# Symbolic String Verification: Combining String Analysis and Size Analysis

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String Analysis + Size Analysis

### Motivation

We aim to develop a verification tool for analyzing infinite state systems that have **unbounded string and integer variables**.

We propose a composite static analysis approach that combines string analysis and size analysis.



- Motivation

String Analysis + Size Analysis

# String Analysis

Static String Analysis: At each program point, statically compute the possible values of **each string variable**.

The values of each string variable are over approximated as a regular language accepted by a **string automaton** [Yu et al. SPIN08].

String analysis can be used to detect **web vulnerabilities** like SQL Command Injection [Wassermann et al, PLDI07] and Cross Site Scripting (XSS) attacks [Wassermann et al., ICSE08].



☐ Motivation

String Analysis + Size Analysis

# Size Analysis

Integer Analysis: At each program point, statically compute the possible states of the values of all integer variables.

These infinite states are symbolically over-approximated as a Presburger arithmetic and represented as an arithmetic automaton [Bartzis and Bultan, CAV03].

Integer analysis can be used to perform **Size Analysis** by representing lengths of string variables as integer variables.



A motivating example from trans.php, distributed with MyEasyMarket-4.1.

- 1:<?php
- 2: \$www = \$\_GET["www"];
- 3: \$l\_otherinfo = "URL";
- 4: \$www = ereg\_replace("[^A-Za-z0-9 ./-@://]","",\$www);
- 5: if(strlen(\$www) < \$limit)
- 6: echo "" . \$l\_otherinfo . ": " . \$www . "";
- **■** 7:?>



If we perform **size analysis** solely, after line 4, we do not know the length of \$www.

- 1:<?php
- 2: \$www = \$\_GET["www"];
- 3: \$l\_otherinfo = "URL";
- 4: \$www = ereg\_replace("[^A-Za-z0-9 ./-@://]","",\$www);
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- 6: echo "" . \$l\_otherinfo . ": " . \$www . "";
- **■** 7:?>



If we perform **string analysis** solely, at line 5, we cannot check the branch condition.

- 1:<?php
- 2: \$www = \$\_GET["www"];
- 3: \$l\_otherinfo = "URL";
- 4: \$www = ereg\_replace("[^A-Za-z0-9 ./-@://]","",\$www);
- 5: if(strlen(\$www) < \$limit)
- 6: echo "" . \$l\_otherinfo . ": " . \$www . "";
- **■** 7:?>



# What is Missing?

We need a **composite analysis** that combines string analysis with size analysis.

Challenge: How to transfer information between string automata and arithmetic automata?

To do so, we introduce **Length Automata**.



### Some Facts about String Automata

- A string automaton is a single-track DFA that accepts a regular language, whose length forms a semi-linear set, .e.g.,  $\{4,6\} \cup \{2+3k \mid k \geq 0\}$ .
- The unary encoding of a semi-linear set is uniquely identified by a unary automaton
- The unary automaton can be constructed by replacing the alphabet of a string automaton with a unary alphabet

### Some Facts about Arithmetic Automata

- An arithmetic automaton is a multi-track DFA, where each track represents the value of one variable over a binary alphabet
- If the language of an arithmetic automaton satisfies a Presburger formula, the value of each variable forms a semi-linear set
- The semi-linear set is accepted by the binary automaton that projects away all other tracks from the arithmetic automaton



Preliminary

#### An Overview

To connect the dots, we need to convert unary automata to binary automata and vice versa.

Binary Length Automata 🛱 Automata

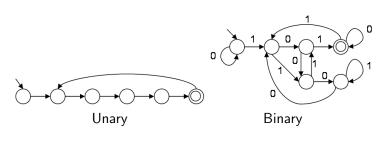


Arithmetic

### An Example of Length Automata

Consider a string automaton that accepts  $(great)^+$ . The length set is  $\{5 + 5k | k \ge 0\}$ .

- 5: in unary 11111, in binary 101, from lsb **101**.
- 1000: in binary 1111101000, from lsb **0001011111**.

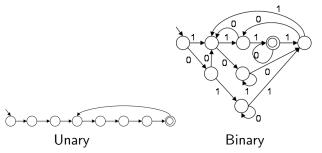




### Another Example of Length Automata

Consider a string automaton that accepts  $(great)^+cs$ . The length set is  $\{7+5k|k\geq 0\}$ .

- 7: in unary 1111111, in binary 1100, from lsb **0011**.
- 107: in binary 1101011, from lsb **1101011**.
- 1077: in binary 10000110101, from lsb **10101100001**.





From Unary to Binary

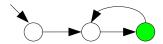
# From Unary to Binary

Given a unary automaton, construct the binary automaton that accepts the same set of values in binary encodings (starting from the least significant bit)

- Identify the semi-linear sets
- Add binary states incrementally
- Construct the binary automaton according to those binary states



### Identify the semi-linear set



- lacksquare A unary automaton M is in the form of a lasso
- lacksquare Let C be the length of the tail, R be the length of the cycle
- $\{C+r+Rk\mid k\geq 0\}\subseteq L(M)$  if there exists an accepting state in the cycle and r is its length in the cycle
- For the above example
  - C = 1, R = 2, r = 1



From Unary to Binary

### Binary states

A binary state is a pair (v, b):

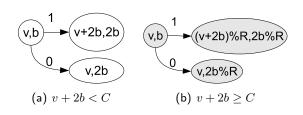
- $lue{v}$  is the integer value of all the bits that have been read so far
- b is the integer value of the last bit that has been read
- lacksquare Initially, v is 0 and b is undefined.



### The Binary Automaton Construction

We construct the binary automaton by adding binary states accordingly

- Once  $v + 2b \ge C$ , v and b are the remainder of the values divided by R (case (b))
- $\bullet$  (v,b) is an accepting state if  $\exists r.r = (C+v)\%R$

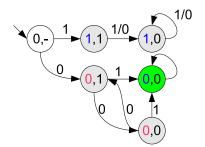




### The Binary Automaton Construction

Consider the previous example, where C=1, R=2, r=1.

- 0 = (C+r)%R = (1+1)%2
- The number of binary states is  $O(N^2)$ . N is the size of the unary automaton



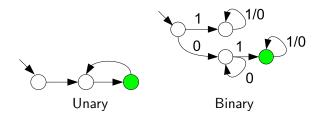


Length Automata

From Unary to Binary

### The Binary Automaton Construction

After the construction, we apply minimization and get the final result.





Length Automata

From Binary to Unary

# From Binary to Unary

Given a binary automaton, construct the unary automaton that accepts the same set of values in unary encodings

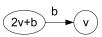
#### An Over Approximation:

- Compute the minimal and maximal accepted values of the binary automaton
- Construct the unary automaton that accepts the values in between



# Compute the Minimal/Maximal Values

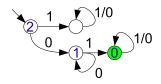
- Observations:
  - The minimal value forms the shortest accepted path
  - The m aximal value forms the longest loop-free accepted path (If there exists any accepted path containing a cycle, the maximal value is inf)
- Perform BFS from the accepting states up to the length of the shortest/longest path. (Both are bounded by the number of states)
  - Initially, both values of the accepting states are set to 0
  - Update the minimal/maximal values for each state accordingly



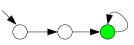
### The Unary Automaton Construction

Consider our previous example,

- $\blacksquare$  min = 2, max = inf
- $\blacksquare$  An over approximation:  $\{2+2k\mid k\geq 0\}\subseteq \{2+k\mid k\geq 0\}$



The Minimal Value



The Unary Automaton

# Some Remarks: From Binary to Unary

- In general, we cannot convert binary to unary automata precisely. (e.g.,  $\{2^k \mid k \geq 0\}$ )
- A unary automaton can only specify a semi-linear set
- Leroux [LICS04] presented an algorithm to identify the presburger formula from an arithmetic automaton, which can be used to improve the precision of our approach

### A Simple Imperative Language

#### We support:

- branch and goto statements
  - branch conditions can be membership of regexp on string variables or a presburger formula on integers and the length of string variables.
- string operations including concatenation, prefix, suffix, and language-based replacement.
- linear arithmetic computations on integers



### Composite State

At each program point, we compute the reachable composite states that consist of the states of :

- Multiple single-track string automata (Each string automaton accepts the values of a string variable)
- A multi-track arithmetic automaton (Each track accepts the length of a string variable or the value of an integer variable)



### Forward Fixpoint Computation

The computation is based on a standard work queue algorithm.

- We iteratively compute and add the post images for each program label until reaching a fixpoint
- The post image is defined on the composite state
  - String  $\rightarrow$  (Unary  $\rightarrow$  Binary)  $\rightarrow$  Arithmetic
  - $\blacksquare$  Arithmetic  $\rightarrow$  (Binary  $\rightarrow$  Unary)  $\rightarrow$  String
- We incorporate a widening operator on automata to accelerate the fixpoint computation



### Implementation

We implemented a prototype tool on top of

- Symbolic String Analysis [Yu et al. SPIN08]
- Arithmetic Analysis [Bartzis et al. CAV03]
- Automata Widening [Bartzis et al. CAV04]

Both string and arithmetic automata are symbolically encoded by using the MONA DFA Package. [Klarlund and Møller, 2001]

■ Compact representation and efficient MBDD manipulations



### **Benchmarks**

We manually generate several benchmarks from:

- C string library
- Buffer overflow benchmarks [Ku et al., ASE07]
- Web vulnerable applications [Balzarotti et al., SSP08]

These benchmarks are small (<100 statements and < 10 variables) but demonstrate typical string manipulations.



#### Implementation and Experiments

### Experimental Results

The results show some promise in terms of both precision and performance

Test case $(bad/ok)$	Result	Time (s)	Memory (kb)
int strlen(char *s)	T	0.037	522
char *strrchr(char *s, int c)	Т	0.011	360
gxine (CVE-2007-0406)	F/T	0.014/0.018	216/252
samba (CVE-2007-0453)	F/T	0.015/0.021	218/252
MyEasyMarket-4.1 (trans.php:218)	F/T	0.032/0.041	704/712
PBLguestbook-1.32 (pblguestbook.php:1210)	F/T	0.021/0.022	496/662
BloggIT 1.0 (admin.php:27)	F/T	0.719/0.721	5857/7067

Table: T: buffer overflow free or SQL attack free



- String Analysis:
  - Java String Analyzer (Finite Automata) [Christensen et al., SAS03]
  - PHP String Analyzer (Context Free Grammar) [Minamide, WWW05]



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- Integer Analysis:
  - Automaton Construction [Wolper et al., TACAS00]



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- Integer Analysis:
  - Automaton Construction [Wolper et al., TACAS00]
- Size Analysis:
  - Buffer Overflow Detection [Dor et al., 2003] [Ganapathy et al., CCS03] [Wagner et al., NDSS00]



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- Composite Analysis:
  - Test Input Generation (Splat) [Xu et al., ISSTA08]



### Conclusion

- We presented an automata-based approach for symbolic verification of infinite state systems with unbounded string and integer variables
- We presented a composite verification framework that combines string analysis and size analysis
- We improved the precision of both string and size analysis by connecting the information between them



Thank you for your attention.

Questions?

More Information: http://www.cs.ucsb.edu/~bultan/vlab http://www.cs.ucsb.edu/~yuf

