

# Automatic Verification of RMA Programs via Abstraction Extrapolation

Cedric Baumann<sup>1</sup>, [Andrei Marian Dan](#)<sup>1</sup>, Yuri Meshman<sup>2</sup>,  
Torsten Hoefler<sup>1</sup>, Martin Vechev<sup>1</sup>

<sup>1</sup> Department of Computer Science, ETH Zurich, Switzerland

<sup>2</sup> IMDEA Software Institute, Madrid, Spain

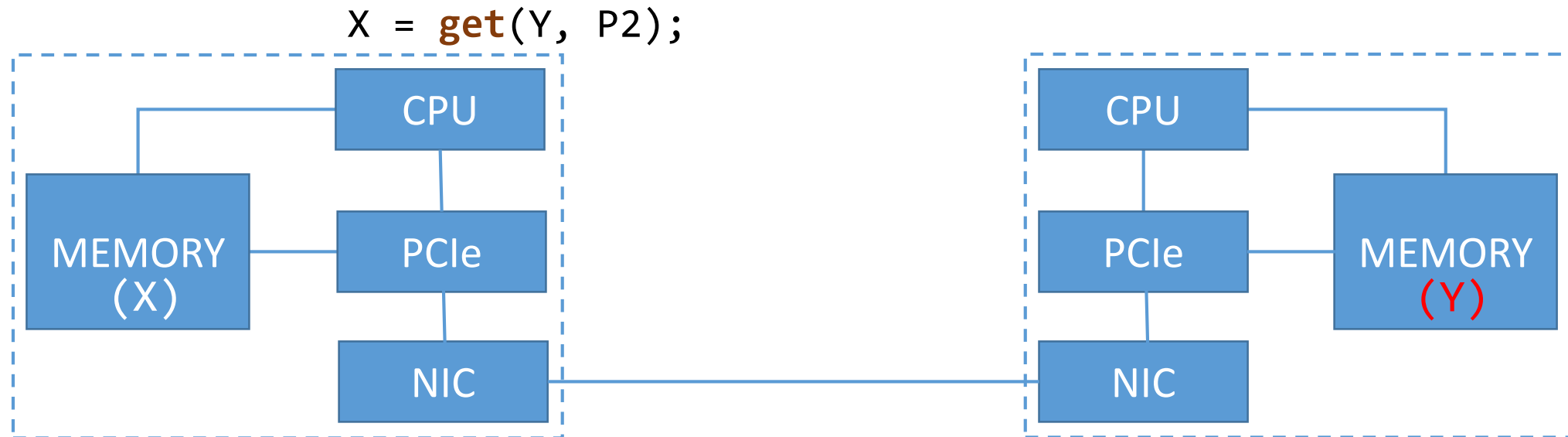
# Remote Memory Access (RMA) Networks



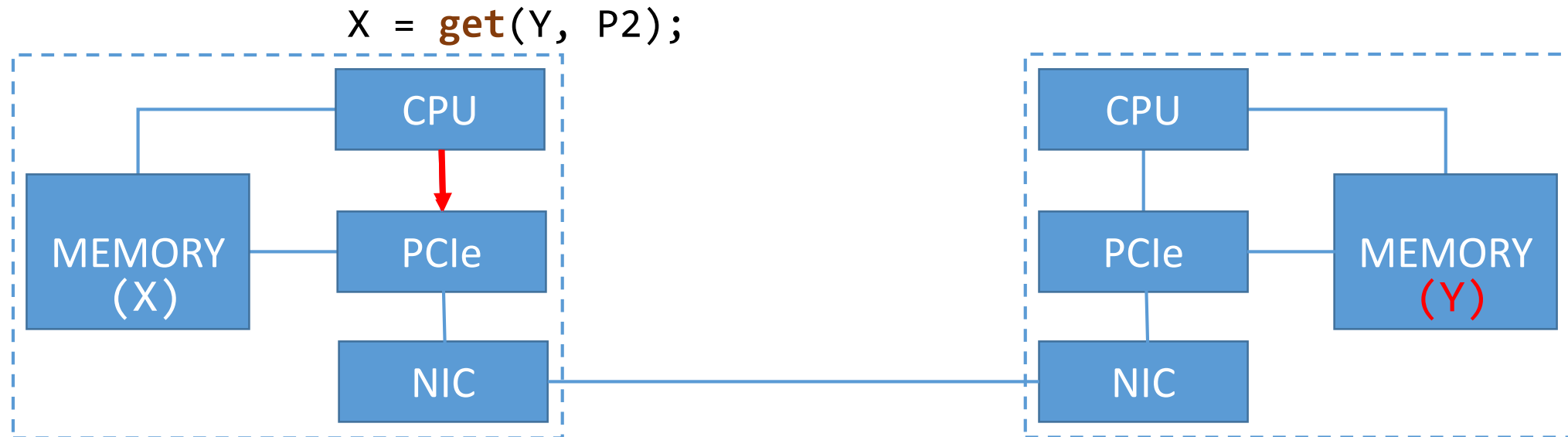
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Low latency

High bandwidth

# Goal

Given an infinite-state program  $P$  running on an RMA network and a safety specification  $S$ , **does  $P$  satisfy  $S$  under RMA?**

$$P \models_{\text{RMA}} S$$

RMA asynchronous executions determine a **weak-consistency memory model**, more relaxed than x86 TSO, PSO, RMO

**Process 1:**

**shared** X = 1;

**Process 2:**

**shared** Y = 2, Z = 0;  
**local** a;

**put**(X, P1, Y);  
**store** Y = 3;  
Z = **get**(X, P1);  
**load** a = Z;

**assert final** (a != 3);

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Sequential Consistency (SC)

Yes

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Remote Memory Access (RMA)

Yes

# This work

## *Main steps:*

1. Prove that P satisfies S under SC:

$$P \models_{SC} S$$

2. Construct P' under SC that captures all behaviors of P under RMA:

$$P' \models_{SC} S \Rightarrow P \models_{RMA} S$$

3. Prove that  $P' \models_{SC} S$

# This work

## ***Main steps:***

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2. Construct P' under SC that captures all behaviors of P under RMA:

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3. Prove that  $P' \models_{SC} S$

***Key Idea:*** Extrapolate the abstraction of P under SC to an abstraction of P under RMA

# Predicate Abstraction

Successful for **sequential program** analysis:

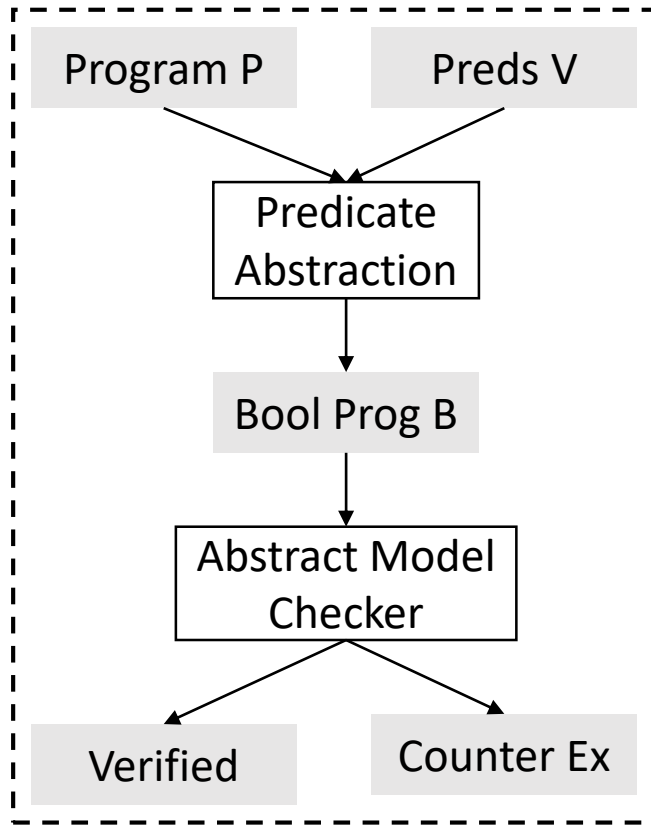
Original by Graf and Saidi (CAV '96)

Used by Microsoft's SLAM for device drivers (PLDI '01)

Work for **SC concurrent programs** and **weak memory models** (x86 TSO, PSO):

Kroening et al. (CAV '11), Gupta et al. (CAV '11), Dan et al. (SAS '13)

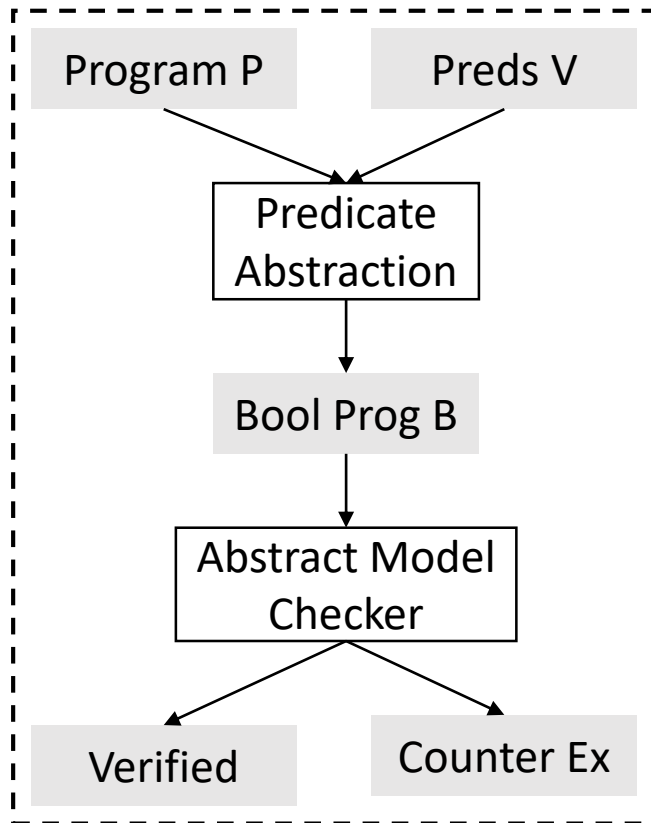
# Classic Predicate Abstraction



Build a boolean program **B** that over-approximates the behaviors of **P**:

$$B \models_{sc} S \Rightarrow P \models_{sc} S$$

# Classic Predicate Abstraction



Build a boolean program **B** that over-approximates the behaviors of **P**:

$$B \models_{SC} S \Rightarrow P \models_{SC} S$$

Using an abstract model checker, verify that **B** satisfies **S**:

$$B \models_{SC} S$$

# Step 1: Verify program P under SC

Assume the RMA statements execute **synchronously**



The diagram illustrates a transformation of a Remote Memory Access (RMA) statement into a standard assignment statement. It consists of two yellow rectangular boxes connected by a blue arrow pointing from left to right. The left box contains the text `put(Y, P1, X);` where the word `put` is in a bold, brown font. The right box contains the text `Y = X;`.

# Step 1: Verify program P under SC

Assume the RMA statements execute **synchronously**



The diagram consists of two yellow rectangular boxes connected by a blue arrow pointing from left to right. The left box contains the text `put(Y, P1, X);` where the word `put` is in brown and the rest is in black. The right box contains the text `Y = X;` in black.

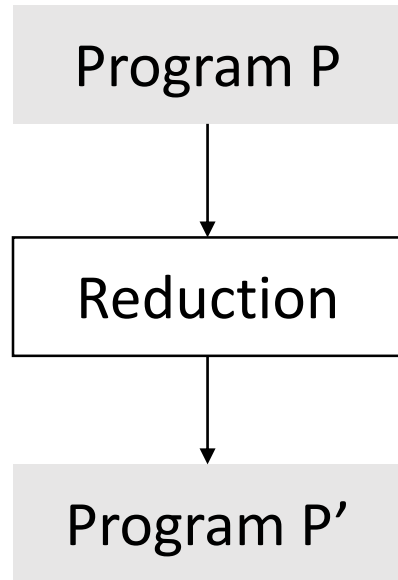
Find a set of predicates **V**

Build the boolean program **B** that over-approximates **P**, using **V**

Verify that **B** satisfies the property **S** under sequential consistency



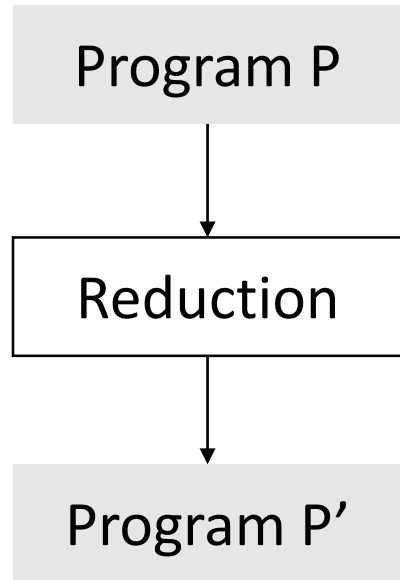
## Step 2: Encode RMA effects into the program



Reduce the problem of verifying P under RMA to the problem of verifying P' under SC

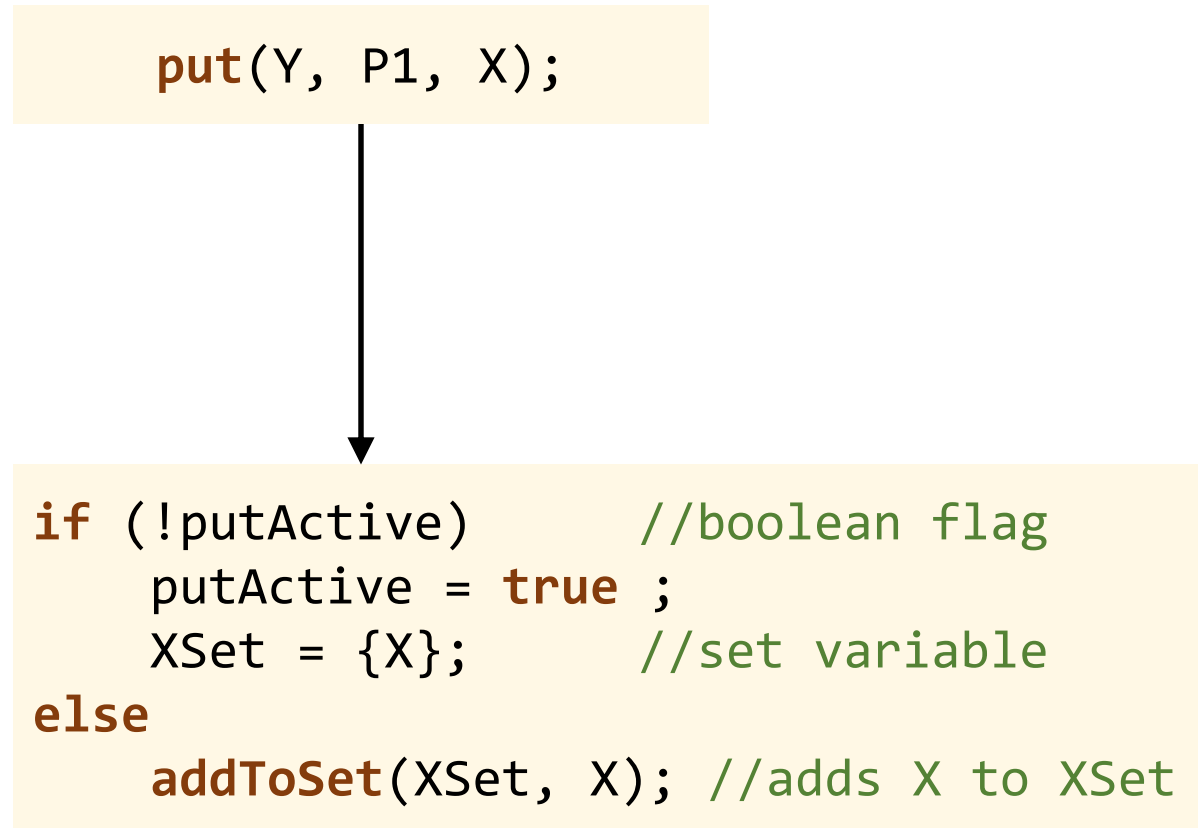
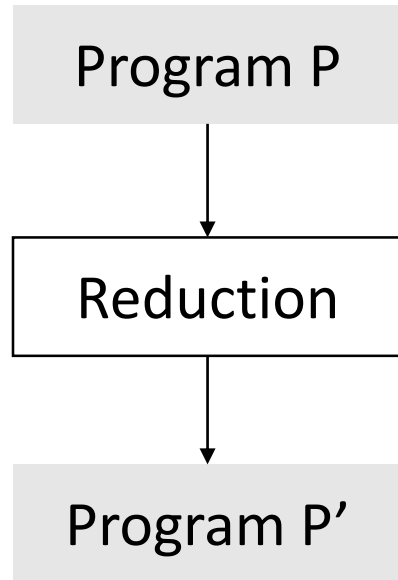
$$P' \models_{SC} S \Rightarrow P \models_{RMA} S$$

## Step 2: Encode RMA effects into the program



```
put(Y, P1, X);
```

## Step 2: Encode RMA effects into the program



## Example program P under RMA semantics

**Process 1:**

**shared** X = 0;

**put**(Y, P2, X);

**store** X = 1;

**Process 2:**

**shared** Y = 0;

**local** r;

**load** r = Y;

Example: Reduced program P' under SC that captures the behaviors of P under RMA

**Process 1:**

```
shared X = 0;

//put(Y, P2, X);
putActive = true ;
XSet = {X};

//store X = 1;
store X = 1;
addToSet(Xset, X);
```

**Process 2:**

```
shared Y = 0;
local r;

//nondeterministic op
if (*)
    Y = randomElem(XSet);
    putActive = false;

//load r = Y;
load r = Y;
```

**Theorem.** P' under SC **soundly approximates** P under RMA.

## Step 3: Prove that $P' \models_{SC} S$

Find new predicates for program  $P'$

Predicates for the **boolean flags**:

```
(putActive == true)
```

# Step 3: Prove that $P' \models_{SC} S$

Find new predicates for program  $P'$

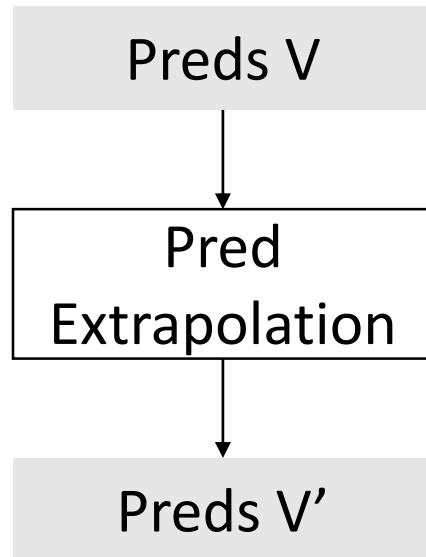
Predicates for the **boolean flags**:

`(putActive == true)`

Predicates for the **set variables**?

## Step 3: Prove that $P' \models_{SC} S$

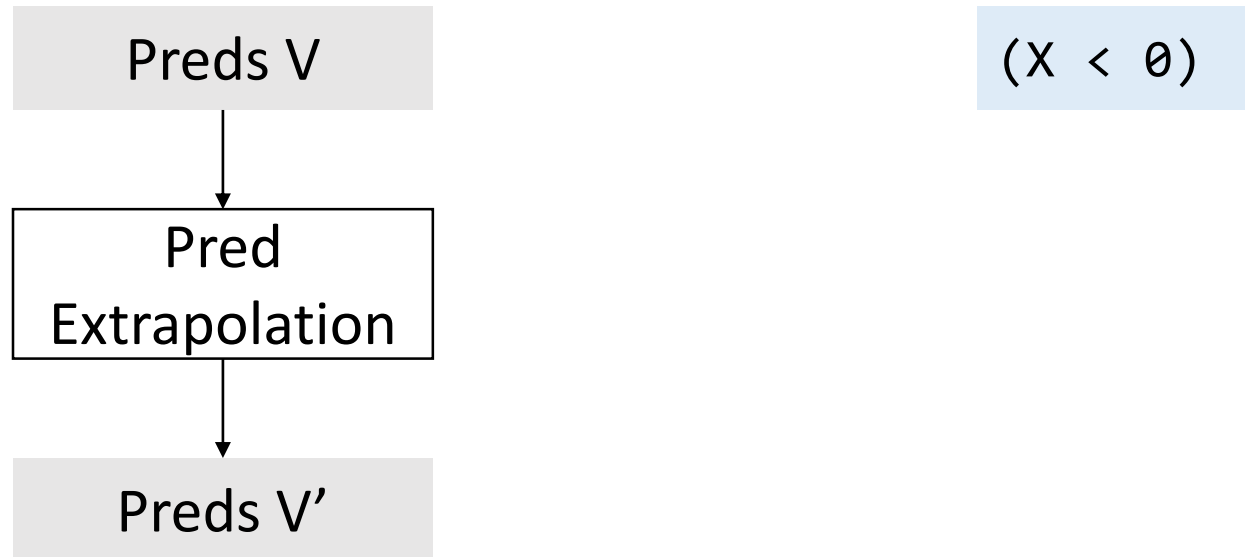
**Idea:** Discover predicates for  $P'$  using the predicates for program  $P$  under  $SC$ .





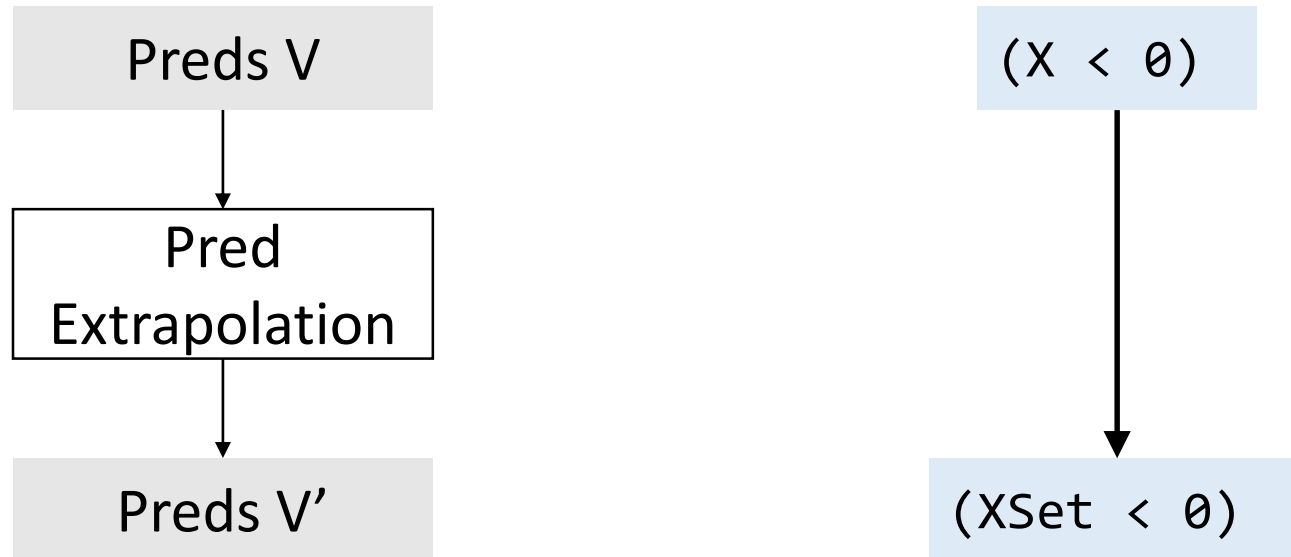
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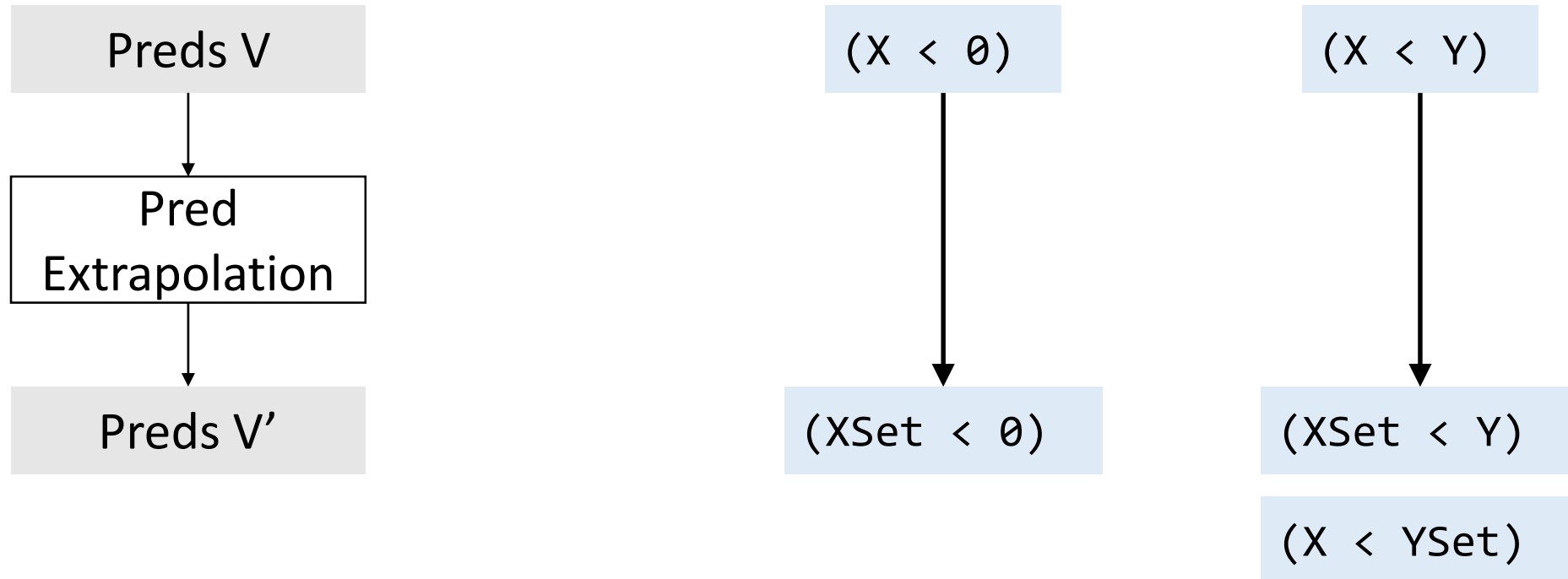
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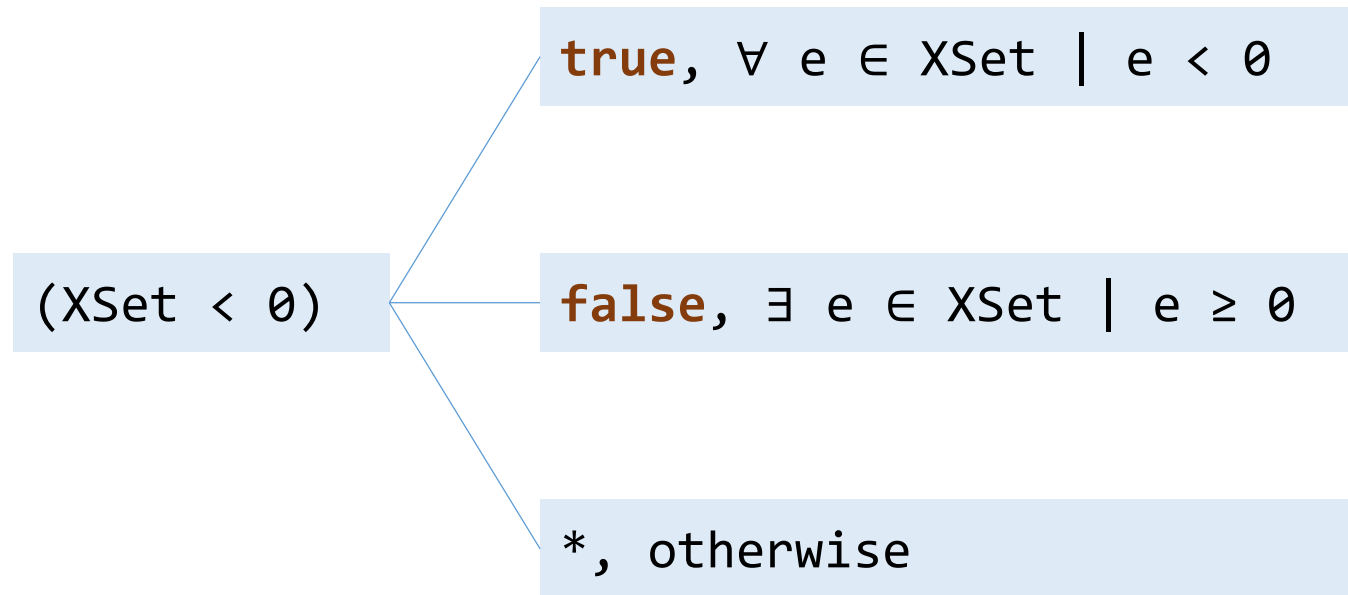


# Step 3: Prove that $P' \models_{SC} S$

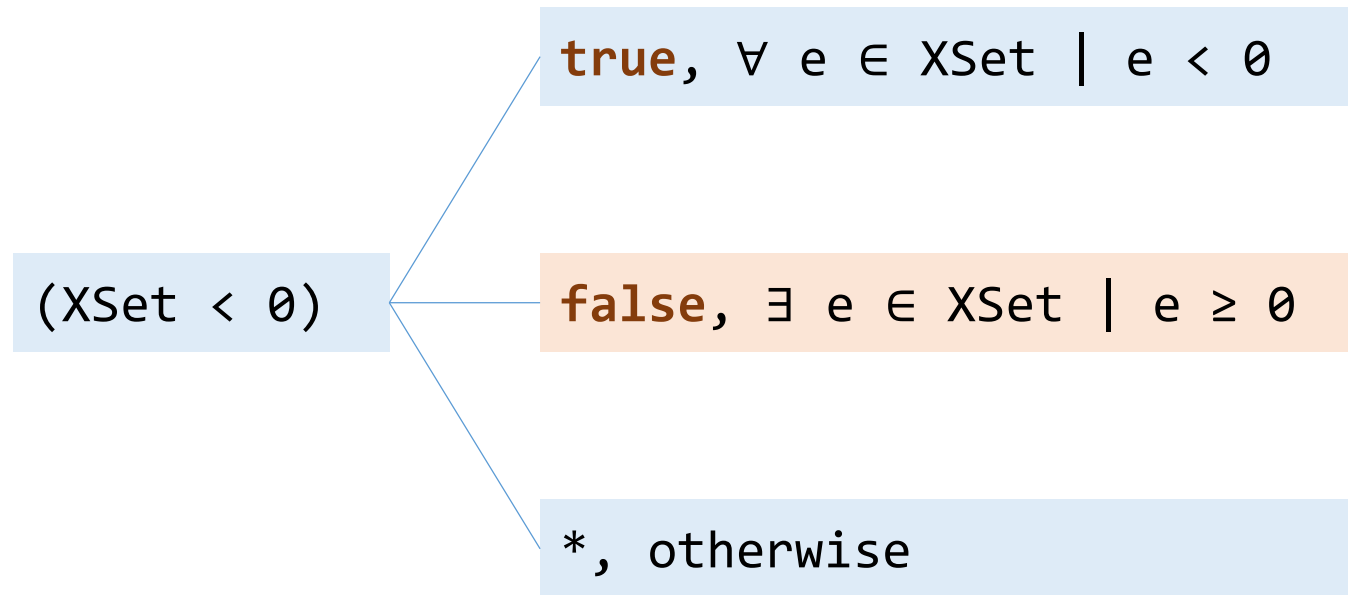
**Idea:** Discover predicates for  $P'$  using the predicates for program  $P$  under SC.



# Logic of the predicates (first attempt)

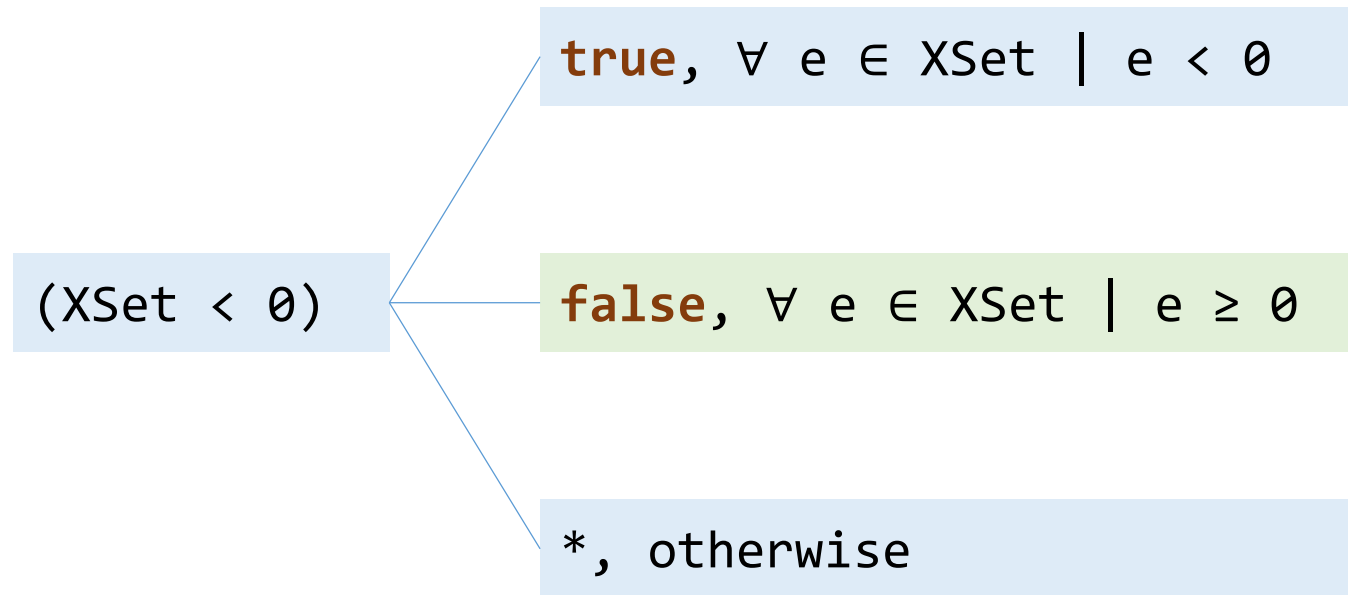


# Logic of the predicates (first attempt)



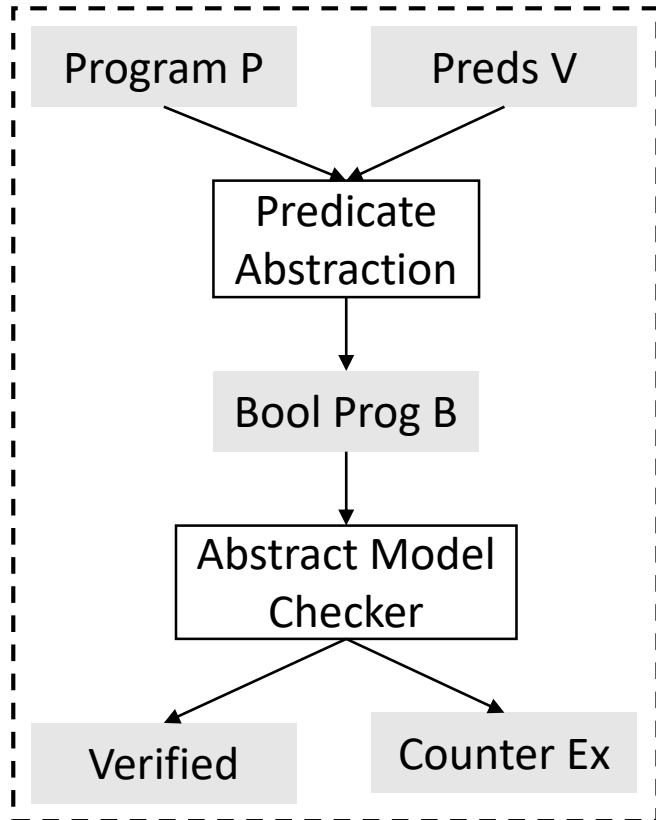
**Problem:** Would have to add the predicate  $(XSet \geq 0)$  to track whether all elements of the set are greater than 0.

# Logic of the predicates for the set variables

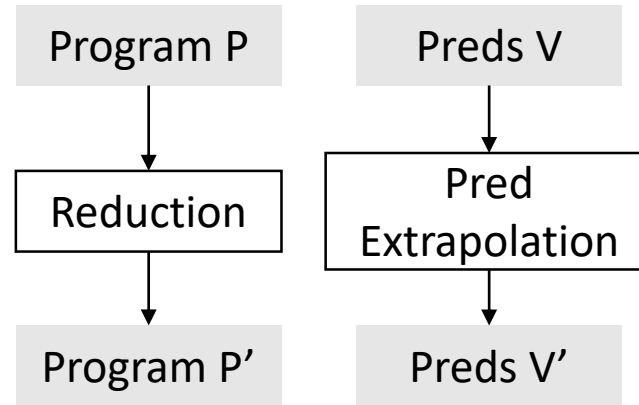


**Solution:** Refine the case when the predicate is **false**

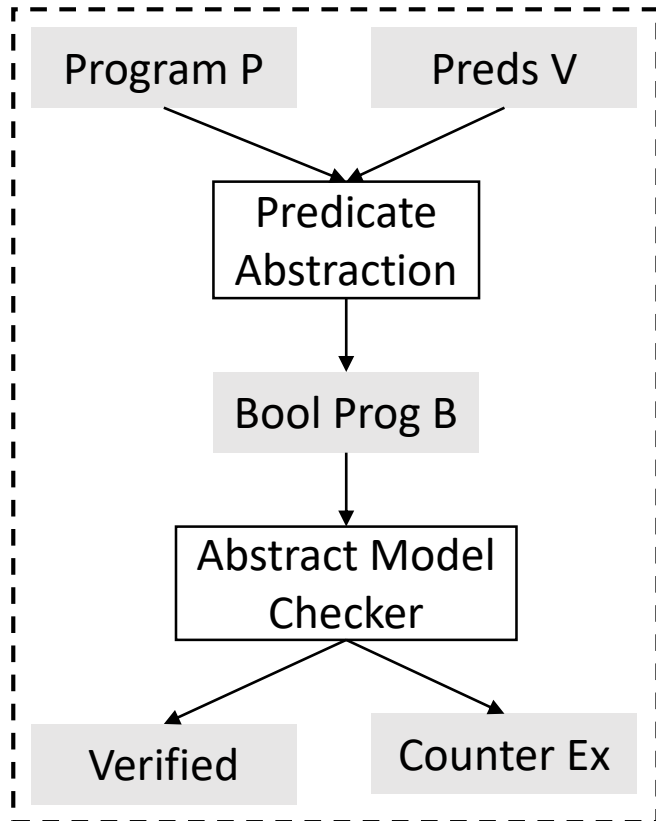
# So far



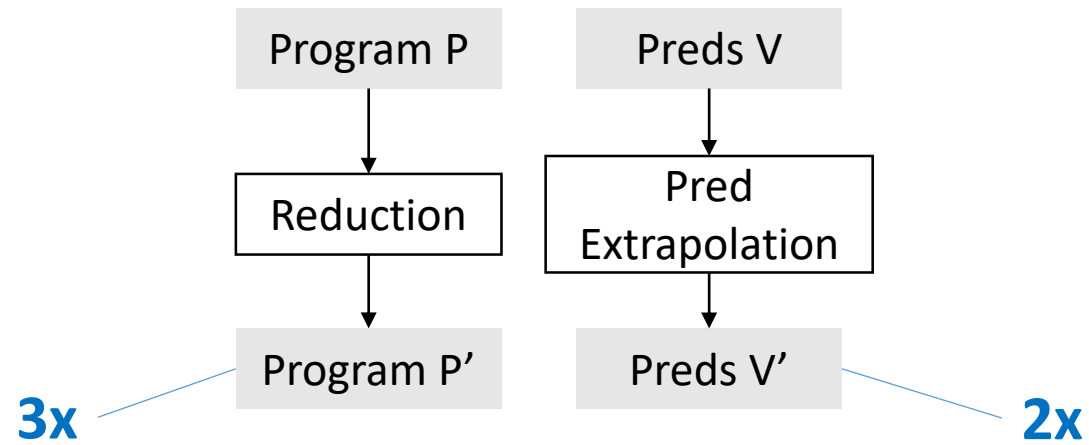
Prove that  $P \models_{sc} S$



# Problem

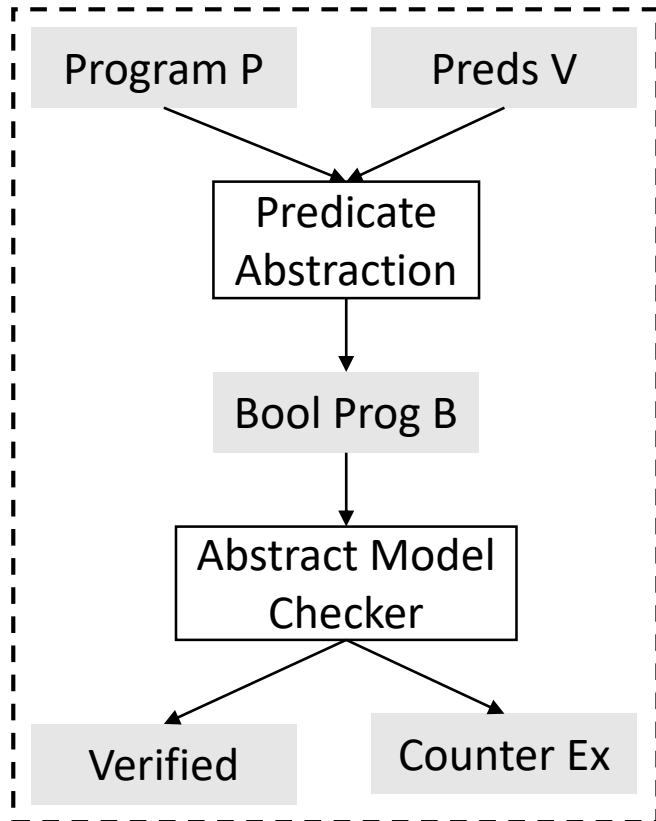


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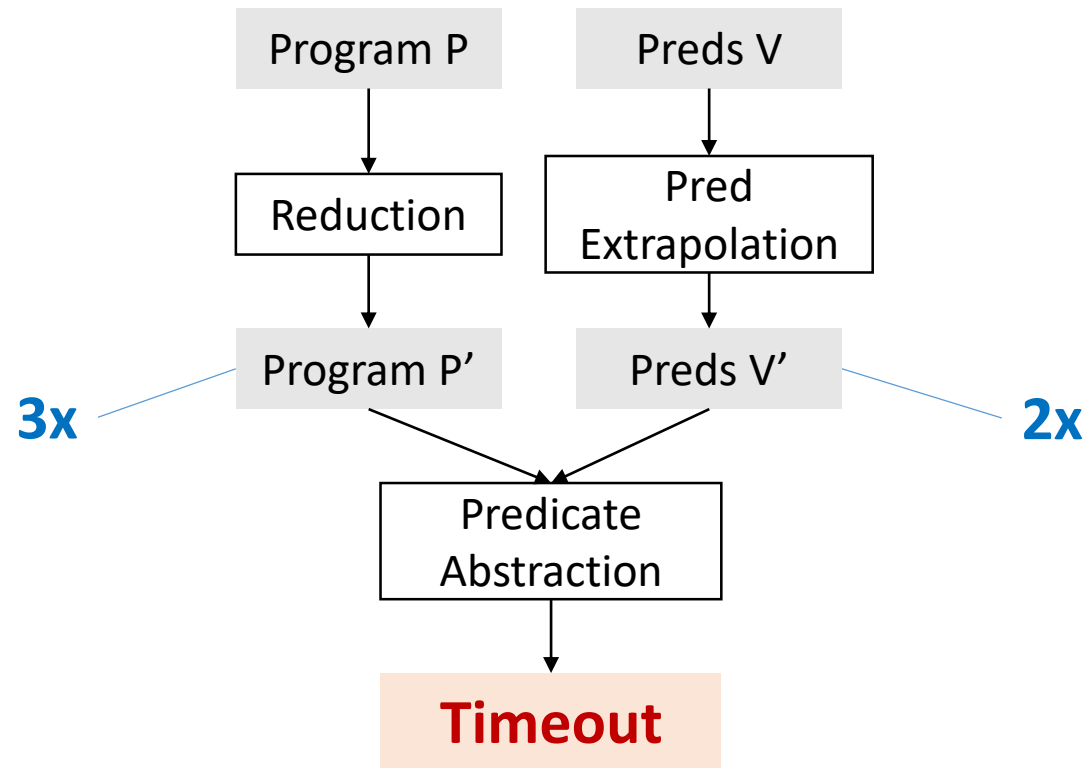




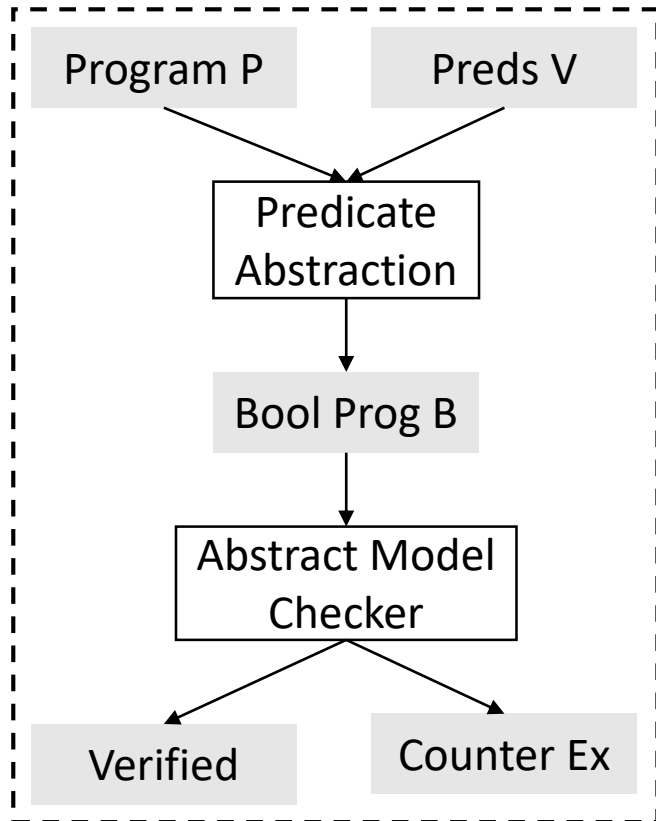
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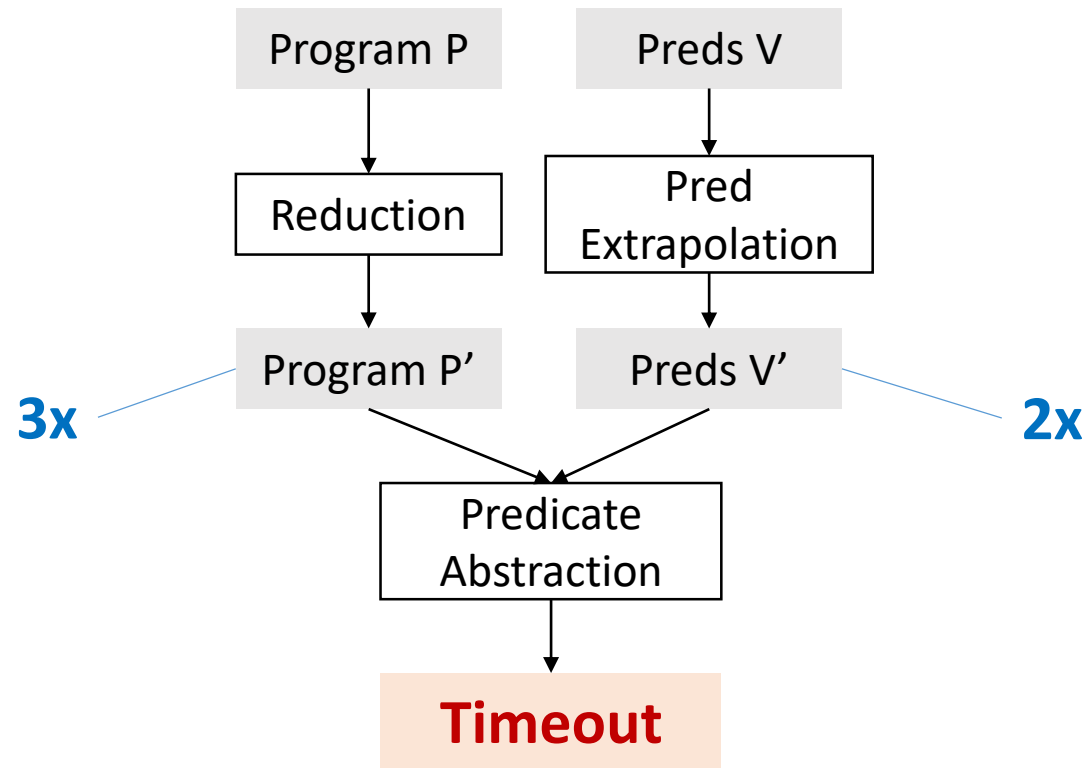
Prove that  $P \models_{sc} S$



# Problem



Prove that  $P \models_{sc} S$



Most time used by the SMT solver, computing the abstract transformers

# Core problem: computing abstract transformers

**Literals**  $q = p$  or  $q = \neg p$ ,  $p \in V'$

**Cubes** $(V')$   $= \{q_1 \wedge \dots \wedge q_j\}$

$$|\text{Cubes}(V')| = 3^{|V'|}$$

$\forall st \in \text{Statements}$

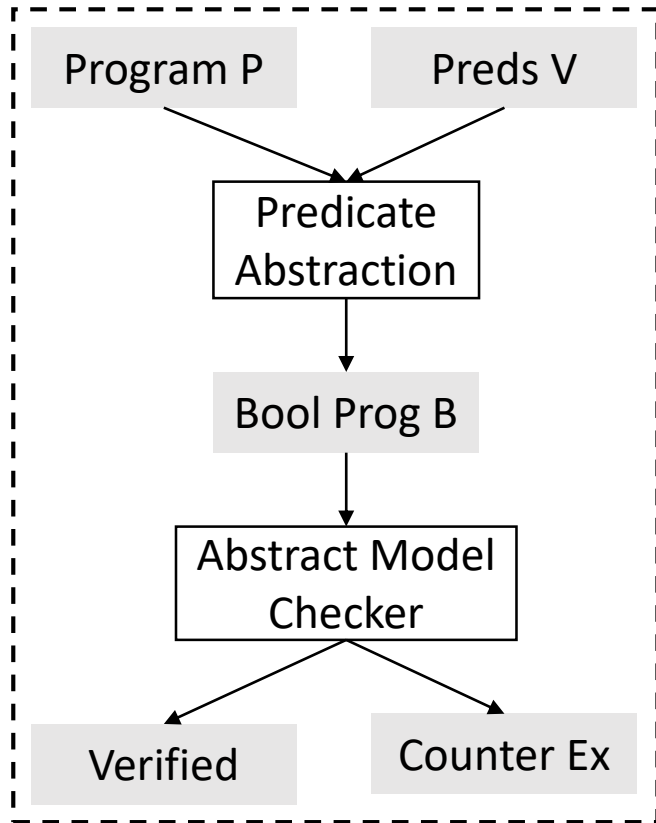
$\forall p \in V'$

$\forall c \in \text{Cubes}(V')$

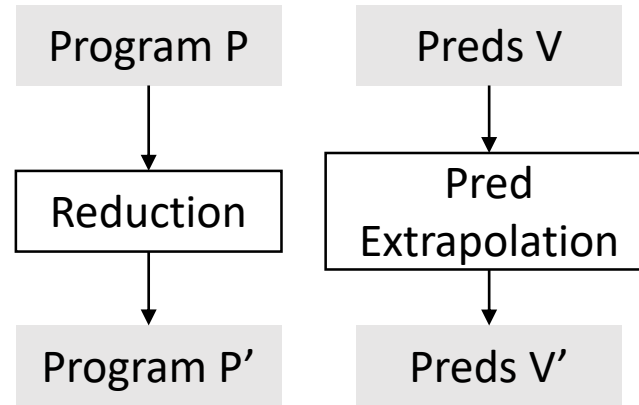
            if  $c \Rightarrow wp(p, st)$                       *//SMT call*

                add  $c$  to the transformer

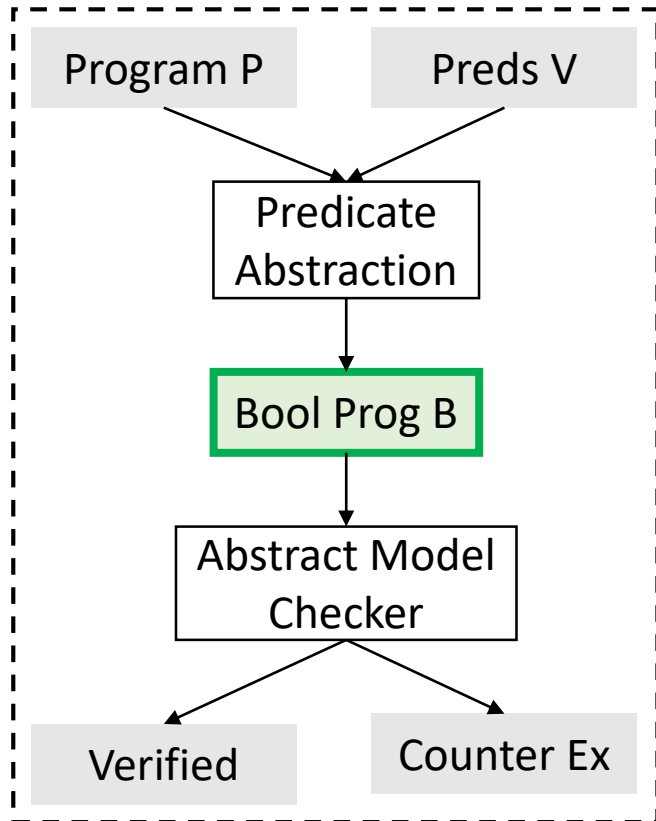
# Key Idea



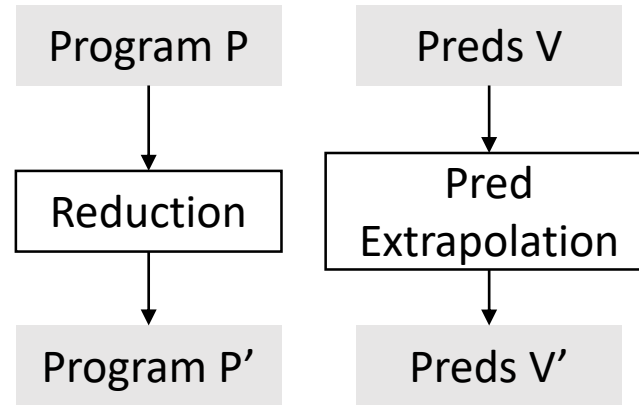
Prove that  $P \models_{SC} S$



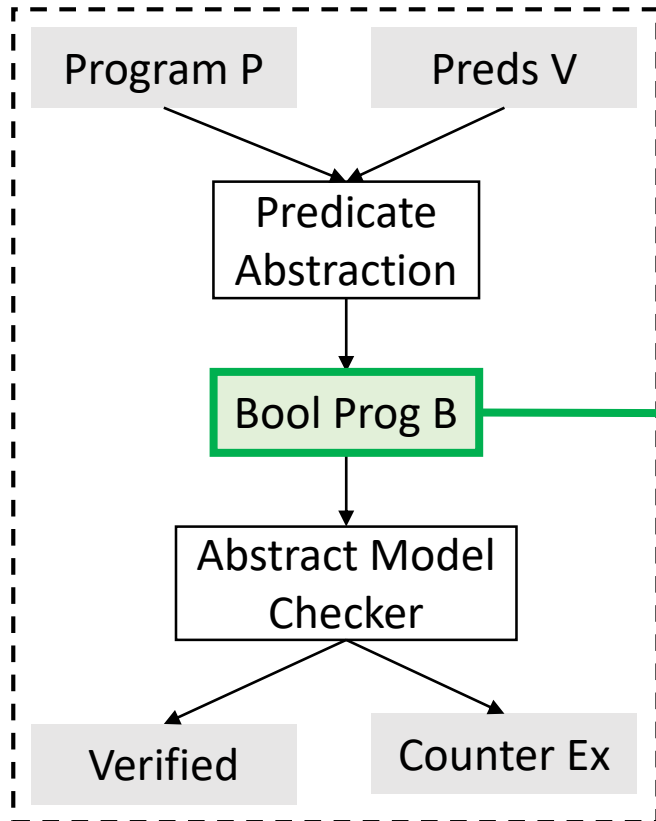
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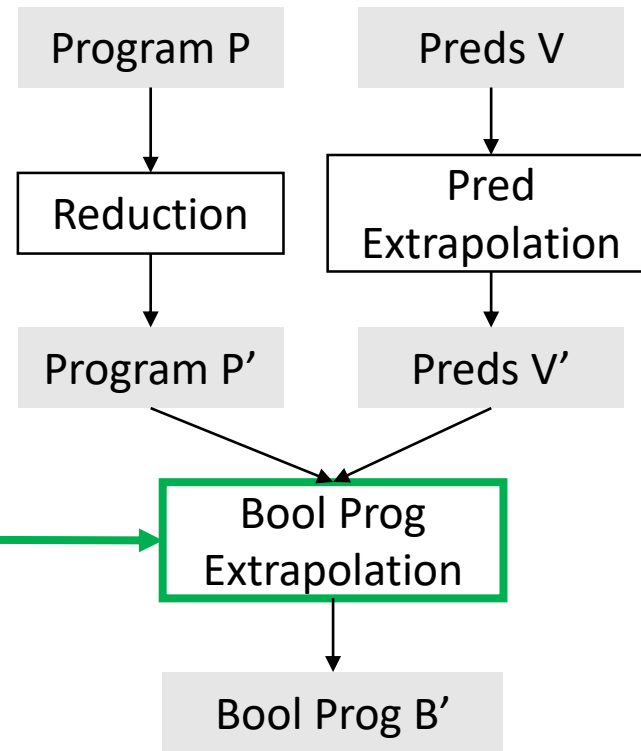
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# Key Idea



Prove that  $P \models_{SC} S$



# Boolean Program Extrapolation

Extrapolate the abstract transformers from the boolean program of the SC proof.

**Zero** calls to the SMT solver for building the boolean program

**Theorem.** The boolean program  $B'$  **soundly approximates** of the boolean program  $\text{PredicateAbstraction}(P', V')$ .

# Abstract transformer for **randomElem**

Program P

Program P'

**addElem**(Yset, Y)

Preds V

$(X > 0), (Y > Z), (Z > 0)$

Preds V'

$(X > 0), (Y > Z), (Z > 0)$   
 $(YSet > Z), \dots$

Bool Prog B

Bool Prog B'

?



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Bool Prog B

Bool Prog B'

$(YSet > Z) = \text{true}, (YSet > Z) \wedge (Y > Z)$   
 $\text{false}, \neg(YSet > Z) \wedge \neg(Y > Z)$   
\*, otherwise

# Abstract transformer for **randomElem**

Program P

Program P'

$X = \text{randomElem}(\text{YSet})$

Preds V

$(X > 0), (Y > Z), (Z > 0)$

Preds V'

$(X > 0), (Y > Z), (Z > 0)$   
 $(\text{YSet} > Z), \dots$

Bool Prog B

Bool Prog B'

?

# Abstract transformer for **randomElem**

Program P

$X = Y$

Program P'

$X = \text{randomElem}(Y\text{Set})$

Preds V

$(X > 0), (Y > Z), (Z > 0)$

Preds V'

$(X > 0), (Y > Z), (Z > 0)$   
 $(Y\text{Set} > Z), \dots$

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$(X > 0) = \text{true}, (Y > Z) \wedge (Z > 0)$   
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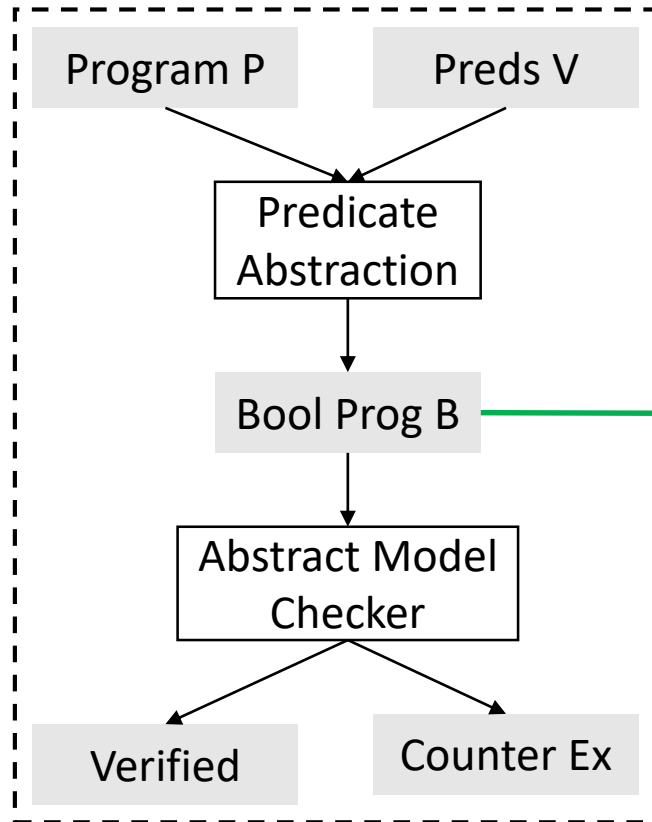
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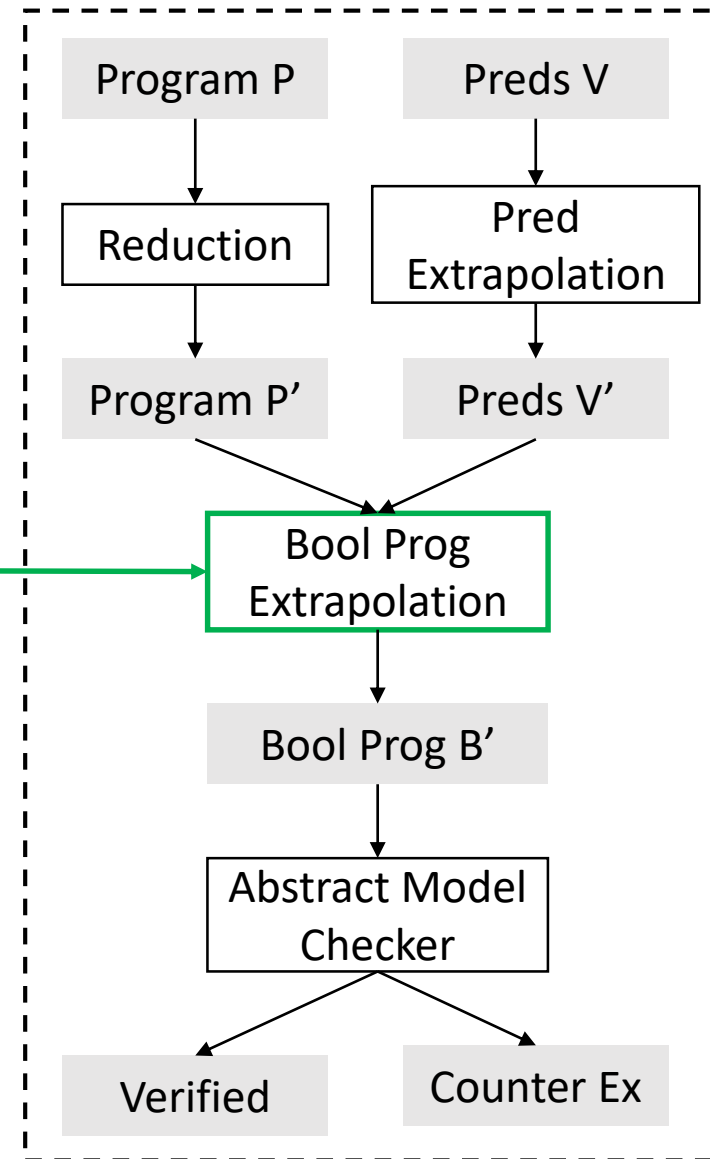


Bool Prog B'

$(X > 0) = \text{true}, (Y\text{Set} > Z) \wedge (Z > 0)$   
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 $*, \text{otherwise}$



Prove that  $P \models_{SC} S$



Prove that  $P \models_{RMA} S$

# Implementation

***Predicate Abstraction:*** cone of influence, Z3 SMT solver

***3-valued model checker:*** Fender

***Benchmarks:*** 14 concurrent algorithms, 2-3 processes, 25-85 lines of code, several have infinite number of states

***Specifications:*** mutual exclusion or reachability invariants

***Flush search:*** start with **flush** after each remote statement, and try removing

Algorithm	SC Predicate Abstraction			RMA Predicate Abstraction			
	V	B (s)	B (loc)	V'	B' (loc)	Fender (s)	Min <b>flush</b>
Dekker	11	1	498	29	2068	294	4/12
Peterson	10	1	356	21	1045	3	4/7
ABP	16	1	485	20	662	1	2/2
Pc1	18	2	658	35	3797	65	2/7
Pgsql	12	1	418	18	1549	1	2/4
Qw	13	2	487	29	1544	1345	4/5
Sober	23	7	831	48	8466	4	0/9
Kessel	18	3	534	36	1621	45	4/10
Loop2_TLM	29	66	1068	43	1986	2204	2/4
Szymanski	34	228	1182	64	7081	316	7/14
Queue	13	35	572	22	1104	14	1/2
Ticket	17	117	640	43	3615	3493	5/6
Bakery	19	337	828	41	2947	203	6/10
RMA Lock	24	50	763	60	5932	65679	9/18

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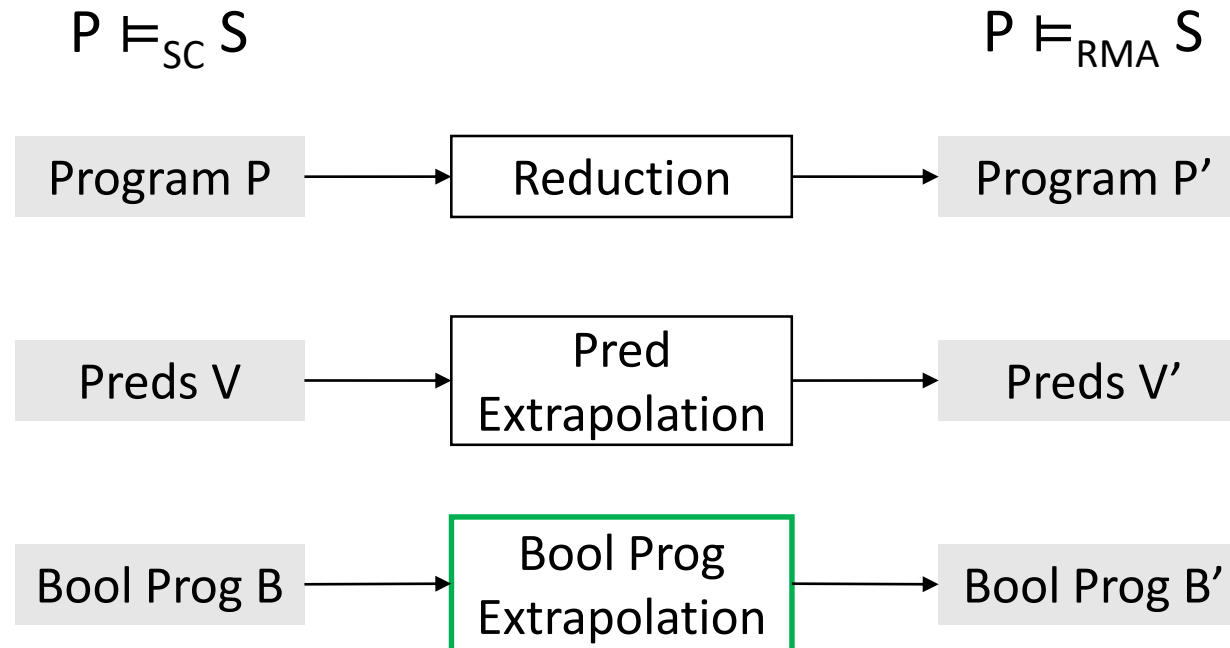


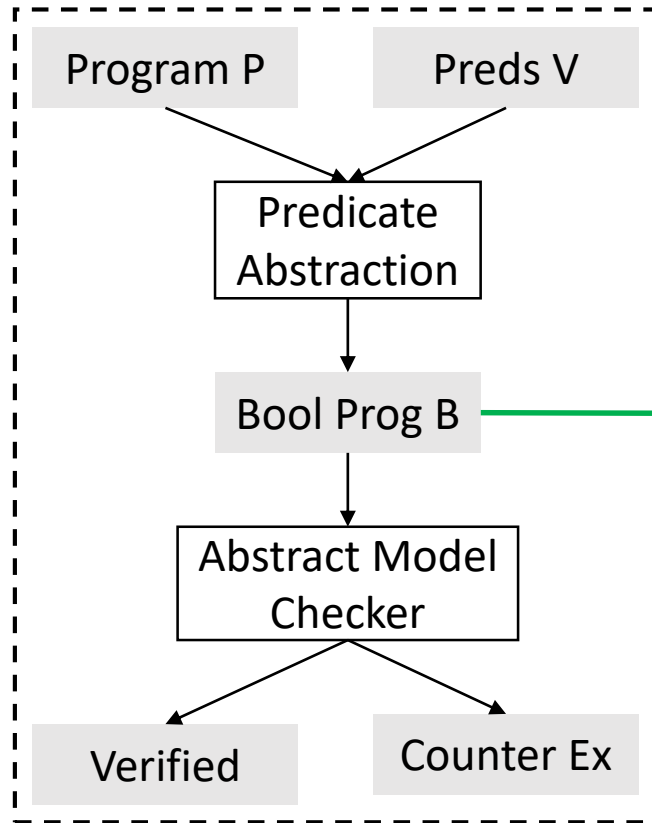
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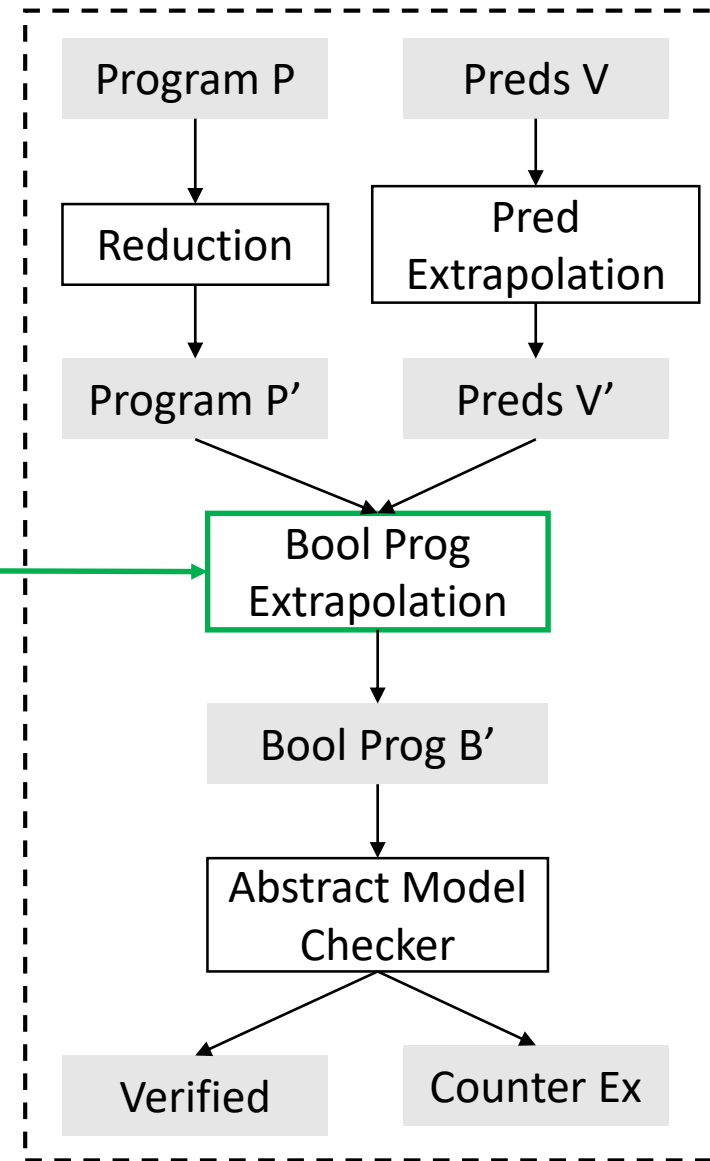
Algorithm	SC Predicate Abstraction			RMA Predicate Abstraction			
	V	B (s)	B (loc)	V'	B' (loc)	Fender (s)	Min <b>flush</b>
Dekker	11	1	498	29	2068	294	4/12
Peterson	10	1	356	21	1045	3	4/7
ABP	16	1	485	20	662	1	2/2
Pc1	18	2	658	35	3797	65	2/7
Pgsql	12	1	418	18	1549	1	2/4
Qw	13	2	487	29	1544	1345	4/5
Sober	23	7	831	48	8466	4	0/9
Kessel	18	3	534	36	1621	45	4/10
Loop2_TLM	29	66	1068	43	1986	2204	2/4
Szymanski	34	228	1182	64	7081	316	7/14
Queue	13	35	572	22	1104	14	1/2
Ticket	17	117	640	43	3615	3493	5/6
Bakery	19	337	828	41	2947	203	6/10
RMA Lock	24	50	763	60	5932	65679	9/18

# Conclusion





Prove that  $P \models_{SC} S$



Prove that  $P \models_{RMA} S$