

# Z3-Noodler: An Automata-based String Solver

Yu-Fang Chen <sup>1</sup> David Chocholatý <sup>2</sup> **Vojtěch Havlena** <sup>2</sup>  
Lukáš Holík <sup>2</sup> Ondřej Lengál <sup>2</sup> Juraj Síč <sup>2</sup>

<sup>1</sup> Academia Sinica, Taiwan

<sup>2</sup> Brno University of Technology, Czech Republic

8 April 2024 (TACAS'24)



# String Constraint Solving

- strings are everywhere: fundamental datatype in modern PLs  
~~ reasoning about strings is crucial

# String Constraint Solving

- strings are everywhere: fundamental datatype in modern PLs  
~~ reasoning about strings is crucial
- string constraint solving
  - ▶ satisfiability of formulae over string constraints (variables over  $\Sigma^*$ )
  - ▶ various types of constraints

$$\underbrace{x = yz \wedge y \neq u}_{(dis)equations} \wedge \overbrace{x \in (ab)^* a^+ (b|c)}^{regular\ constraints} \wedge \overbrace{|x| = 2|u| + 1}^{length\ constraints} \wedge \underbrace{contains(u, replace(z, b, c))}_{more\ complex\ operations}$$

# String Constraint Solving

- strings are everywhere: fundamental datatype in modern PLs  
~~ reasoning about strings is crucial
- string constraint solving
  - ▶ satisfiability of formulae over string constraints (variables over  $\Sigma^*$ )
  - ▶ various types of constraints

$$\underbrace{x = yz \wedge y \neq u}_{(dis)equations} \wedge \overbrace{x \in (ab)^*a^+(b|c)}^{regular\ constraints} \wedge \overbrace{|x| = 2|u| + 1}^{length\ constraints} \wedge \underbrace{\text{contains}(u, \text{replace}(z, b, c))}_{more\ complex\ operations}$$

## ■ wide-ranging applications

- ▶ analysis of string manipulating programs
- ▶ vulnerabilities of web applications
- ▶ Amazon cloud access control policies

[BlakeDJ'19]

[ErikssonSDR'23]

[Rungta'22]

# String Constraint Solving

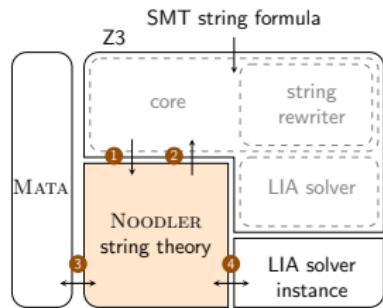
- strings are everywhere: fundamental datatype in modern PLs  
~~ reasoning about strings is crucial
- string constraint solving
  - ▶ satisfiability of formulae over string constraints (variables over  $\Sigma^*$ )
  - ▶ various types of constraints

$$\underbrace{x = yz \wedge y \neq u}_{(dis)equations} \wedge \overbrace{x \in (ab)^*a^+(b|c)}^{regular\ constraints} \wedge \overbrace{|x| = 2|u| + 1}^{length\ constraints} \wedge \underbrace{\text{contains}(u, \text{replace}(z, b, c))}_{more\ complex\ operations}$$

- wide-ranging applications
  - ▶ analysis of string manipulating programs [BlakeDJ'19]
  - ▶ vulnerabilities of web applications [ErikssonSDR'23]
  - ▶ Amazon cloud access control policies [Rungta'22]
- tool support
  - ▶ cvc5, Z3, Z3STR4, OSTRICH, **Z3-NOODLER**

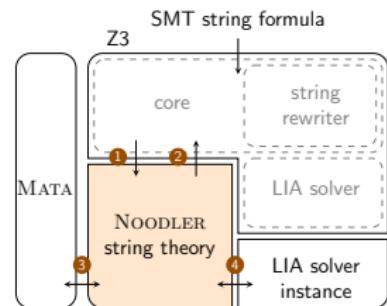
# Z3-Noodler: Highlight

- based on SMT solver Z3
  - ▶ replacement of Z3's string theory solver
  - ▶ modified string theory rewriter
  - ▶ stabilization-based decision procedure



# Z3-Noodler: Highlight

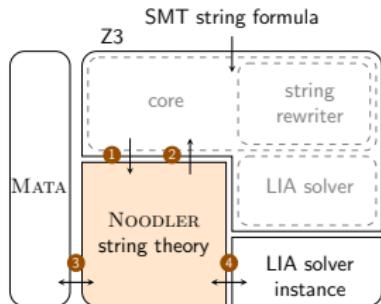
- based on SMT solver Z3
  - ▶ replacement of Z3's string theory solver
  - ▶ modified string theory rewriter
  - ▶ stabilization-based decision procedure
  
- heavily using nondeterministic finite automata
  - ▶ MATA library for efficient operations



[9 April TACAS]

# Z3-Noodler: Highlight

- based on SMT solver Z3
  - ▶ replacement of Z3's string theory solver
  - ▶ modified string theory rewriter
  - ▶ stabilization-based decision procedure

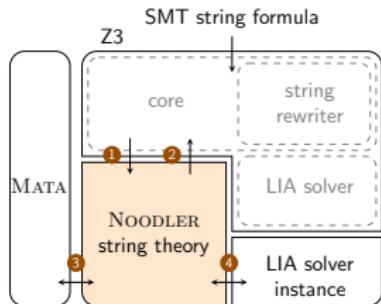


- heavily using nondeterministic finite automata
  - ▶ MATA library for efficient operations
- support of various predicate/functions defined by SMT-LIB
  - ▶ (dis)equations, length and regular constraints
  - ▶ string functions/predicates (replace, indexof, ...)
  - ▶ string conversions (since v1.1) (from\_int, to\_int, ...)

[9 April TACAS]

# Z3-Noodler: Highlight

- based on SMT solver Z3
  - ▶ replacement of Z3's string theory solver
  - ▶ modified string theory rewriter
  - ▶ stabilization-based decision procedure



- heavily using nondeterministic finite automata
  - ▶ MATA library for efficient operations
- support of various predicate/functions defined by SMT-LIB
  - ▶ (dis)equations, length and regular constraints
  - ▶ string functions/predicates (replace, indexof, ...)
  - ▶ string conversions (since v1.1) (from\_int, to\_int, ...)
- good for regex-intensive and equation-intensive formulae
  - ▶ paradise for the stabilization-based procedure

[9 April TACAS]

# String Theory Core

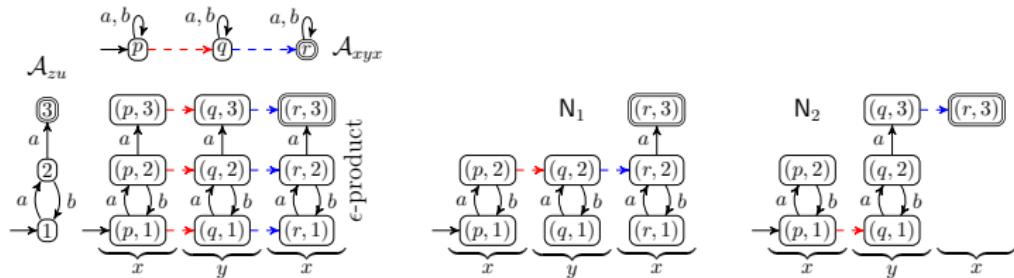
- **axiom saturation:** axioms for preds/funcs + lengths axioms
  - ▶ e.g.,  $s \notin \Sigma^* abc \Sigma^*$  for  $\neg \text{contains}(s, "abc")$ ;  $|t_1.t_2| = |t_1| + |t_2|$

# String Theory Core

- **axiom saturation**: axioms for preds/funcs + lengths axioms
  - ▶ e.g.,  $s \notin \Sigma^* abc \Sigma^*$  for  $\neg \text{contains}(s, "abc")$ ;  $|t_1.t_2| = |t_1| + |t_2|$
- **preprocessing**: transforming the string constraint to a **suitable form**

# String Theory Core

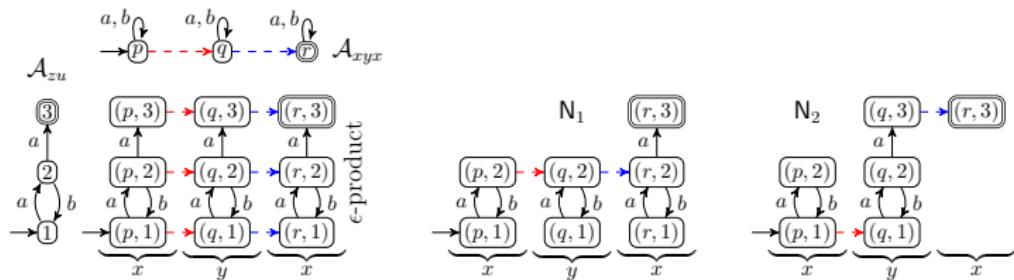
- **axiom saturation**: axioms for preds/funcs + lengths axioms
  - ▶ e.g.,  $s \notin \Sigma^* abc \Sigma^*$  for  $\neg \text{contains}(s, "abc")$ ;  $|t_1 \cdot t_2| = |t_1| + |t_2|$
- **preprocessing**: transforming the string constraint to a **suitable form**
- **stabilization-based procedure** [ChenCHHLS'23, BlahHHCLS'23]
  - ▶ iterative **refinement** of variables' languages
  - ▶ based on **noodification** of NFAs representing variable languages
  - ▶ **lazy generation** of stable solutions; complete for **chain-free fragment**



$$xyx = zu \wedge u \in (babab)^* a \wedge z \in a(ba)^*$$

# String Theory Core

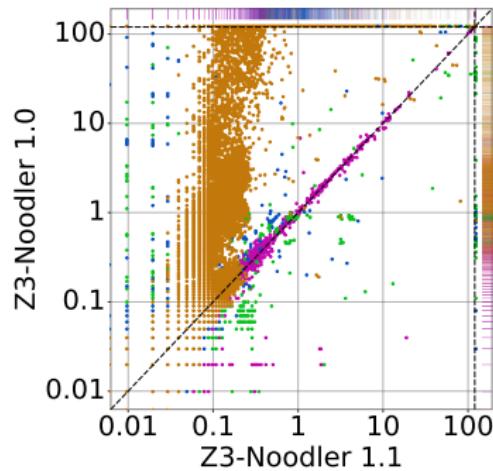
- **axiom saturation**: axioms for preds/funcs + lengths axioms
  - ▶ e.g.,  $s \notin \Sigma^* abc \Sigma^*$  for  $\neg \text{contains}(s, "abc")$ ;  $|t_1 \cdot t_2| = |t_1| + |t_2|$
- **preprocessing**: transforming the string constraint to a **suitable form**
- **stabilization-based procedure** [ChenCHHLS'23, BlahHHCLS'23]
  - ▶ iterative **refinement** of variables' languages
  - ▶ based on **noodification** of NFAs representing variable languages
  - ▶ **lazy generation** of stable solutions; complete for **chain-free fragment**



- **Nielsen transformation**
  - ▶ **Nielsen graph**  $\rightsquigarrow$  counter automaton
  - ▶ transition saturation + LIA formulae generation

# Experiments

- benchmarks from SMT-LIB
  - ▶ QF\_S (18 314)
  - ▶ QF\_SLIA (81 310)
- comparison with SOTA solvers
- comparison with **Z3-NOODLER v1.1**
  - ▶ TACAS submission = v1.0
  - ▶ various optimizations
  - ▶ support of string conversions
- timeout 120 s, memory limit 8 GiB



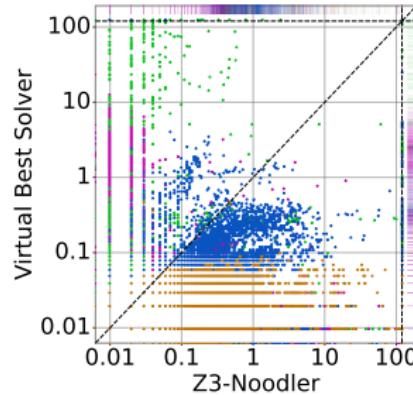
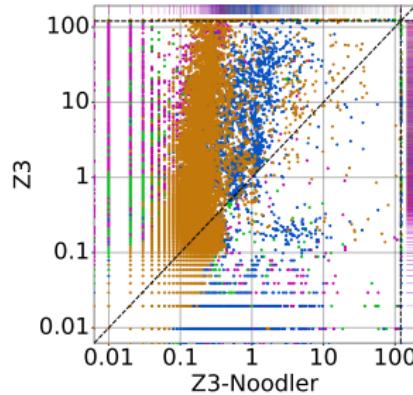
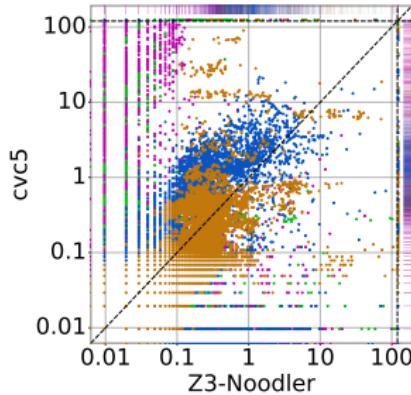
• **Regex**   • **Equations**   • **Predicates-small**   • **PyEx**

# Unsolved Instances

	Regex					Equations								Predicates-small				
	Aut	Den	StrFuzz	Syg	$\Sigma$	Kal	Kep	Norn	Silent	Slog	Web	Woo	$\Sigma$	StrInt	Leet	StrSm	$\Sigma$	PyEx
	Included	15995	999	11618	343	28955	19432	587	1027	1128	1976	365	809	25324	16968	2652	1880	21500
Unsupported	0	0	0	0	0	0	0	0	0	0	316	0	316	0	0	0	0	0
Z3-NOODLER v1.1	<b>60</b>	<b>0</b>	<b>2</b>	<b>0</b>	<b>62</b>	<b>270</b>	<b>3</b>	<b>0</b>	<b>1</b>	<b>0</b>	<b>8</b>	<b>59</b>	<b>341</b>	<b>264</b>	<b>4</b>	<b>137</b>	<b>405</b>	<b>94</b>
CVC5	93	18	703	<b>0</b>	814	<b>1</b>	240	84	24	<b>0</b>	47	54	450	<b>5</b>	<b>0</b>	<b>19</b>	<b>24</b>	<b>19</b>
Z3	125	116	537	<b>0</b>	778	284	309	124	73	31	104	<b>27</b>	952	239	<b>0</b>	59	298	987
Z3STR4	60	4	30	<b>0</b>	94	174	254	73	73	16	121	78	789	1102	4	60	1166	570
OSTRICH	<b>48</b>	6	218	<b>0</b>	272	288	387	<b>0</b>	126	6	74	53	934	1059	27	173	1259	12833
Z3STR3RE	66	27	185	1	279	144	311	133	87	55	192	118	1040	3231	192	259	3682	17764
Z3-NOODLER <sup>OOPSLA</sup>	86	1	1982	<b>0</b>	2069	508	575	<b>0</b>	6	<b>0</b>	45	256	1390	1627	29	692	2348	13362

- best values in **bold**
- Z3-NOODLER **outperforms** others on **Equations** and **Regex**
- support for `replace_all` is in making

# Running Times



- fast on **Equations** and **Regex** (even if compared to VBS)
- often **complementary** to other solvers
- great in a **solver portfolio**

• **Regex**   • **Equations**   • **Predicates-small**   • **PyEx**

# Conclusion

- string solver Z3-NOODLER based on Z3
- combination of procedures; the stabilization-based procedure
- heavily using nondet. finite automata (MATA) [9 April TACAS]
- fast on equation and regex intensive benchmarks
- Github repo: <https://github.com/VeriFIT/z3-noodler>
- **see the poster**

# Conclusion

- string solver Z3-NOODLER based on Z3
- combination of procedures; the stabilization-based procedure
- heavily using nondet. finite automata (MATA) [9 April TACAS]
- fast on equation and regex intensive benchmarks
- Github repo: <https://github.com/VeriFIT/z3-noodler>
- see the poster

## Future work

- support of `replace_all` WIP
- model generation WIP
- extended support of `¬contains`

# Conclusion

- string solver Z3-NOODLER based on Z3
- combination of procedures; the stabilization-based procedure
- heavily using nondet. finite automata (MATA) [9 April TACAS]
- fast on equation and regex intensive benchmarks
- Github repo: <https://github.com/VeriFIT/z3-noodler>
- see the poster

## Future work

- support of replace\_all WIP
- model generation WIP
- extended support of  $\neg$ contains

Thank You!