

Z3-Noodler - An Automata based String Solver

Theory and Practice of SMT Solving

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- ▶ String theory solver replaced by *Noodler*
 - ▶ *Stabilization-based procedure*
 - ▶ Heavy usage of *non deterministic automata*

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- ▶ Very efficient and optimized

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 - ▶ Some rewriting steps are removed

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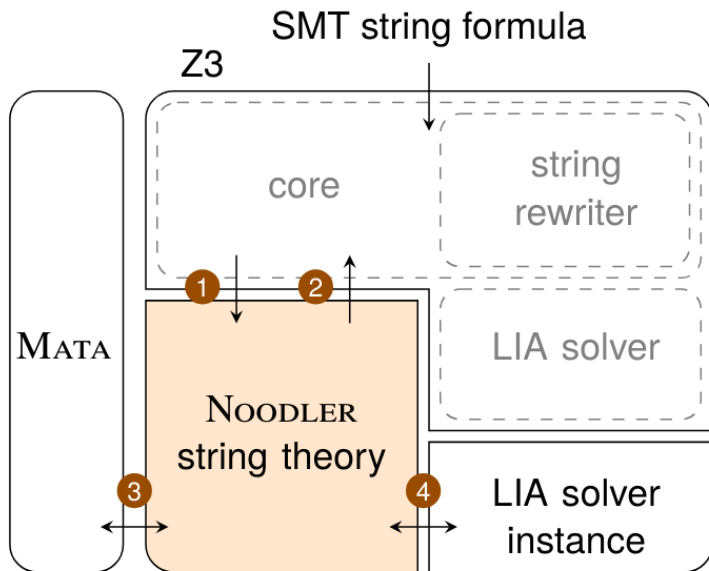


Figure 1: Z3-Noodler architecture

String Theory Core

- ▶ Axiom Saturation

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- ▶ $t_1 = t_2 \implies len(t_1) = len(t_2)$

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- ▶ $\neg \text{contains}(s, "abc")$ becomes $s \notin \Sigma^* abc \Sigma^*$

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- ▶ Regular constraints enforce *UNSAT*

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- ▶ After stability, length constraints are added and fed to the LIA solver

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- ▶ $xy = zw \wedge \text{len}(x) = \text{len}(z) \implies y = w$

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- ▶ Don't support *replace_all* and *to/from_int*
- ▶ Z3-Noodler is complete for the chain-free fragment with unbounded disequations and regular constraints, and for quadratic equations
- ▶ Outside of this, the theory is sound but not complete

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- ▶ The same happens in the *Equations* group
- ▶ cvc5 is the best one in *Predicates Small*, while Z3-Noodler performed poorly
- ▶ Z3-Noodler could, however, be further improved by proper axiom saturation for predicates or lazy predicate evaluation

The end

► Thanks!