

# On Solving Universally Quantified Horn Clauses [SAS2013]

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# Program Verification

## Domain

Bugs in programs

## Two complementary techniques

- Finding Bugs
- **Ensuring the absence of bugs**

## Main use

High security softwares: avionics, cars, satellites, ...



# Motivating Example

## Motivation for arrays

Arrays are a first start to deal with memory

```
1 char* some_array_value();
2 #define N 100
3
4 int main(){
5     char a[N];
6     char* b = some_array_value();
7     for (int i=0 ; i < N; i++) {    (*)
8         a[i] = b[i];
9     }
10    int j = rand()%N;
11    assert(a[j]==b[j]);
12 }
```

Figure: Motivating example: array copy

# Language Independent Representation

## Goal

Verification problem = satisfiability of a formula

## Motivation

- Non ambiguous semantics
- Very few elements of language to deal with
- Can reuse logic results

## How

Horn clauses = formula expressing derivation trees (Prolog like)

## Horn solvers

- SMT solvers such as Z3
- Datalog techniques such as Spacer
- Abstract Interpretation techniques

## Horn clauses

$Start(a, b)$

$Loop(a, b, 0) \leftarrow Start(a, b)$

$Loop(a', b, i + 1) \leftarrow Loop(a, b, i) \wedge a' = a[i \leftarrow b[i]] \wedge i < N$

$EndLoop(a, b) \leftarrow Loop(a, b, i) \wedge i \geq N$

$Assert(a, b, j) \leftarrow EndLoop(a, b) \wedge j = randval \% N$

$false \leftarrow Assert(a, b, j) \wedge a[j] \neq b[j]$

Figure: Horn clauses for array copy

### Main difficulty

Useful invariants on arrays are quantified:  $\forall k, k < i \Rightarrow a[k] = b[k]$

# Moving quantifiers from invariants to formula

## Main Idea

Enforce the invariant to be quantified:  $P(a, \dots)$  replaced by

$$\forall x, P(x, a, \dots)$$

$\Rightarrow$  solver does not need to search for a quantified  $P$  anymore

## Transformation of Horn clauses

$$P'(a') \leftarrow P(a) \wedge \phi(a, a')$$

becomes:

$$\forall y, P'(y, a') \leftarrow \forall x, P(x, a) \wedge \phi(a, a')$$

and simplified to:

$$P'(y, a') \leftarrow \forall x, P(x, a) \wedge \phi(a, a')$$

## Problem

How to remove quantifiers in the premises ?

## Instantiating the Quantifiers

$\forall$  = infinite conjunction

$$\begin{aligned} P'(y, a') &\leftarrow \forall x, P(x, a) \wedge \phi(a, a') \\ &\equiv P'(y, a') \leftarrow \bigwedge_x P(x, a) \wedge \phi(a, a') \end{aligned}$$

### Theorem

*Using only a subset of a conjunction in the premises is sound*

### Solution

Select a finite number of relevant  $x$

### Technique

The paper suggests “E-matching”  $\Rightarrow$  Syntax based

## The case of arrays

Instantiate on array reads and the result variable

$Start(x_a, a, x_b, b)$

$Loop(x_a, a, x_b, b, 0) \leftarrow Start(x_a, a, x_b, b)$

$Loop(x'_a, a', x_b, b, i + 1) \leftarrow \left\{ \begin{array}{l} Loop(x_a, a, x_b, b, i) \\ Loop(x_a, a, i, b, i) \end{array} \right\} \wedge a' = a[i \leftarrow b[i]] \wedge i < N$

$EndLoop(x_a, a, x_b, b) \leftarrow Loop(x_a, a, x_b, b, i) \wedge i \geq N$

$Assert(x_a, a, x_b, b, j) \leftarrow EndLoop(x_a, a, x_b, b) \wedge j = randval \% N$

$False \leftarrow \left\{ \begin{array}{l} Assert(x_a, a, x_b, b, j) \\ Assert(x_a, a, j, b, j) \\ Assert(j, a, x_b, b, j) \\ Assert(j, a, j, b, j) \end{array} \right\} \wedge a[j] \neq b[j]$

Figure: Quantifier transformation of the Horn clauses of array copy

### Theorem

*Instantiating on array reads and the result variable is a complete instantiation (not in the article)*



# Experimental Results

## Results

Showing those of SAS2016 for arrays (same resulting clauses)

Timing in seconds, CPU time.

The machine has 32 i3-3110M cores, 64 GiB RAM

| Benchmark         | Z3/PDR        |        | Z3/Spacer     |      | Eldarica      |       | Distinct number |
|-------------------|---------------|--------|---------------|------|---------------|-------|-----------------|
|                   | Res           | Time   | Res           | Time | Res           | Time  |                 |
| bin search array  | sat           | 0.38   | timeout(300s) |      | Exception     |       | N=1             |
| find mini array   | sat           | 2.99   | sat           | 1.16 | sat           | 58.97 | N=1             |
| bubble sort array | sat           | 4.42   | sat           | 3.17 | sat           | 68.86 | N=2             |
| insert sort array | sat           | 146.42 | timeout(300s) |      | timeout(300s) |       | N=2             |
| insert sort list  | timeout(300s) |        | sat           | 1.35 | timeout(300s) |       | N=2             |

## Conclusion

Sorting algorithms in minutes!

# Conclusion

## Main Contribution of the paper

A general technique to obtain quantified invariants

## Consequences

We can prove sorting algorithms on arrays !

## Limits

How to find the relevant instantiation ?

# Thank you for your attention !

Any Questions ?