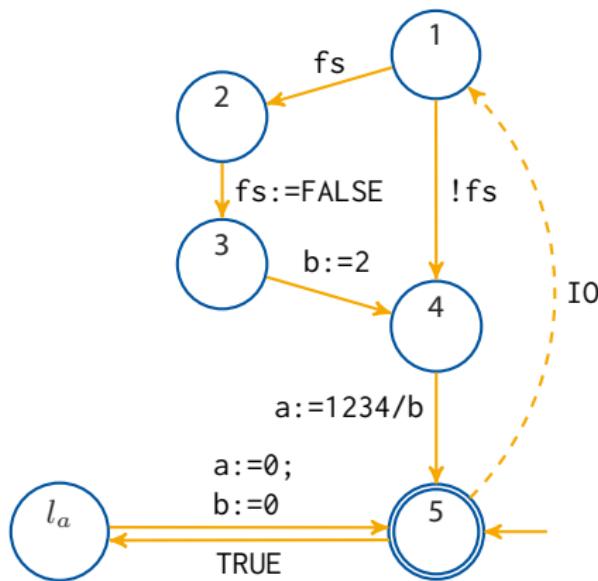
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- ▶ No aid in picking safe configuration of retain variables
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$$\forall \vec{V} \underbrace{\dots}_{\text{body}} \rightarrow h(\vec{V})$$

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Synthesis of Safe Retain Configurations

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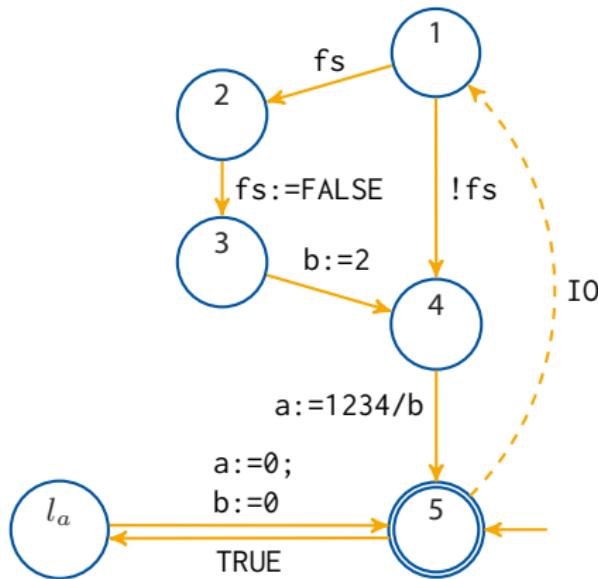
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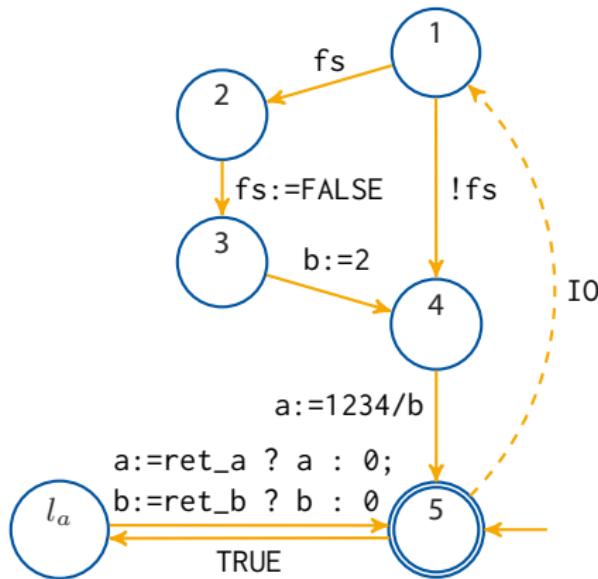
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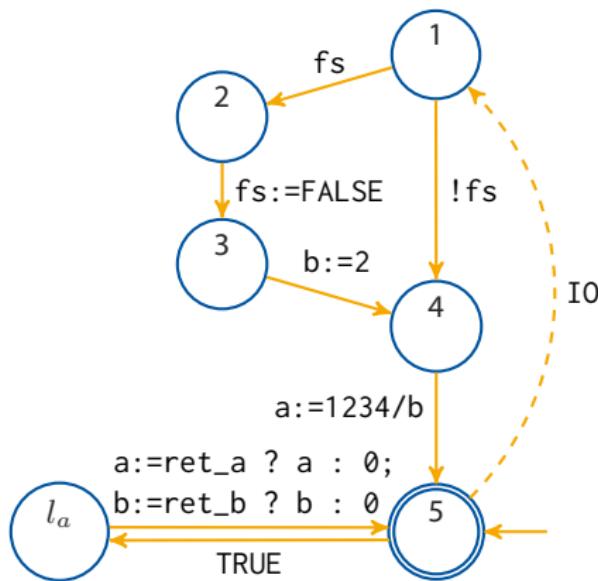
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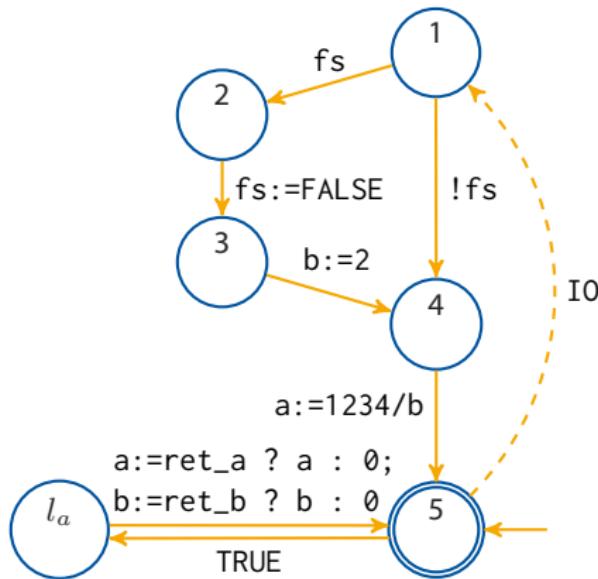
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Counterexample-Guided Parameter Synthesis

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- ▶ Our special case: existential quantification over Booleans

Idea:

- ▶ Manage choice and reuse efficient check for fixed parameters
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Synthesis of Safe Retain Configurations

Example

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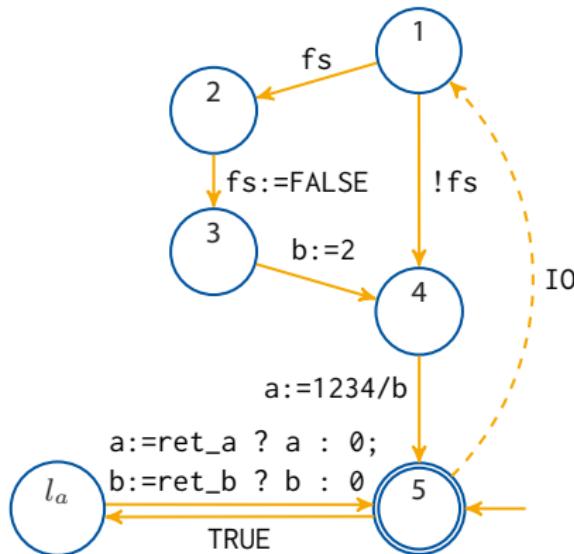
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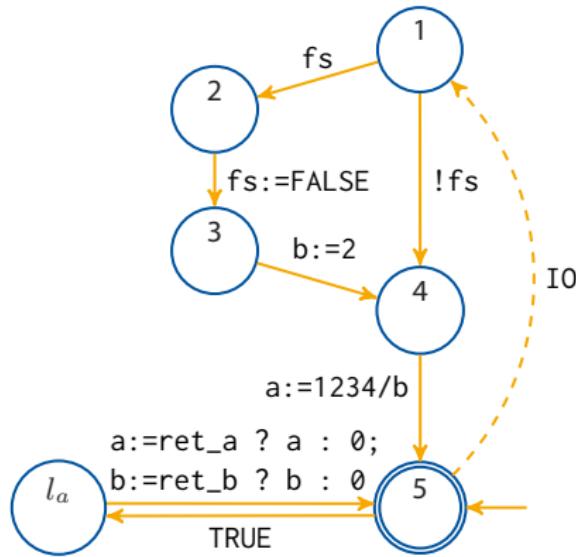
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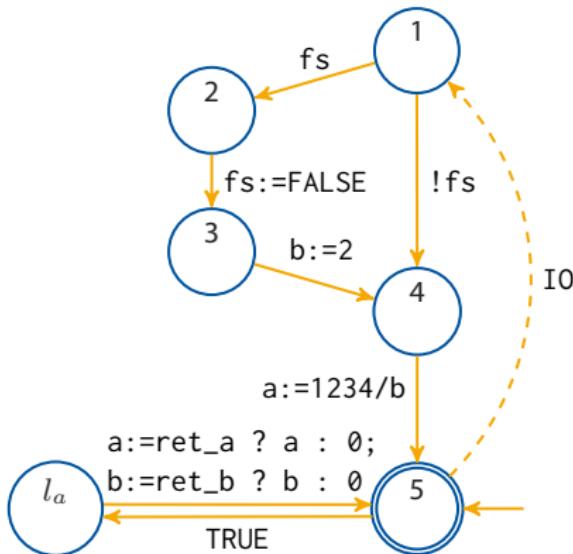
$$c = \neg \text{ret}_a \wedge \neg \text{ret}_b$$

3. Find subset of violating parameters

$$c_g = \neg \text{ret}_b$$

4. Refine $\text{safe}(\vec{V}_{\text{par}}) = \text{true} \wedge \neg c_g$

5. Backend finds **no violations**



Synthesis of Safe Retain Configurations

Example

- ▶ Make the program restart-robust w.r.t. $a \geq 0$ under **delayed writes**
- ▶ Let **fs** be required to be **retained**

Process:

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2. Backend finds **counterexample**

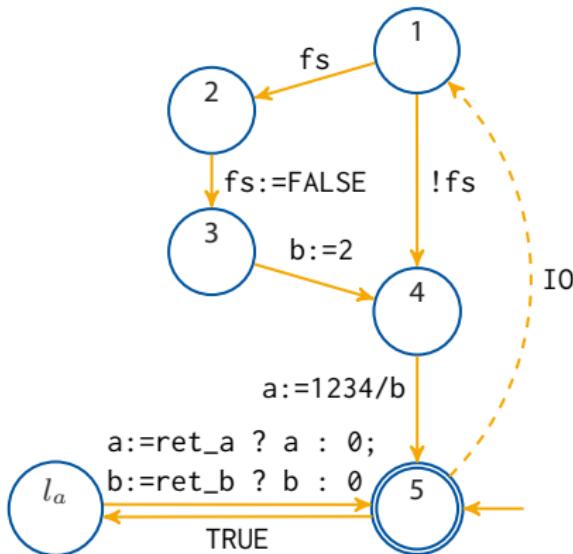
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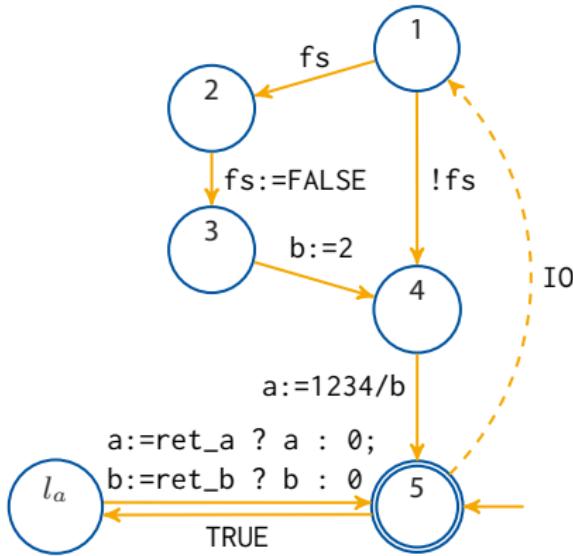
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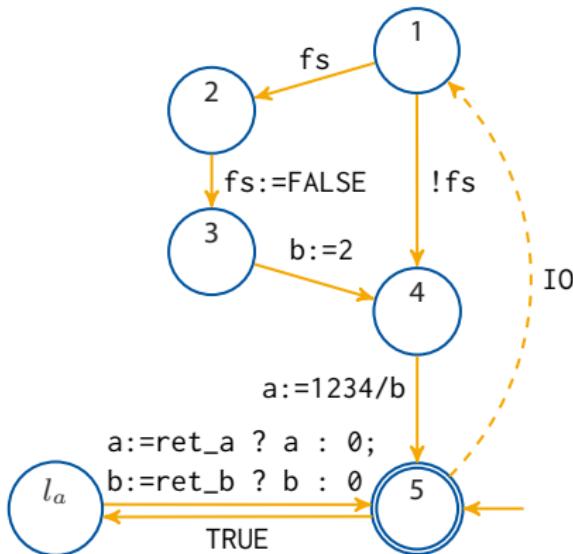
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Synthesis of Safe Retain Configurations

Experiments

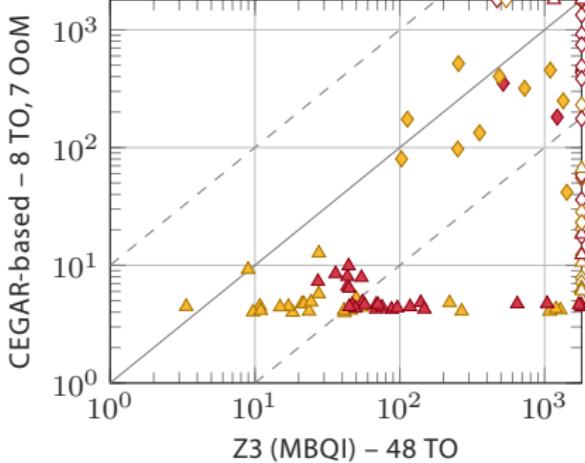
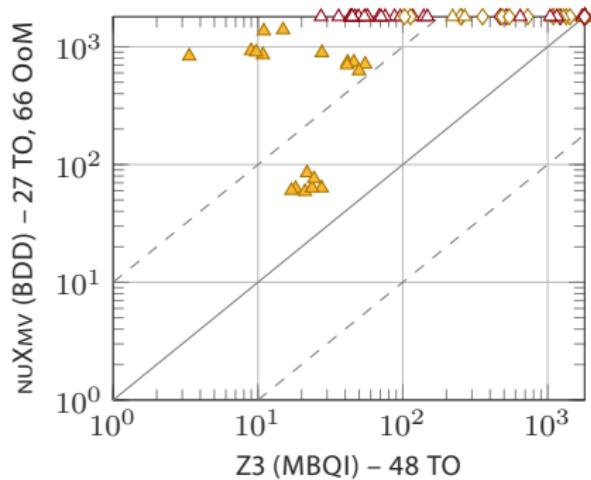


Figure: Time [s] spent on synthesis of restart-robust configurations ($n = 2 \cdot 56$)

Summary

- ▶ Software verification machinery **hardly used in industrial control**
- ▶ Most focus on checking **common specifications** with existing tooling

- ▶ We proposed **SMT-based verification** procedures
- ▶ **Competitive** with existing tooling
- ▶ Enabled verification of previously
 - “**problematic**” tasks
 - unsupported **domain-specific specifications**

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