

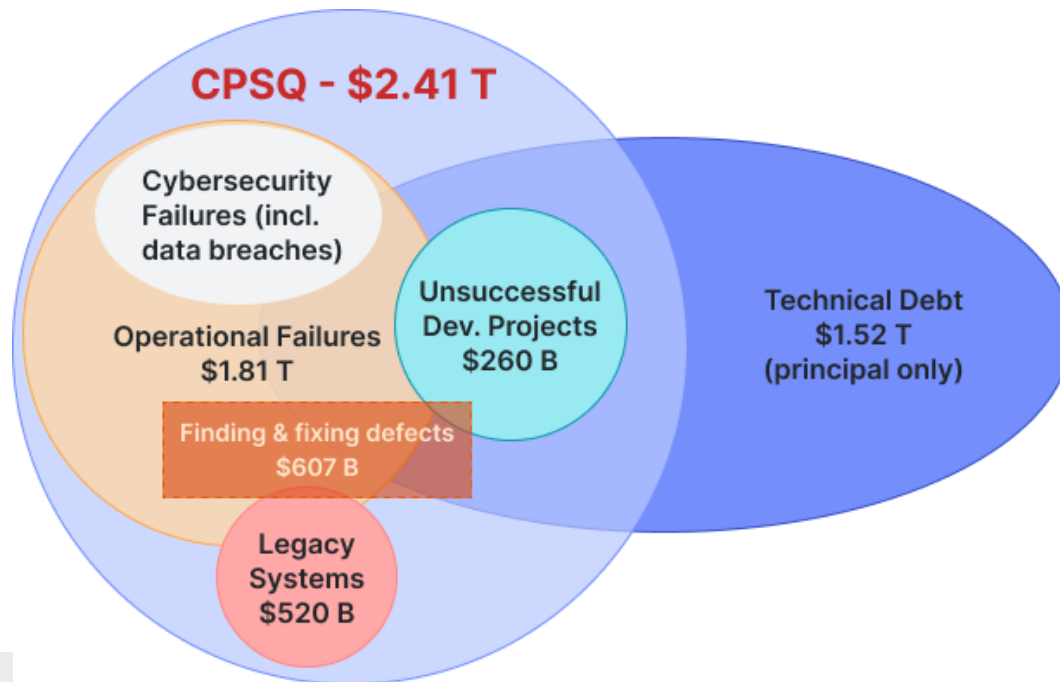
AI-Assisted Formal Verification: Towards Fast, Accessible, and Rigorous Software Verification



Lucas C. Cordeiro
Department of Computer Science
lucas.cordeiro@manchester.ac.uk
<https://ssvlab.github.io/lucasccordeiro/>

The \$2.41 Trillion Problem

Poor software quality cost US companies \$2.41 trillion in 2022, while the accumulated software Technical Debt (TD) has grown to ~\$1.52 trillion



→ 50%+ of project costs go to debugging, not building

→ The stakes are even higher for AI-generated code

→ AI makes us faster, but are we safer?

How Secure is AI-Generated Code?

Category	Avg Prop. Viol. per Line	Rank	$\mathcal{VS}$	Rank	$\mathcal{VF}$	$\mathcal{VU}$ (Timeout)	Avg Prop. Viol. per File
GPT-4o-mini	0.0165	3	4.23%	2	57.14%	36.77%	3.40
Llama2-13B	0.0234	2	12.36%	1	51.30%	31.78%	3.62
Mistral-7B	0.0254	7	8.36%	4	62.08%	25.88%	3.07
CodeLlama-13B	0.0260	1	15.48%	3	52.71%	29.52%	4.13
Falcon-180B	0.0291	8	6.48%	5	62.07%	28.67%	3.38
GPT-3.5-turbo	0.0295	6	7.29%	7	65.07%	26.09%	4.42
Gemini Pro 1.0	0.0305	5	9.49%	6	63.91%	24.13%	4.70
Gemma-7B	0.0437	4	11.62%	8	67.01%	16.30%	4.20

Legend:

$\mathcal{VS}$:0.0234 Verification Success; $\mathcal{VF}$: Verification Failed; $\mathcal{VU}$: Verification Unknown (Timeout).

Best performance in a category is highlighted with bold and/or Rank.

Even the best LLMs fail on more than half of the verification tasks

Why Formal Methods?

The White House Makes It Clear (Feb 2024):

“While formal methods have been studied for decades, their deployment remains limited; further innovation in approaches to make formal methods widely accessible is vital to accelerate broad adoption.”

Formal methods can:

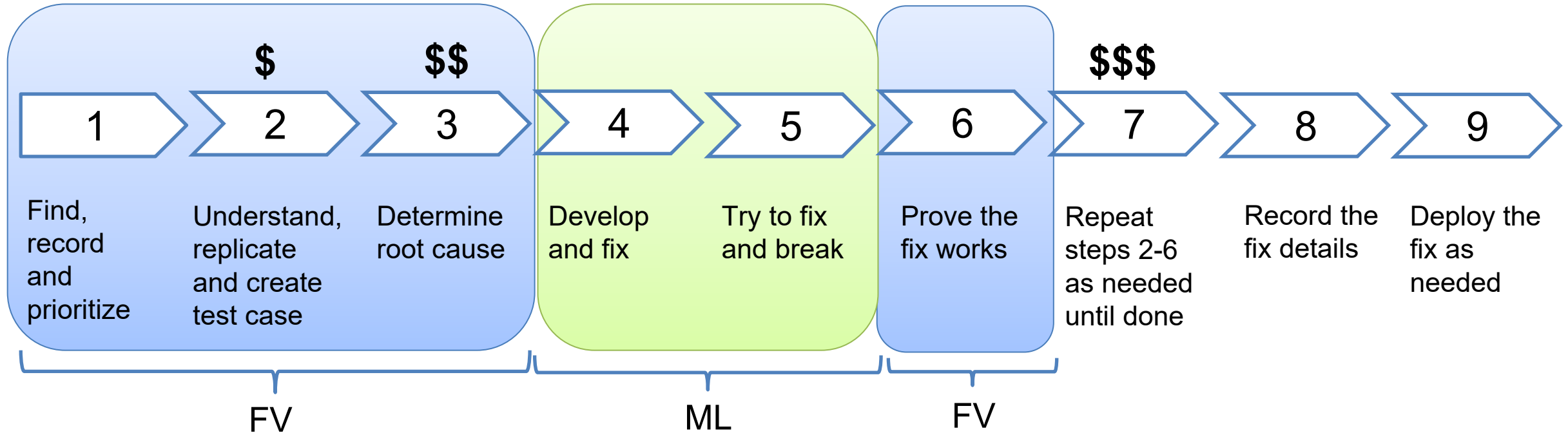
- ✓ Prove software correctness
- ✓ Guarantee safety/security properties
- ✓ Find bugs exhaustively

But they require:

- Expert knowledge
- Manual effort
- Specialized training

Could we combine Generative AI with Formal Verification?

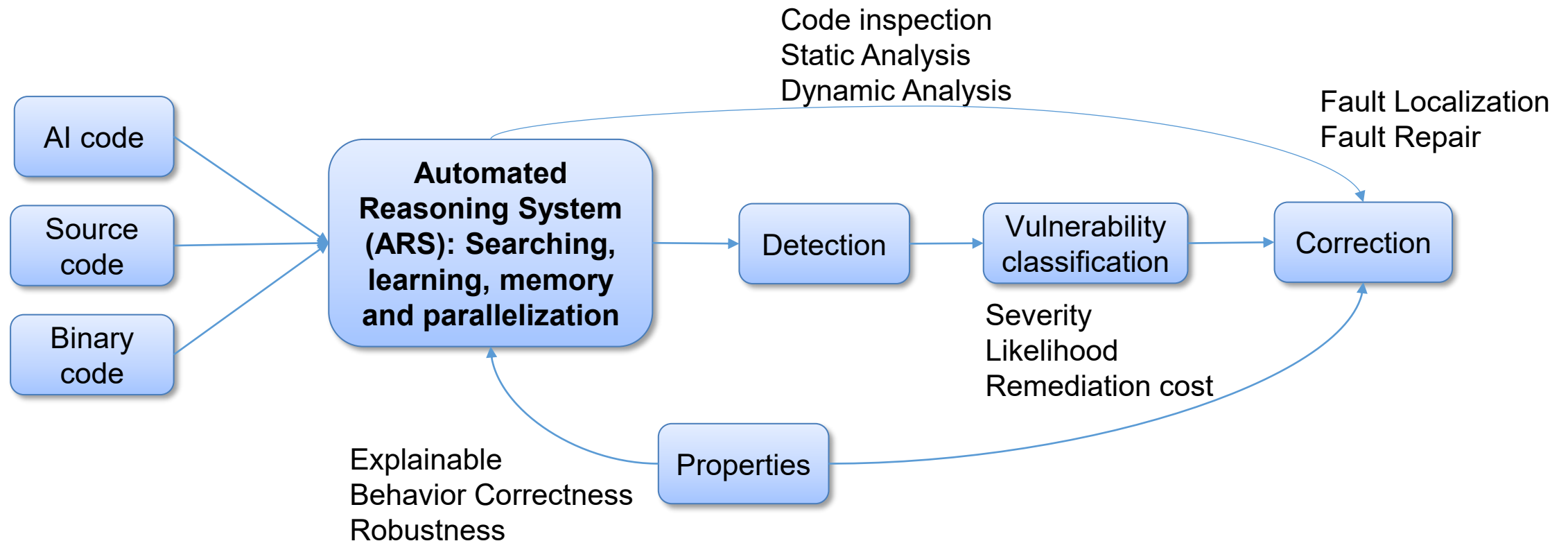
Find, Understand and Fix Bugs



“A significant percentage (50%+) of a software project’s cost today is not spent on the creativity activity of software construction but rather on the corrective activity of debugging and fixing errors”

Vision: Building Trustworthy Software and AI Systems

Develop an automated reasoning system for **safeguarding software and AI systems** against vulnerabilities



Objective of this talk

Discuss how **generative AI and formal methods** can work together to establish a foundation **for building trustworthy software and AI systems**

- Introduce a **logic-based automated reasoning platform** to **find and fix software defects**
- Explain how **testing, verification, LLMs** can be combined to build **trustworthy software and AI systems**
- Develop an **automated reasoning system** for **safeguarding software and AI systems** against vulnerabilities

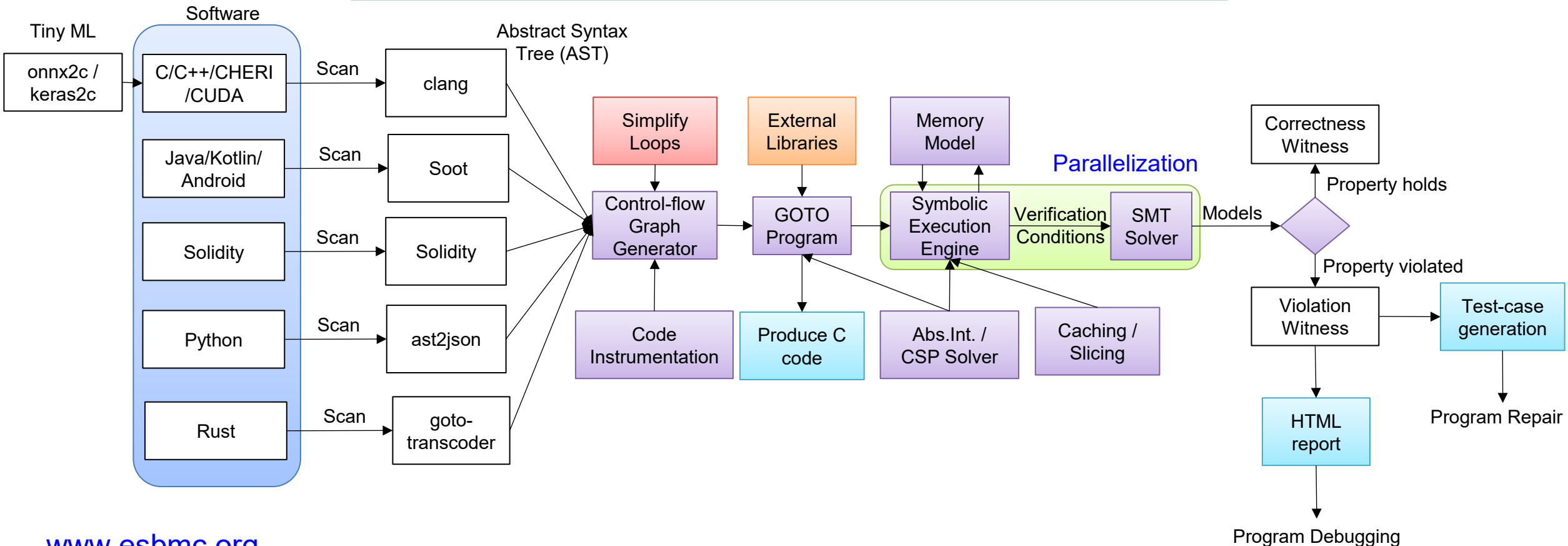
Research Questions

Given a **program** and a **specification**, can we automatically **verify** that the **program performs as specified**?

Can we leverage **LLMs** to **speed up program verification** and **find more software vulnerabilities** than SOTA?

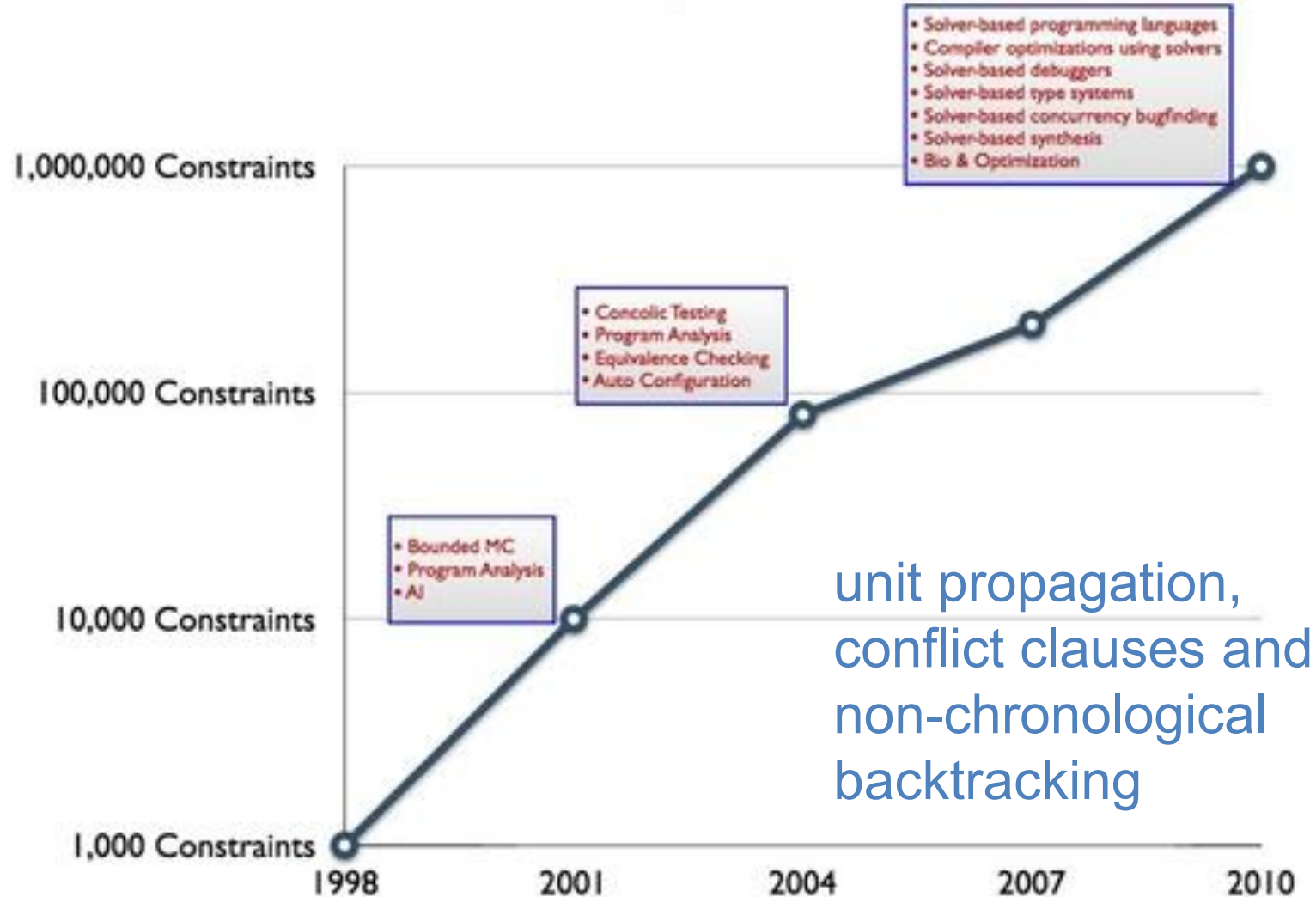
ESBMC: A Logic-based Verification Platform

Logic-based automated verification
for checking **safety** and **liveness**
properties in **AI** and **software systems**

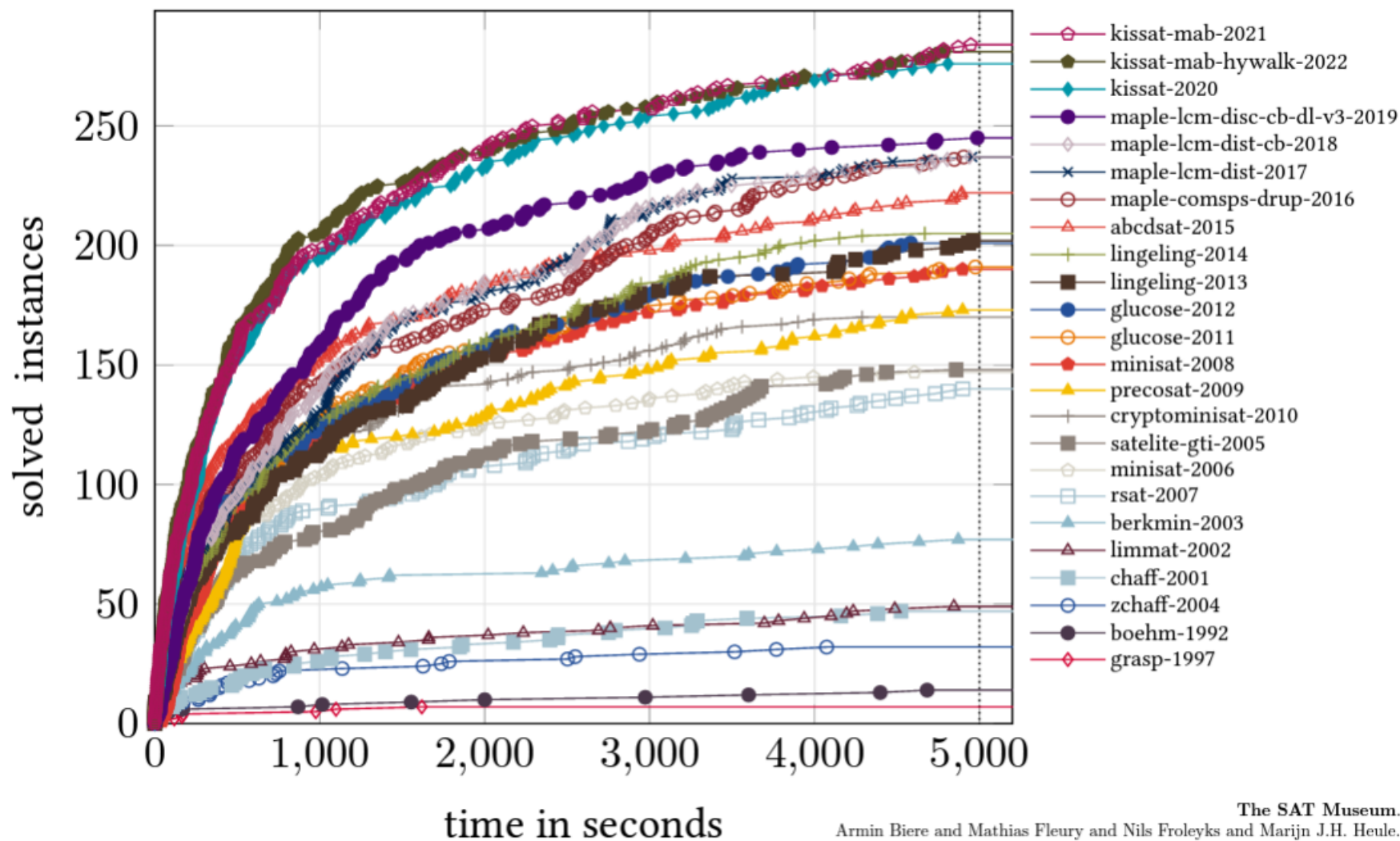


SAT solving as enabling technology

SAT/SMT Solver Research Story A 1000x Improvement



SAT Competition All Time Winners on SAT Competition 2022 Benchmarks

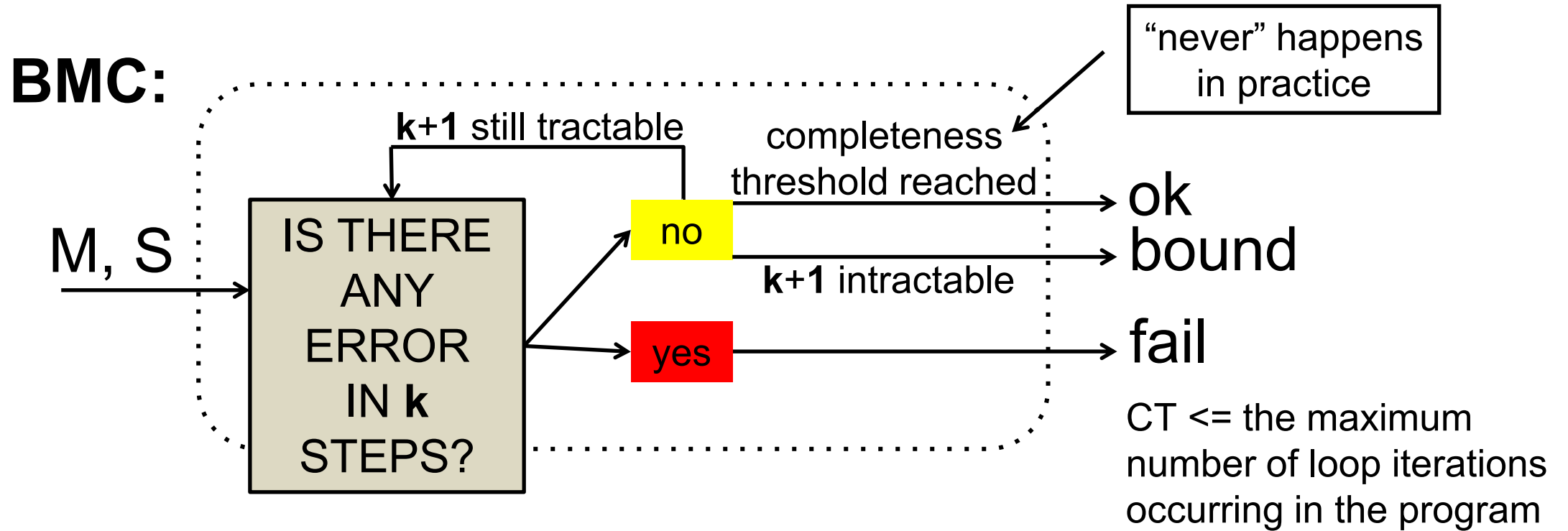


<https://cca.informatik.uni-freiburg.de/satmuseum>

The SAT Museum.
 Armin Biere and Mathias Fleury and Nils Froleys and Marijn J.H. Heule.
 In *Proceedings 14th International Workshop on Pragmatics of SAT (POS'23)*,
 vol. 3545, CEUR Workshop Proceedings, pages 72-87, CEUR-WS.org 2023.
 [paper - bibtex - data - zenodo - ceur - workshop - proceedings]

<https://cca.informatik.uni-freiburg.de/satmuseum/>

Bounded Model Checking (BMC)



Can the given property fail in k -steps?

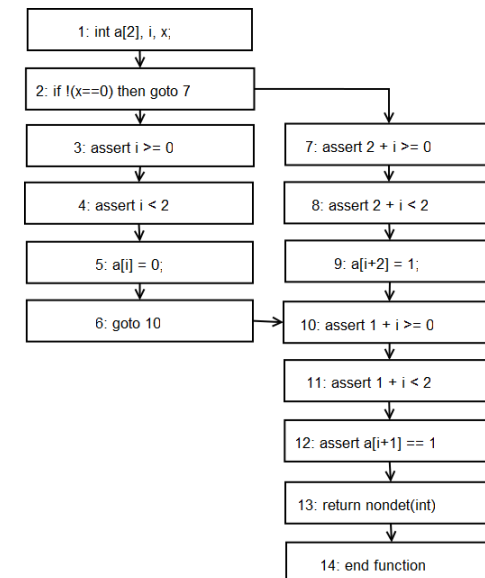
$$I(S_0) \wedge T(S_0, S_1) \wedge \dots \wedge T(S_{k-1}, S_k) \wedge (\neg P(S_0) \vee \dots \vee \neg P(S_k))$$

Initial state k-steps Property fails in some step

Software BMC

- program modeled as a state transition system

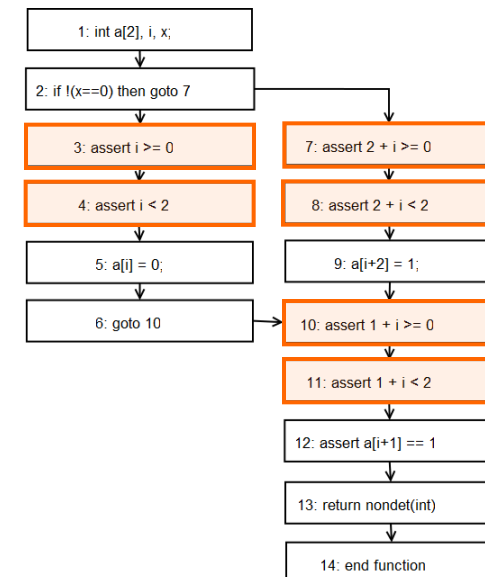
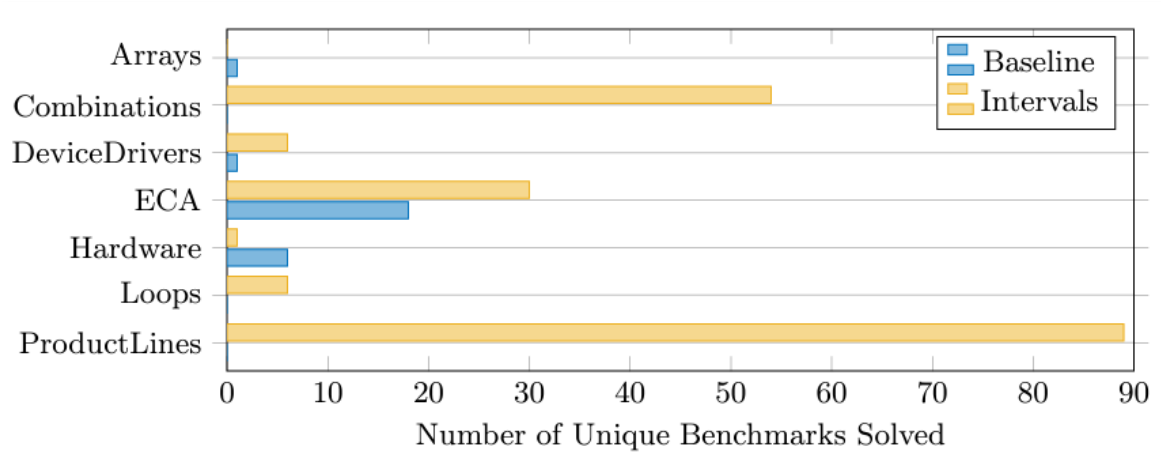
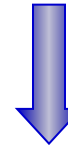
```
int main() {  
  int a[2], i, x;  
  if (x==0)  
    a[i]=0;  
  else  
    a[i+2]=1;  
  assert(a[i+1]==1);  
}
```



Software BMC

- program modeled as a state transition system
- added assumptions/safety properties as extra nodes

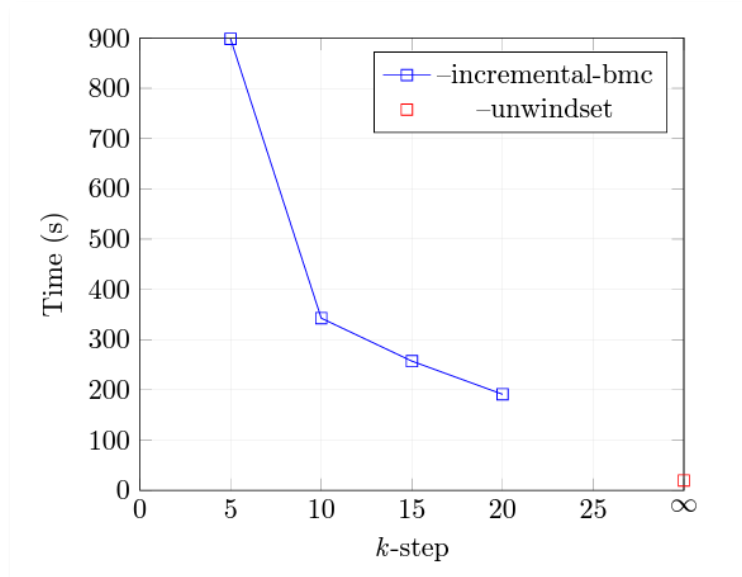
```
int main() {  
  int a[2], i, x;  
  if (x==0)  
    a[i]=0;  
  else  
    a[i+2]=1;  
  assert(a[i+1]==1);  
}
```



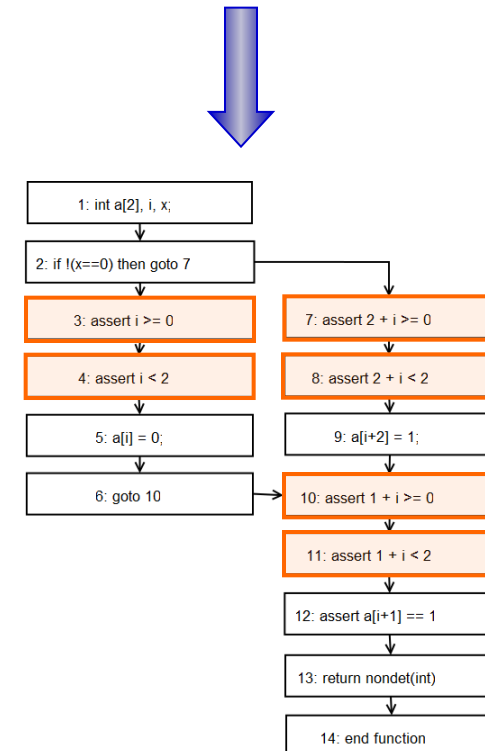
Software BMC

- program modeled as a state transition system
- added assumptions/safety properties as extra nodes
- program unfolded up to given bounds

```
int main() {  
    int a[2], i, x;  
    if (x==0)  
        a[i]=0;  
    else  
        a[i+2]=1;  
    assert(a[i+1]==1);  
}
```



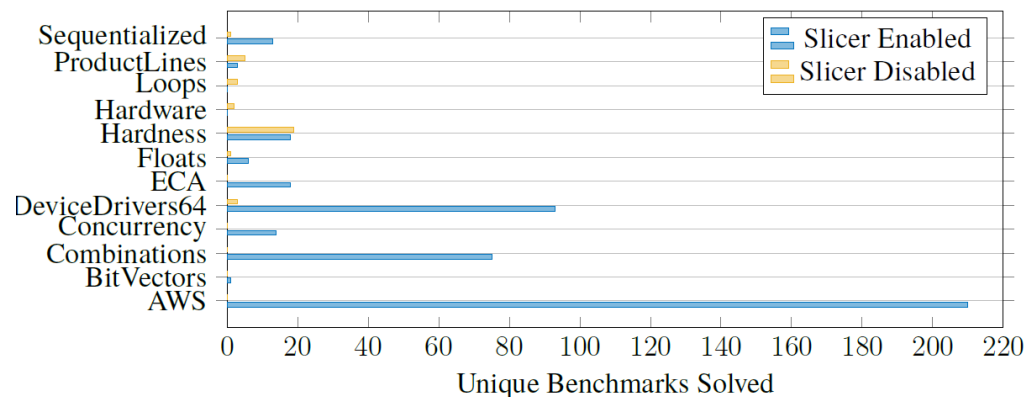
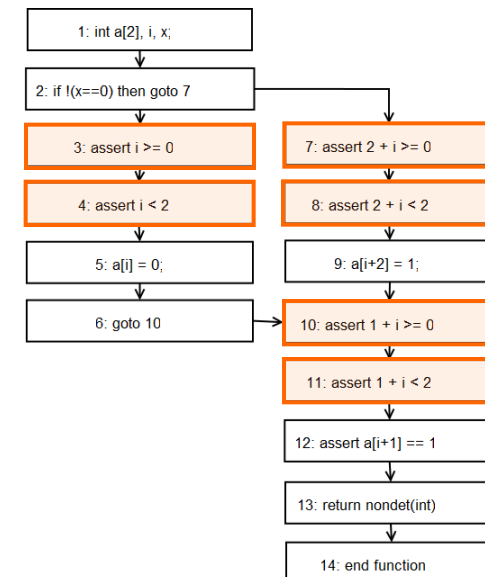
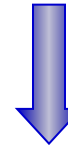
Wu T., Xiong, S., Manino, E., Stockwell, G., Cordeiro, L.:
Verifying components of Arm(R) Confidential Computing
Architecture with ESBMC. SAS 2024



Software BMC

- program modeled as a state transition system
- added assumptions/safety properties as extra nodes
- program unfolded up to given bounds
- unfolded program optimized to reduce blow-up
 - constant propagation/slicing
 - forward substitutions/caching
 - unreachable code/pointer analysis

```
int main() {  
    int a[2], i, x;  
    if (x==0)  
        a[i]=0;  
    else  
        a[i+2]=1;  
    assert(a[i+1]==1);  
}
```



Software BMC

- program modeled as a state transition system
- added assumptions/safety properties as extra nodes
- program unfolded up to given bounds
- unfolded program optimized to reduce blow-up
 - constant propagation/slicing
 - forward substitutions/caching
 - unreachable code/pointer analysis
- front-end converts unrolled and **optimized program into SSA**

} crucial

```
int main() {  
    int a[2], i, x;  
    if (x==0)  
        a[i]=0;  
    else  
        a[i+2]=1;  
    assert(a[i+1]==1);  
}
```



```
g1 = x1 == 0  
a1 = a0 WITH [i0:=0]  
a2 = a0  
a3 = a2 WITH [2+i0:=1]  
a4 = g1 ? a1 : a3  
t1 = a4[1+i0] == 1
```

Software BMC

- program modeled as a state transition system
 - added assumptions/safety properties as extra nodes
 - program unfolded up to given bounds
 - unfolded program optimized to reduce blow-up
 - constant propagation/slicing
 - forward substitutions/caching
 - unreachable code/pointer analysis
- } crucial
- front-end converts unrolled and **optimized program into SSA**
 - extraction of *constraints C* and *properties P*
 - specific to selected SMT solver, uses theories
 - satisfiability check of $C \wedge \neg P$

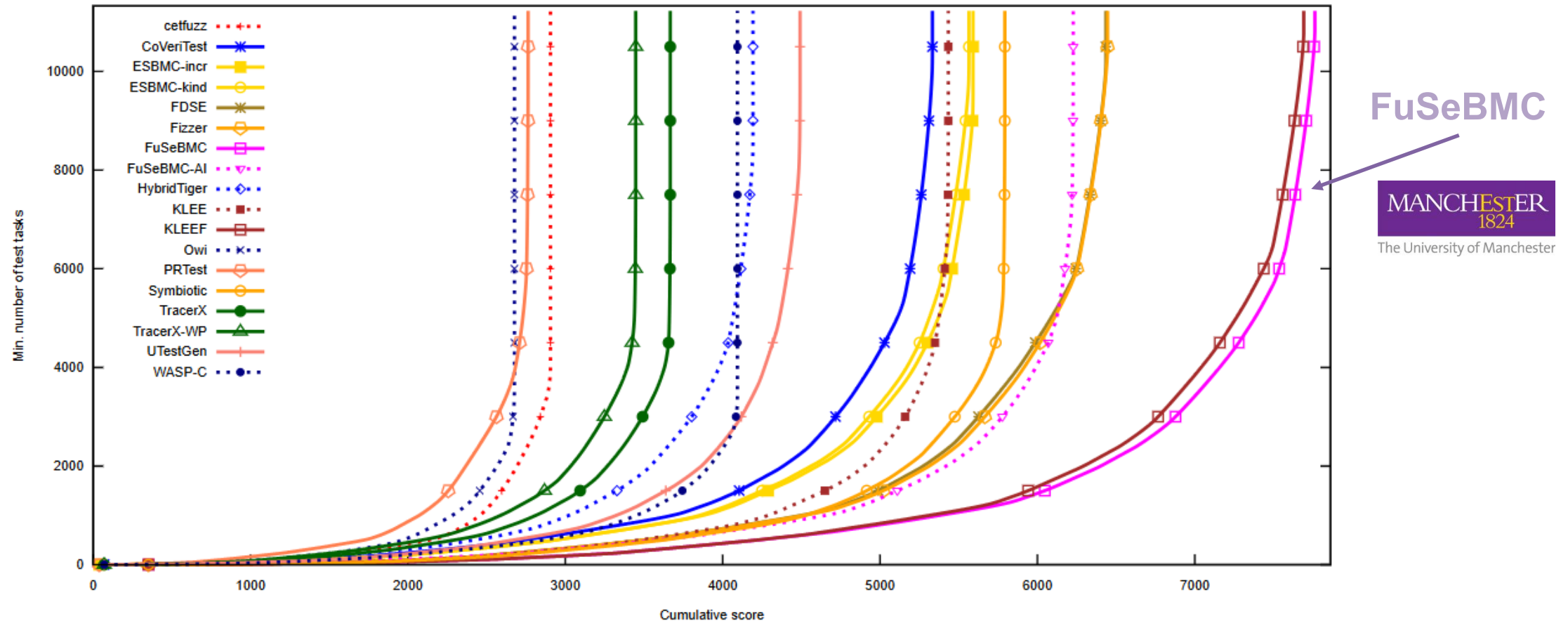
```
int main() {  
    int a[2], i, x;  
    if (x==0)  
        a[i]=0;  
    else  
        a[i+2]=1;  
    assert(a[i+1]==1);  
}
```


$$C := \left[\begin{array}{l} g_1 := (x_1 = 0) \\ \wedge a_1 := store(a_0, i_0, 0) \\ \wedge a_2 := a_0 \\ \wedge a_3 := store(a_2, 2 + i_0, 1) \\ \wedge a_4 := ite(g_1, a_1, a_3) \end{array} \right]$$
$$P := \left[\begin{array}{l} i_0 \geq 0 \wedge i_0 < 2 \\ \wedge 2 + i_0 \geq 0 \wedge 2 + i_0 < 2 \\ \wedge 1 + i_0 \geq 0 \wedge 1 + i_0 < 2 \\ \wedge select(a_4, i_0 + 1) = 1 \end{array} \right]$$

Most Influential Paper Award at ASE 2023

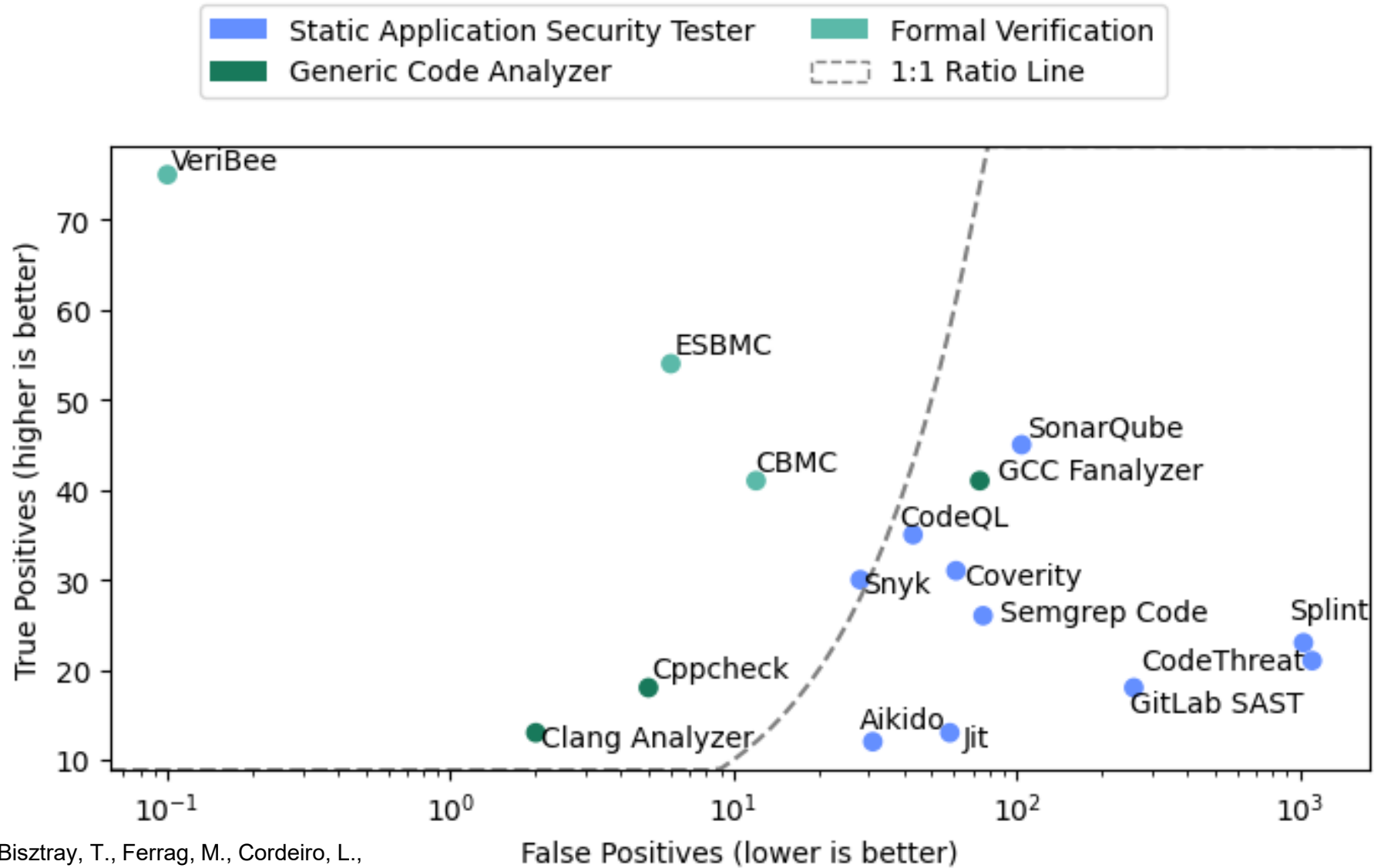


Competition on Software Testing 2025: Results of the Overall Category



FuSeBMC achieved 3 awards: 1st place in Cover-Error, 2nd place in Cover-Branched, and 1st place in Overall

Source Code Security



Research Questions

Given a **program** and a **specification**, can we automatically **verify** that the **program performs as specified**?

Can we leverage **LLMs** to **speed up program verification** and **find more software vulnerabilities** than SOTA?

Is this Program Correct?

```
def main() -> None:
    x: int = 0
    y: int = 50
    while x < 100:
        x = x + 1
        if x > 50:
            y = y + 1
    assert y == 100
```

```
def main() -> None:
    x: int = 0
    y: int = 50
    x = x + 1
    if x > 50:
        y = y + 1
    ... // 99 other loop unrollings
    assert y == 100
```



BMC can detect bugs,
but requires assistance
in proving correctness



Expensive

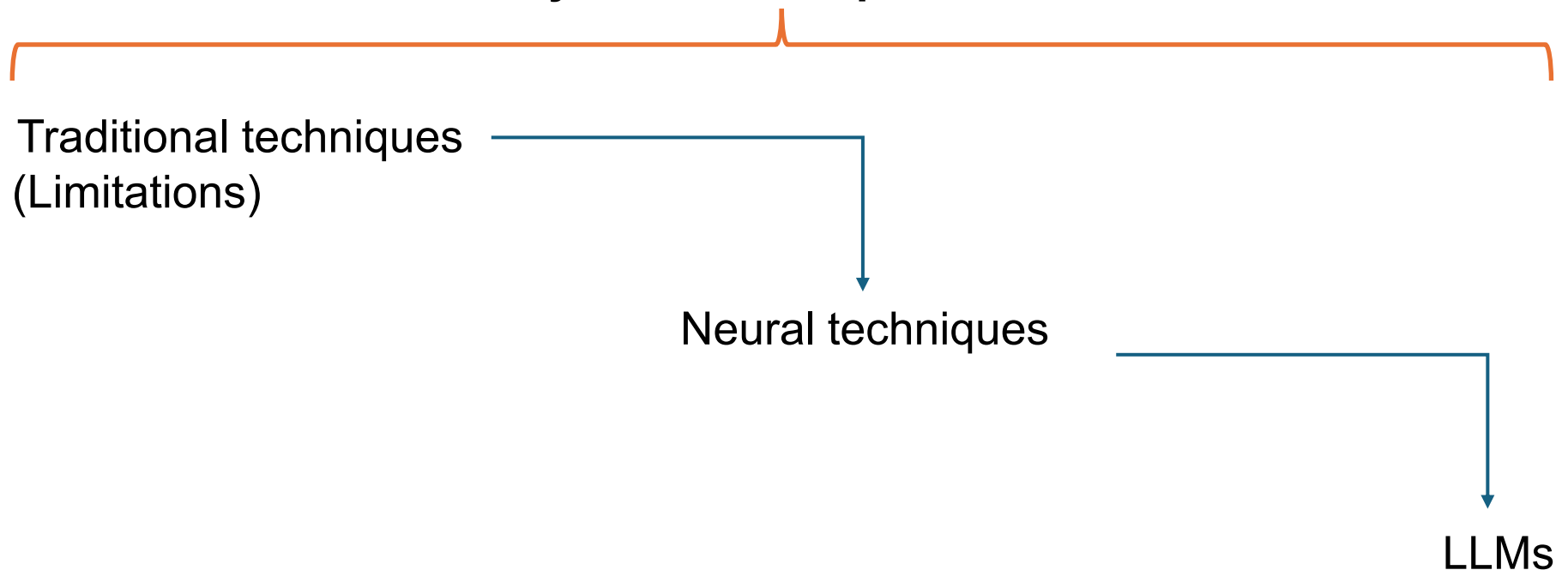


BMC struggles with
loops that can't be
statically bound or that
have a large bound

Loop Invariants

- **Inductive loop invariant:** A logical assertion that holds at a loop head whenever the program passes that location
- **Base Case:** The invariant holds before the first iteration of the loop
- **Step Case:** The invariant holds for every iteration of the loop

Synthesise Loop Invariants



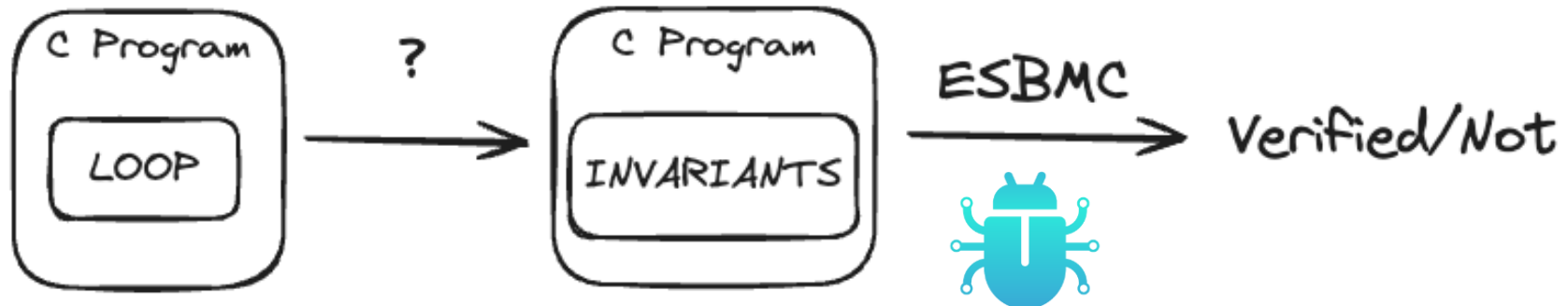
Replace Loop with Loop Invariants

```
while x < 100:  
    x += 1  
    if x > 50:  
        y += 1
```

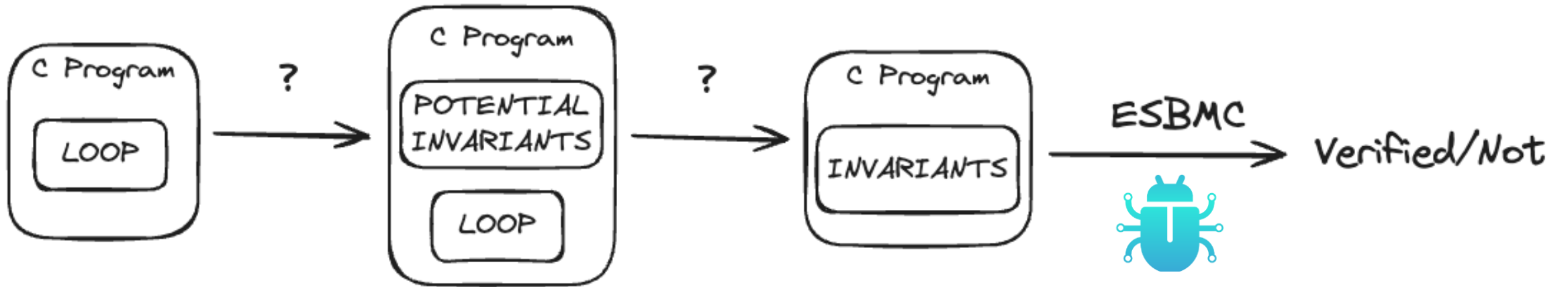
```
def main()  
    x: int = 0  
    y: int = 50  
    # The loop keeps x between 0 and 100  
    __ESBMC_assume(0 <= x && x <= 100)  
    # If x is 50 or less then y is 50  
    __ESBMC_assume(x <= 50 ==> y == 50)  
    # If x is greater than 50 then y = x  
    __ESBMC_assume(x > 50 ==> y == x)  
    # At the end of the loop x is not < 100  
    __ESBMC_assume(x >= 100)  
  
    assert(y == 100)
```



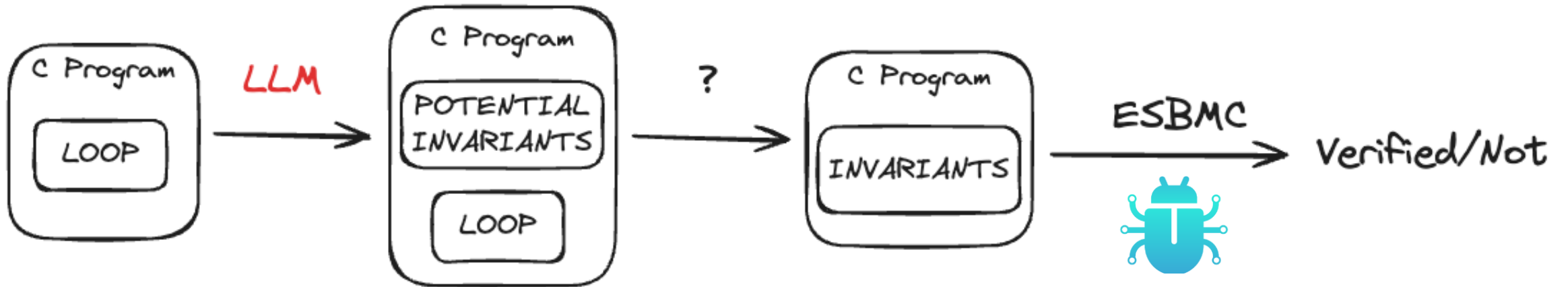
Replace Loop with Loop Invariants



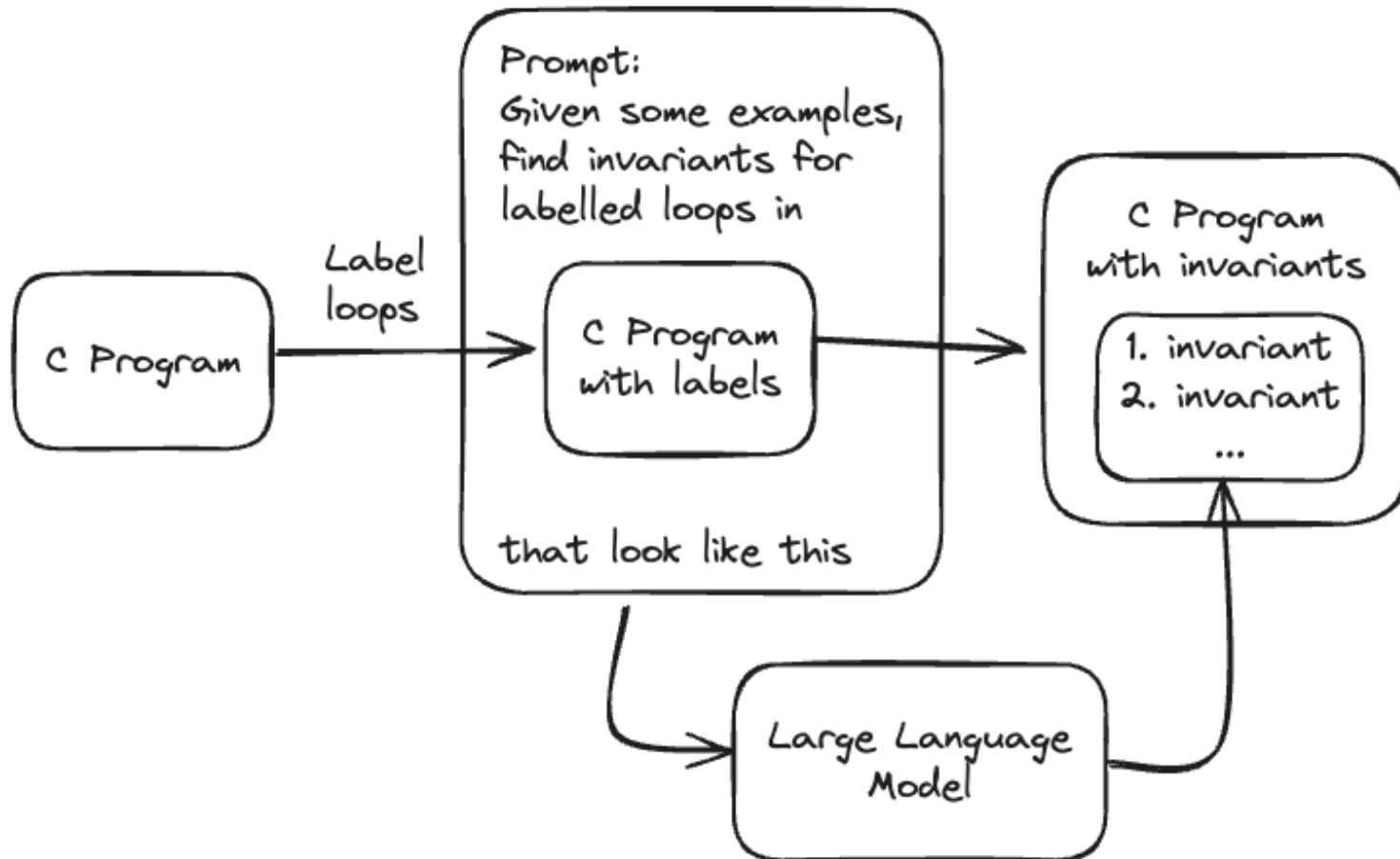
Replace Loop with Loop Invariants



Generating Potential Invariants



Generating Potential Invariants



Prompt Engineering for Invariant Generation

<Examples with explanation>

Based on these examples provided above can you generate a C invariant for the following code,

<Labelled Input C Program>

Print an invariant for this loop that holds in the form '`__invariant(...);`'. They should help prove the assertions. You can utilise '&&' or '||' if required. No explanation. Your answer should be in the form '`__invariant(...);`'

Chain of Thought (CoT) Prompt Engineering

Small number of different prompts that vary by their examples e.g. :

- Single Invariant
- Multiple Invariants

Full prompts (more explanation), constrained prompts (less explanation), and combined prompts

Prompt Engineering for Invariant Generation

```
int main()
{
    int x = 0;
    int y = 50;
    while (x < 100) {
        x = x + 1;
        if (x > 50) {
            y = y + 1;
        }
    }
    assert(y == 100);
}
```

Provide two loop invariants for the loop in the program that are strong enough to prove the assertion at the end of the program.

Answer:

Invariant 1: $0 \leq x \ \&\& \ x \leq 100$

This ensures that x is always within the expected range throughout the loop's execution.

Invariant 2: $x \leq 50 \ \&\& \ y == 50 \ || \ x > 50 \ \&\& \ y == x$

This captures the relationship between x and y :

If x is less than or equal to 50, y remains 50.

If x is greater than 50, y increments in tandem with x , effectively making y equal to x .

LLMs Can Get it Wrong!

```
__invariant(c > 1 && c < 2 ==> i == 0);
```

```
__invariant(...);
```

```
__invariant(
```

```
This is the invariant
```

```
__invariant(...); for  
the c program.
```

```
int x;
```

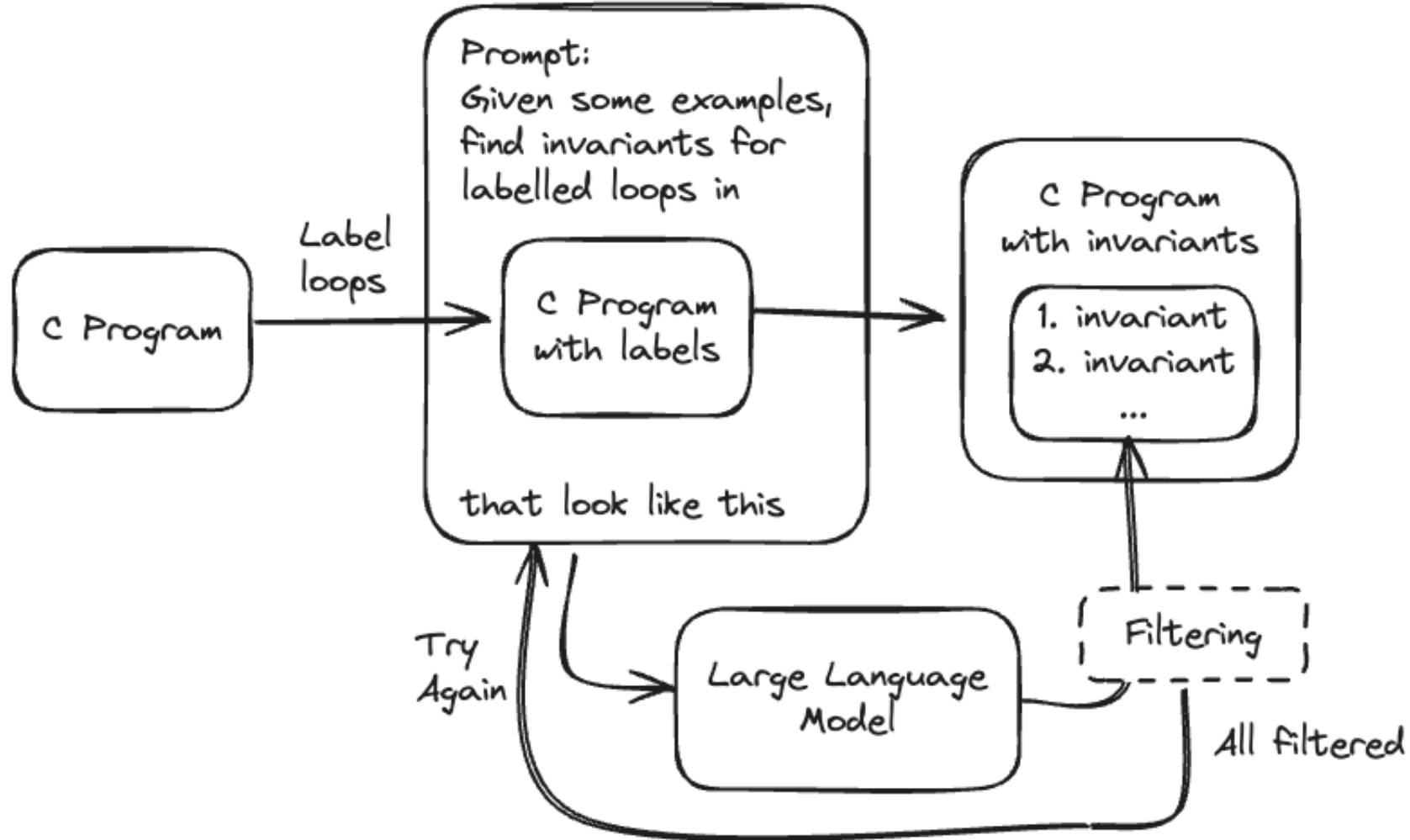
```
int y;
```

```
__invariant(x > max);
```

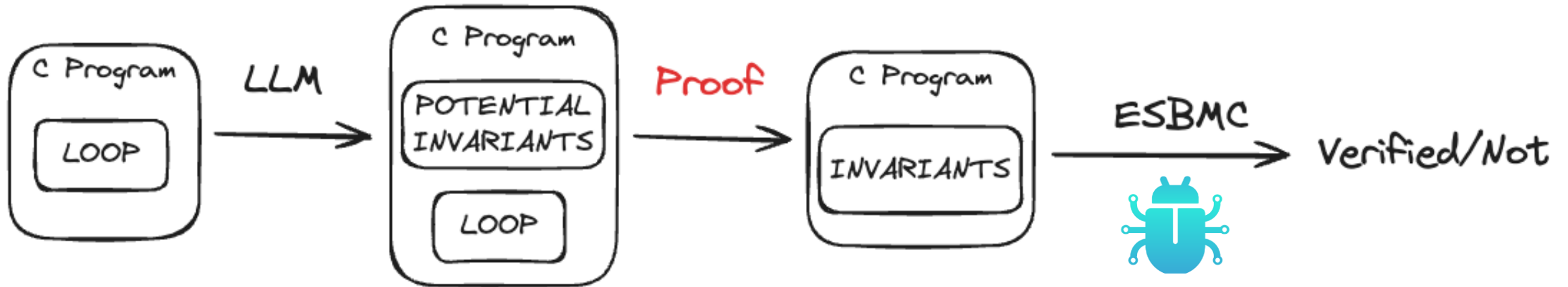
How to get better answers?

1. Constrain the prompt (no explanation as it can be confusing)
2. Filter the answers (simple regex filtering for now)

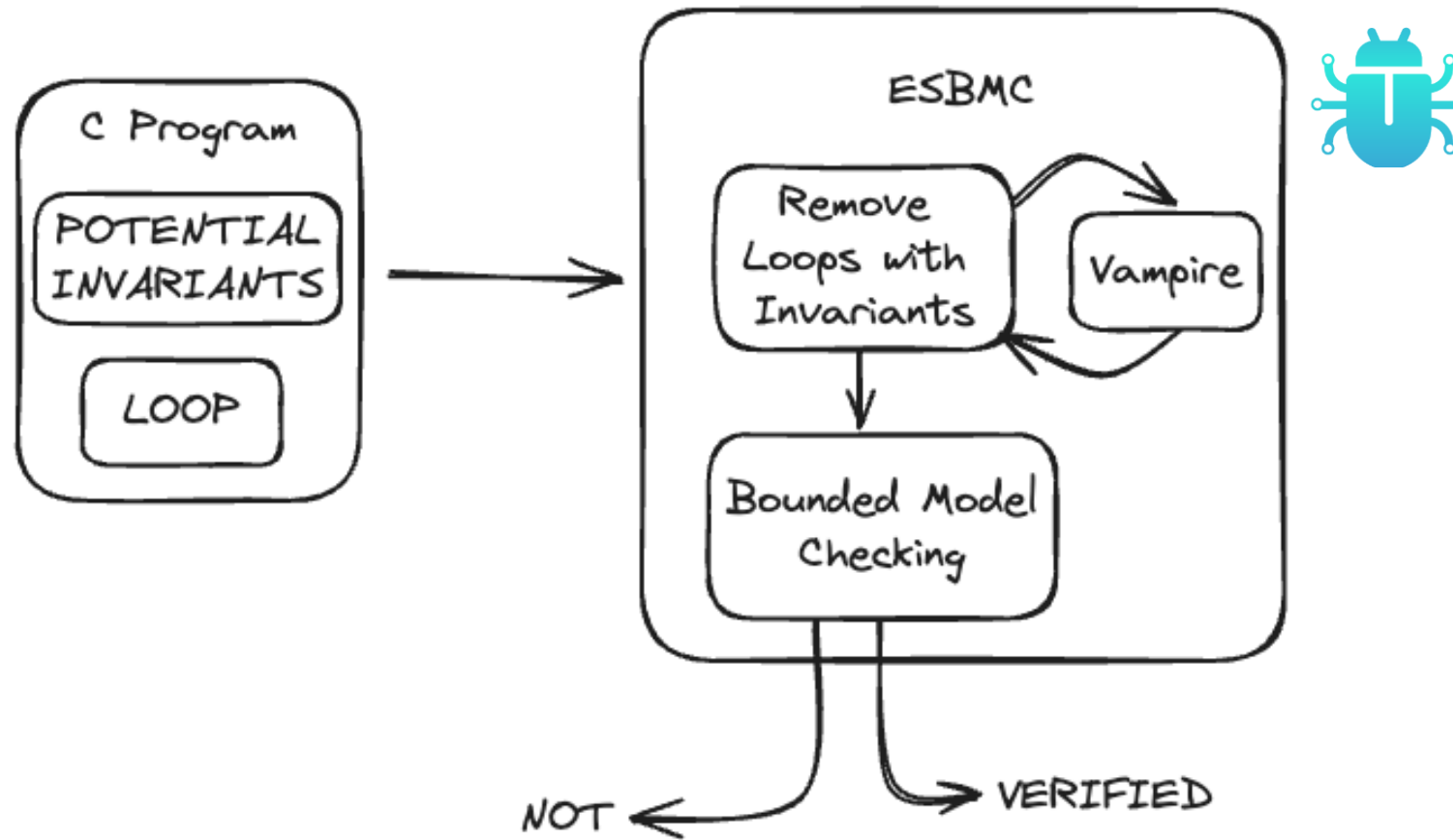
Generating Potential Invariants



Proving Potential Invariants



Proving Potential Invariants



Sound but not Complete

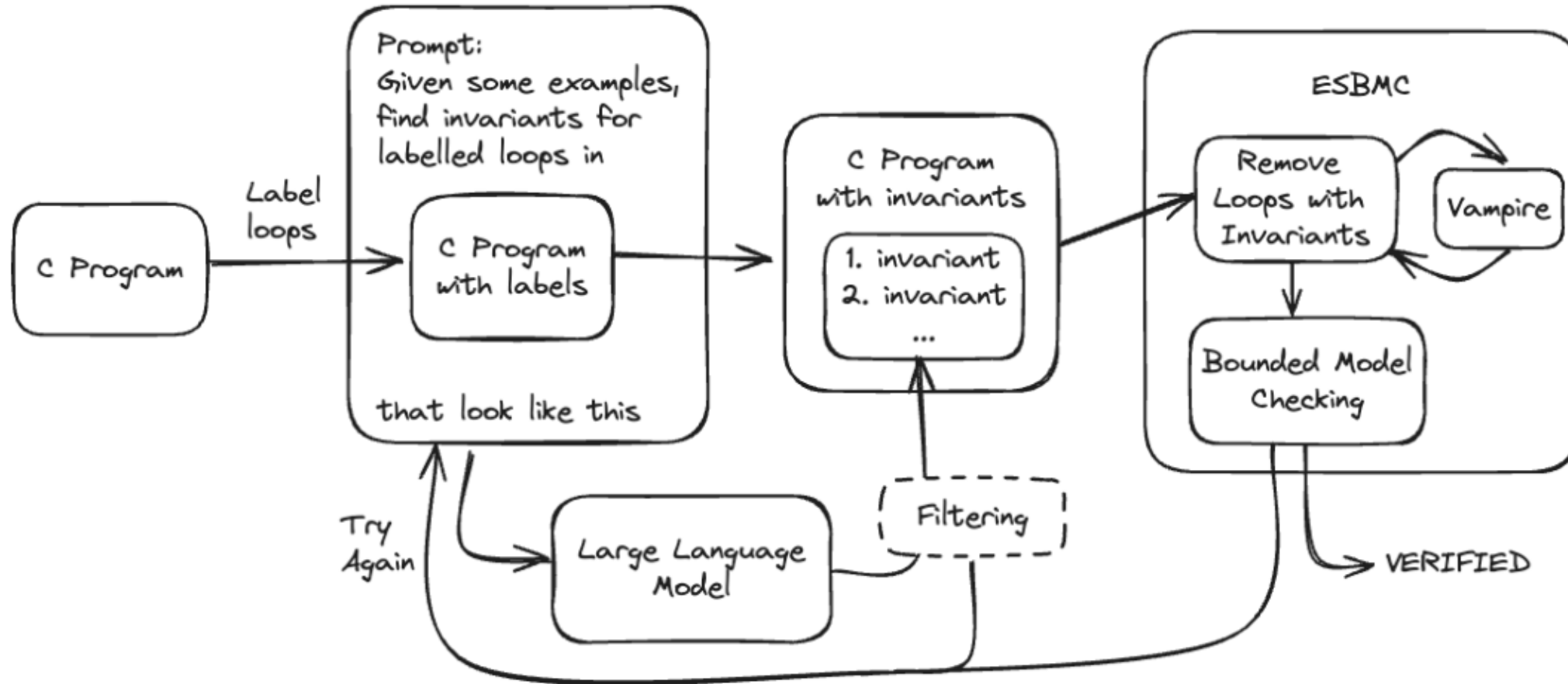
The approach is Sound:

Valid means that for any input, if the program terminates (we check partial correctness), then the assertions hold. No invalid assertions can be proven; there are no false positives

The approach is not Complete:

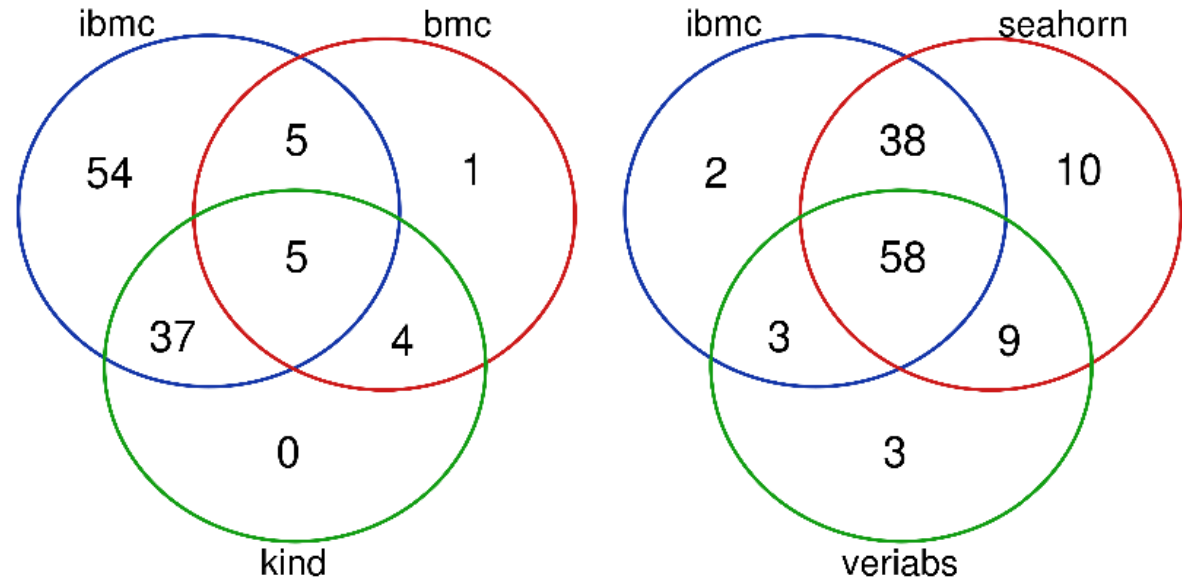
The LLM may never generate the invariants needed to prove a valid assertion, i.e., that sufficiently capture the semantics of the loop

The ESBMC ibmc Tool

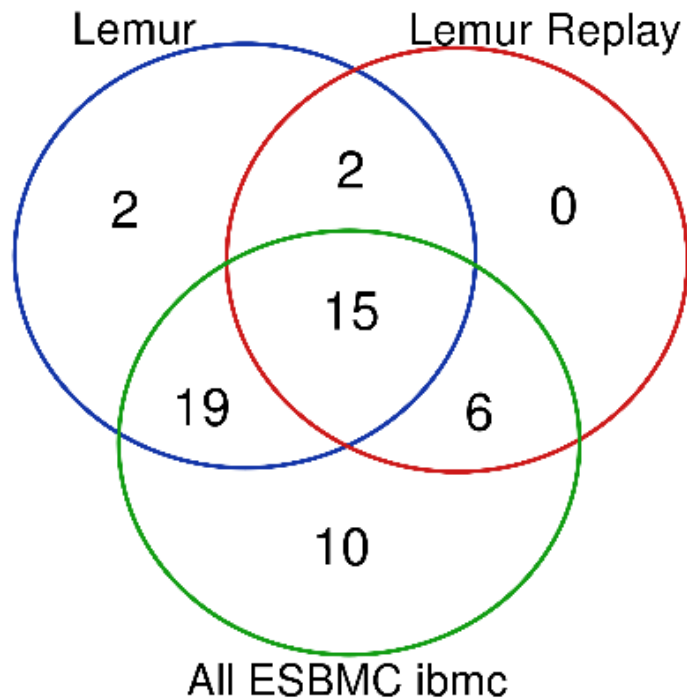


Comparing to Other Verifiers

Tool	Solved	Unique
ESBMC bmc	16	0
ESBMC k-induction	46	0
SeaHorn	115	10
VeriAbs	73	2
ESBMC ibmc	101	2



Comparison to LEMUR



LEMUR is similar as it also uses an LLM to suggest invariants.

We could not run LEMUR so replayed their invariants using our extended ESBMC

Using their invariants we verified **6 more programs**

Using our invariants we verified **10 more programs**

Potential lessons from both sides



IEEE



IEEE
COMPUTER
SOCIETY

tcse

Distinguished Paper Award

ASE 2024

IEEE/ACM International Conference on Automated Software Engineering

October 27 - November 1

Sacramento, California

Presented to

Muhammad A. A. Pirzada, Giles Reger, Ahmed Bhayat, Lucas C. Cordeiro

for

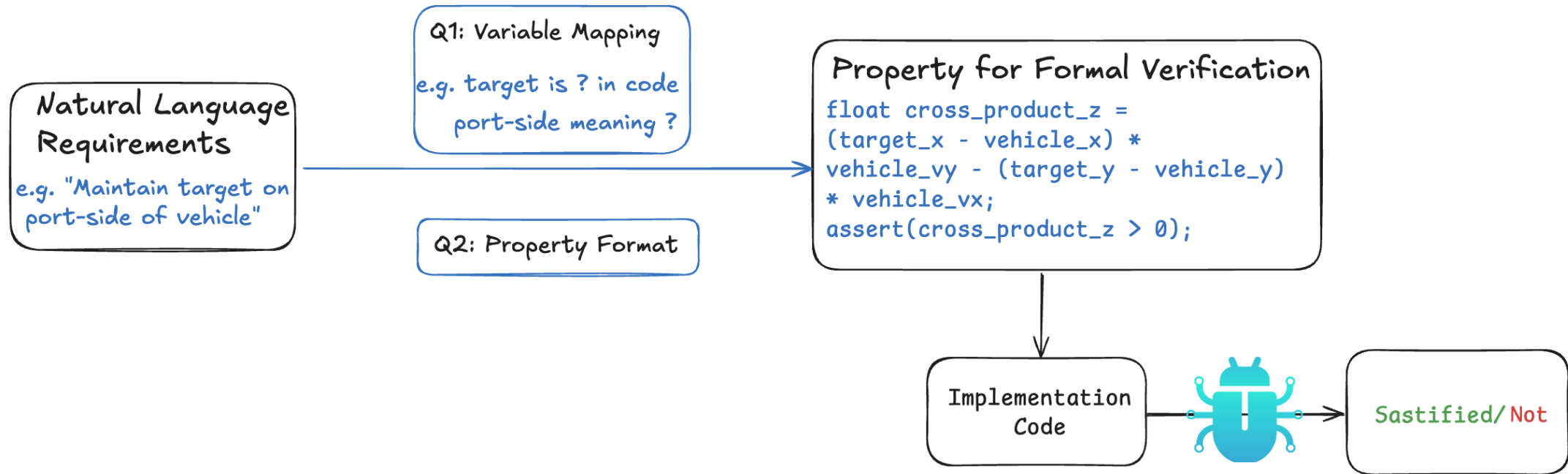
**LLM-Generated Invariants for Bounded Model
Checking Without Loop Unrolling**

Vladimir Filkov
General Chair

Baishakhi Ray
Research PC Co-Chair

Minghui Zhou
Research PC Co-Chair

Future Work: making rigorous verification as easy and fast as AI-assisted development

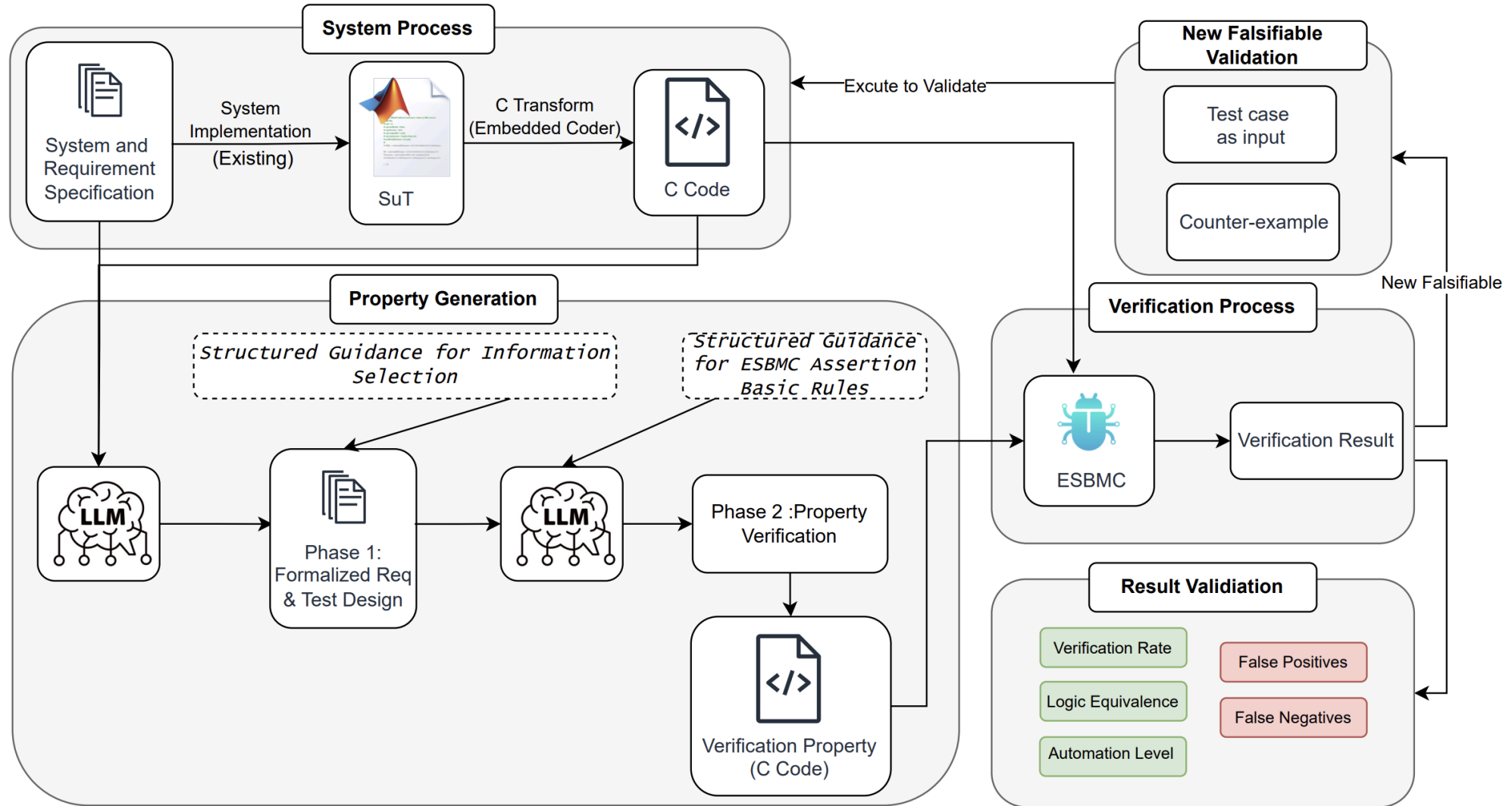


BMC can verify functional correctness, but requires an expert to write the property



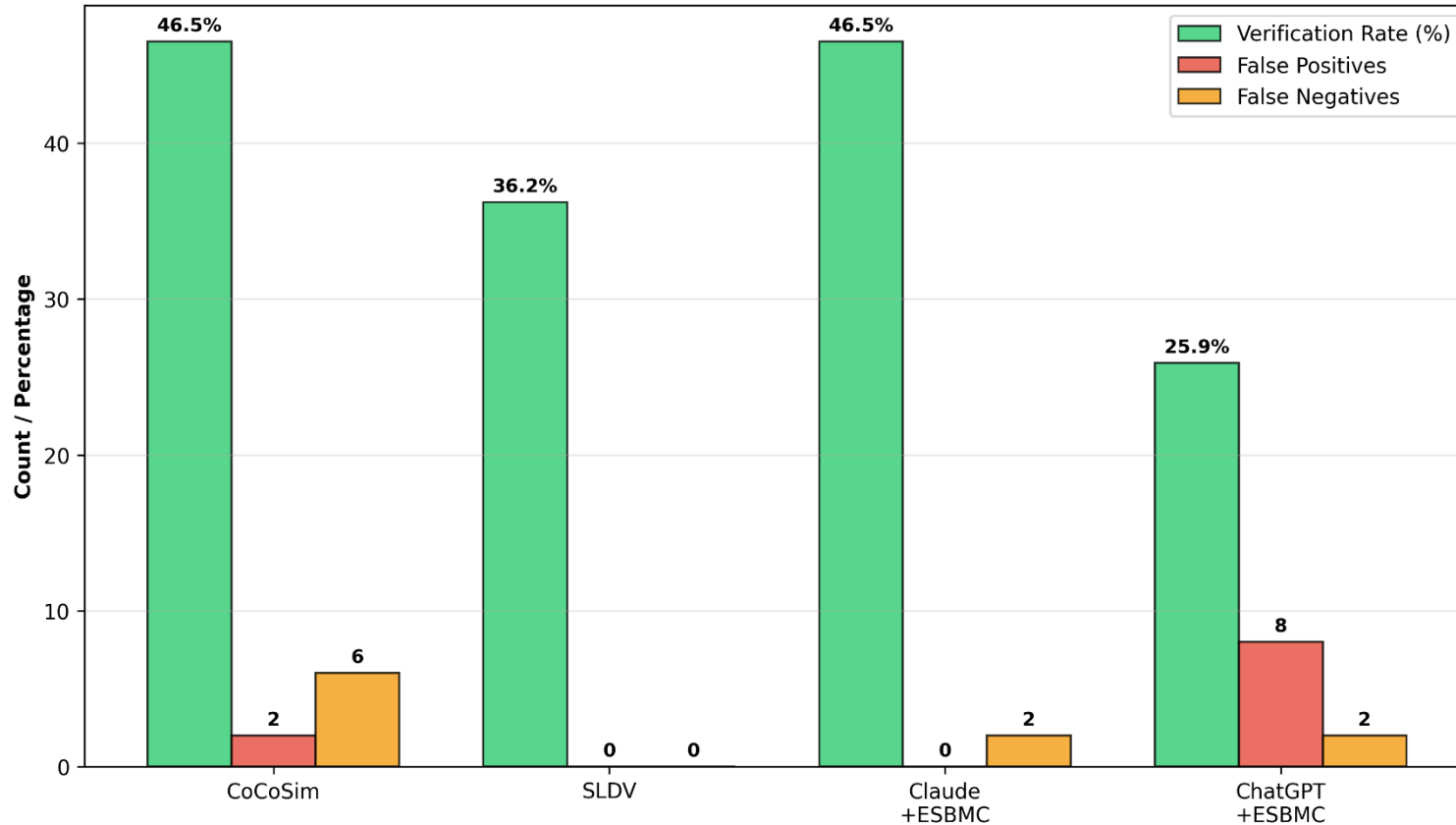
Variable and logic mapping are time-consuming for property generation

SpecVerify: LLM-Aided Requirements



Comparing with Human-Expert Verification Result

SpecVerify Performance Comparison



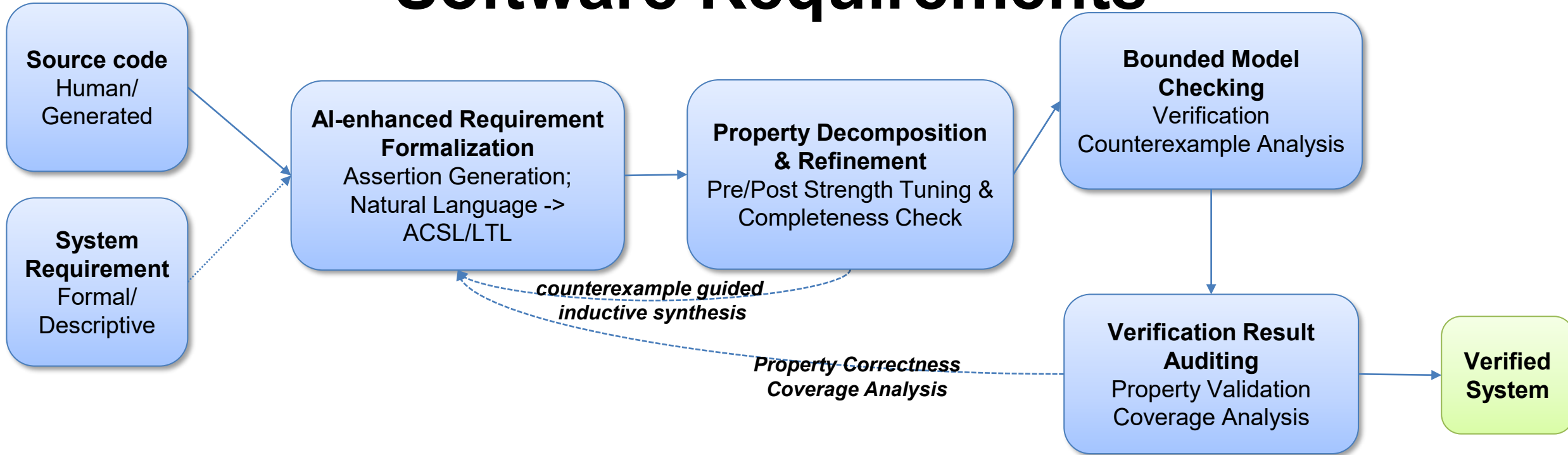
Key Achievements:

- 79.31% logical equivalence with expert-verified properties
- **28% better** than SLDV
- 46.5% verification rate (matches CoCoSim baseline)
- **Superior accuracy**: 2 false negatives, 0 false positives

Key Advantage:

- **Full automation** - no manual variable mapping
- Found 2 new floating-point errors
- Direct implementation-level verification

Roadmap: Automatically Formal Verification of Software Requirements



1

Formalization
Completed

Automated requirements formalization (SpecVerify)

2

Decomposition
In Progress

System-level property decomposition with refinement

3

Auditing
Planned

Verification result auditing and quality assurance

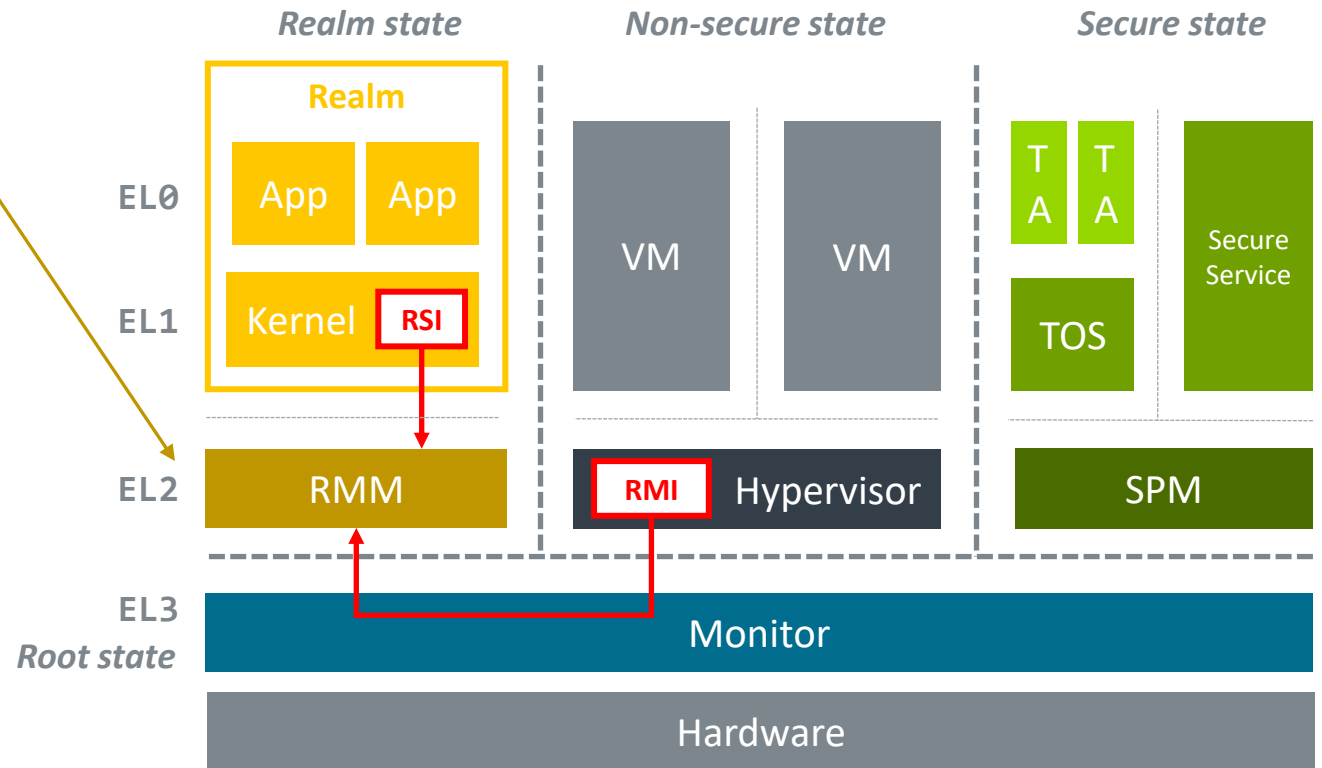
Acknowledgements



Verifying Components of Arm® Confidential Computing Architecture with ESBMC

Realm Management Monitor (RMM)

- + Provides services to Host and Realm
 - Contains no policy
 - Performs no dynamic memory allocation
- + Realm Management Interface (RMI)
 - Secure Monitor Call Calling Convention (SMCCC) interface called by Host
 - Create/destroy Realms
 - Manage Realm memory, manipulating stage 2 translation tables
- + Realm Services Interface (RSI)
 - SMCCC interface called by Realm
 - Measurement and attestation
 - Handshakes involved in some memory management flows



Arm CCA is an architecture that provides Protected Execution Environments called Realms

Verifying Components of Arm® Confidential Computing Architecture with ESBMC

Test_benchmarks	esbmc multi	cbmc multi
RMI_REC_DESTROY	20	20
RMI_GRANULE_DELEGATE	safe	safe
RMI_GRANULE_UNDELEGATE	1	1
RMI_REALM_ACTIVATE	3	safe
RMI_REALM_DESTROY	15	1
RMI_REC_AUX_COUNT	1	1
RMI_FEATURES	safe	safe
RMI_DATA_DESTROY	>=24	22

```
#include <assert.h>
extern int nondet_int();
int main() {
    int m = nondet_int();
    int *n = &m;
    if((unsigned long)n >= (unsigned long)(-4095))
        assert((unsigned int)(-1 * (long)n) < 6);
    int a = -2048;
    if((unsigned long)a >= (unsigned long)(-4095))
        assert((unsigned int)(-1 * (long)a) < 6);
}
```



tautschnig commented on Jan 16

Collaborator ...

In C, pointer-to-integer conversion is implementation-defined behaviour. That should give CBMC the freedom to choose an implementation where the condition `(unsigned long)n >= (unsigned long)(-4095)` never evaluates to true.

It is, however, also right to argue that CBMC should seek to model all possible implementations. The pointer-to-integer conversion in CBMC does not currently fulfil this expectation, but we will hopefully fix this in future.



<https://github.com/diffblue/cbmc/issues/8161>

Intel Core Power Management Firmware

Intel routinely employs ESBMC to **automate firmware analysis**

ESBMC has been applied to the **Authenticated Code Module**, where it found **over 30 vulnerabilities**

ESBMC is part of the CI pipeline for developing microcode for the Core family of processors

P6 Microcode Can Be Patched

Intel Discloses Details of Download Mechanism for Fixing CPU Bugs

“Taking an unusual approach to fixing bugs, Intel has implemented a microcode patch capability in its P6 processors, including Pentium Pro and Pentium II. This capability allows the microcode to be altered after the processor is fabricated, repairing bugs that are found after the processor is designed. Intel has already used this feature several times to correct minor bugs, and in the future, it may save the company from recalling CPUs if a major problem is discovered.”

WolfMQTT Verification

- **wolfMQTT** library is a client implementation of the MQTT protocol written in C for **IoT devices**

subscribe_task
and waitMessage_task are
called through different threads
accessing packet_ret,
causing a data race in
MqttClient_WaitType

Here is where the
data race might
happen! Unprotected
pointer

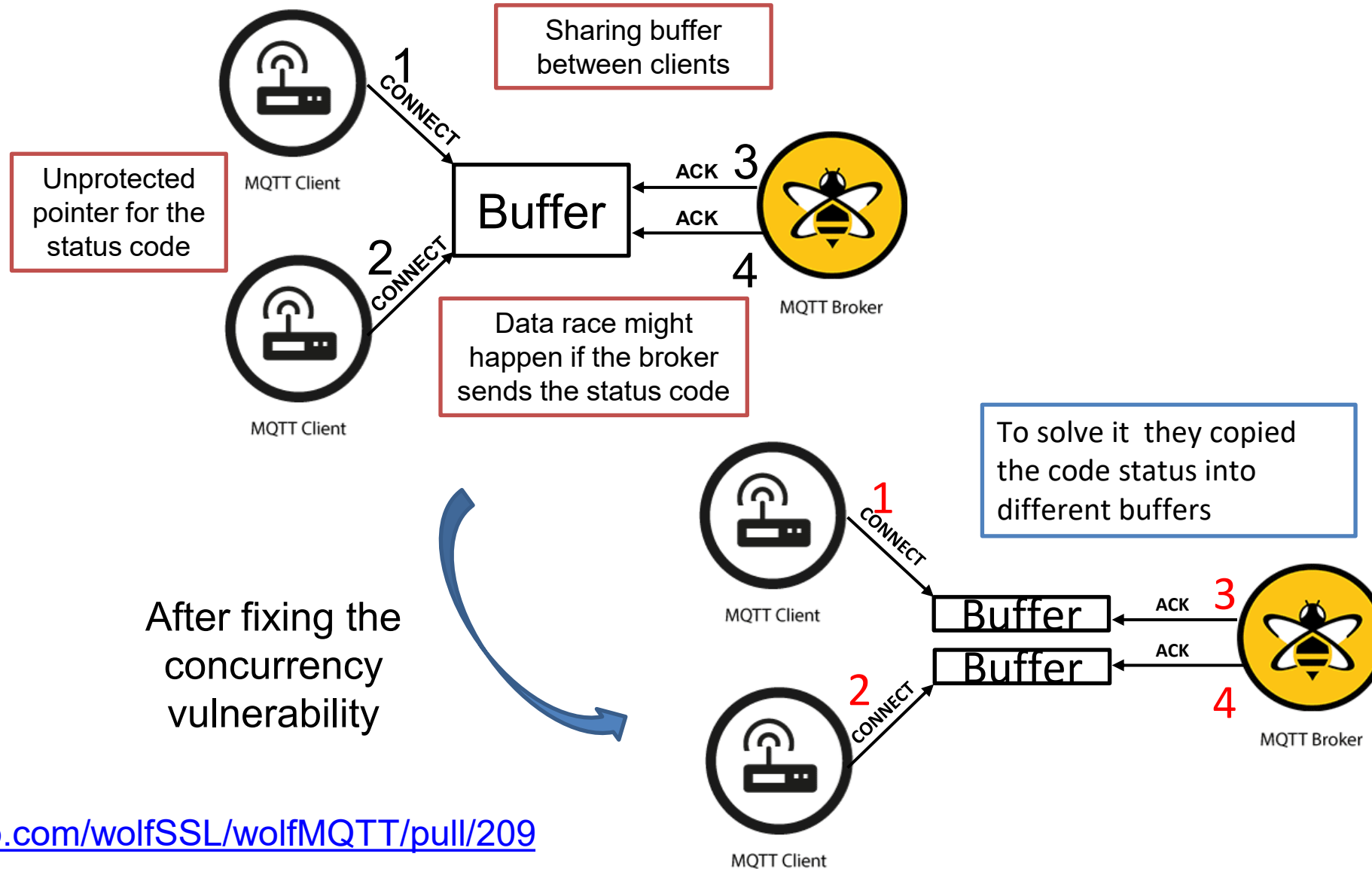
```
Int main(){
Pthread_t th1, th2;
static MQTTCtx mqttCtx;
pthread_create(&th1, subscribe_task, &mqttCtx))
pthread_create(&th2, waitMessage_task, &mqttCtx))}

static void *subscribe_task(void *client){
.....
MqttClient_WaitType(client,msg,MQTT_PACKET_TYPE_ANY,
0,timeout_ms);
.....}

static void *waitMessage_task(void *client){
...
MqttClient_WaitType(client, msg, MQTT_PACKET_TYPE_ANY,
0,timeout_ms);
.....}

static int MqttClient_WaitType(MqttClient *client,
void *packet_obj,
byte wait_type, word16 wait_packet_id, int timeout_ms)
{
.....
rc = wm_SemLock(&client->lockClient);
if (rc == 0) {
if (MqttClient_RespList_Find(client,
(MqttPacketType)wait_type,
wait_packet_id, &pendResp)) {
if (pendResp->packetDone) {
rc = pendResp->packet_ret;
.....}
.....}
.....}
```

WolfMQTT Verification



Ethereum Consensus Specifications

- Consensus protocol dictates how the participants in Ethereum agree on the validity of transactions and the system's state
- Git repository with **Markdown** documents describing specifications
- Infrastructure to generate **Python** libraries from Markdown

Ethereum Proof-of-Stake Consensus Specifications

chat on discord

To learn more about proof-of-stake and sharding, see the [PoS documentation](#), [sharding documentation](#) and the [research compendium](#).

This repository hosts the current Ethereum proof-of-stake specifications. Discussions about design rationale and proposed changes can be brought up and discussed as issues. Solidified, agreed-upon changes to the spec can be made through pull requests.

Watch 247 Fork 862 Star 3.4k

Contributors 148



+ 134 contributors

ESBMC-Python Benchmark

Ethereum Consensus Specification

Markdown

```
consensus-specs / specs / phase0 / beacon-chain.md
Preview Code Blame 1939 Lines (1617 loc) · 71.4 KB

Math

integer_squareroot

def integer_squareroot(n: uint64) -> uint64:
    """
    Return the largest integer ``x`` such that ``x**2 <= n``.
    """
    x = n
    y = (x + 1) // 2
    while y < x:
        x = y
        y = (x + n // x) // 2
    return x

xor

def xor(bytes_1: Bytes32, bytes_2: Bytes32) -> Bytes32:
    """
    Return the exclusive-or of two 32-byte strings.
    """
    return Bytes32(a ^ b for a, b in zip(bytes_1, bytes_2))
```

eth2spec Python Library

```
mainnet.py x
lib > python3.10 > site-packages > eth2spec-1.4.0b4-py3.10.egg > eth2spec > bellatrix > mainnet.py > integer_squareroot
1461
1462
1463 def integer_squareroot(n: uint64) -> uint64:
1464     """
1465     Return the largest integer ``x`` such that ``x**2 <= n``.
1466     """
1467     x = n
1468     y = (x + 1) // 2
1469     while y < x:
1470         x = y
1471         y = (x + n // x) // 2
1472     return x
1473
1474
1475 def xor(bytes_1: Bytes32, bytes_2: Bytes32) -> Bytes32:
1476     """
1477     Return the exclusive-or of two 32-byte strings.
1478     """
1479     return Bytes32(a ^ b for a, b in zip(bytes_1, bytes_2))
1480
1481
1482 def bytes_to_uint64(data: bytes) -> uint64:
1483     """
1484     Return the integer deserialization of ``data`` interpreted as ``ENDIANNESS``-endian.
1485     """
1486     return uint64(int.from_bytes(data, ENDIANNESS))
```

Python Application

```
integer_squareroot.py x
eth2bmc > samples > helpers > math > integer_squareroot.py > ...
1 from eth2spec.bellatrix import mainnet as spec
2 from eth2spec.utils.ssz.ssz_typing import (uint64)
3
4 x = uint64(16)
5 assert spec.integer_squareroot(x) == 4
6
7 x = uint64(25)
8 assert spec.integer_squareroot(x) == 5
```

ESBMC

Verification Output

Handle `integer_squareroot` bound case #3600

Merged

hwwhww merged 3 commits into `dev` from `integer_squareroot` 2 weeks ago



Conversation 4



Commits 3



Checks 15



Files changed 5



hwwhww commented 2 weeks ago • edited

Contributor



Credits to the University of Manchester Bounded Model Checking (BMC) project team: Bruno Farias, Youcheng Sun, and Lucas C. Cordeiro for reporting this issue! 🙌 100

This team is an [Ethereum Foundation ESP](#) "Bounded Model Checking for Verifying and Testing Ethereum Consensus Specifications (FY22-0751)" project grantee. They used [ESBMC model checker](#) to find this issue.

Description

`integer_squareroot` raises `ValueError` exception when `n` is maxint of `uint64`, i.e., `2**64 - 1`.

However, we only use `integer_squareroot` in

1. `integer_squareroot(total_balance)`
2. `integer_squareroot(SLOTS_PER_EPOCH)`

With the current Ether total supply + EIP-1559, it's unlikely to hit the overflow bound in a very long time. (🍷 🗣️)

That said, it should be fixed to return the expected value.

<https://github.com/ethereum/consensus-specs/pull/3600>