

A First Decision Procedure for Almost-Sure Termination of Probabilistic Term Rewriting

Jan-Christoph Kassing^{*1}, Arion Scheid^{*2}, Henri Nagel^{*1}, and Jürgen Giesl^{*1}

^{*1} RWTH Aachen University, ^{*2} TU Vienna

VeriProb Workshop 2026

Term Rewrite Systems (TRS)

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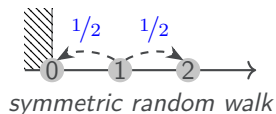
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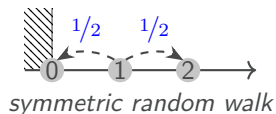


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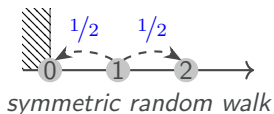


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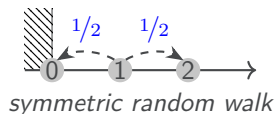


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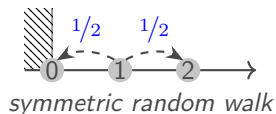


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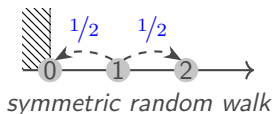
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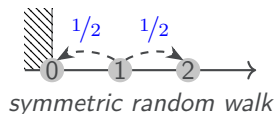
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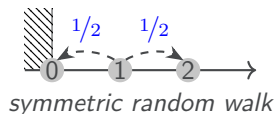
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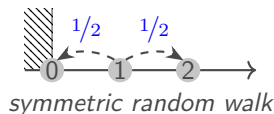
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This Talk $\implies$ first decision procedure for AST of a non-trivial class of PTRSs.

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We need a *stochastic model* that *counts recursive calls*: **SCFGs**.

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SCFG

An SCFG $\mathcal{G} = (N, T, P)$ has:

- ▶ a set of non-terminals N
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- ▶ production rules $P : N \times (N \cup T)^* \rightarrow [0, 1]$ with $\sum_{\pi} P(A, \pi) = 1$ for each $A \in N$

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$$A \xrightarrow{2/3} AA \qquad A \xrightarrow{1/3} \varepsilon$$

$$N = \{A\}, \quad T = \emptyset$$

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- ▶ a set of non-terminals N
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AST is **decidable** for SCFGs
[Etessami & Yannakakis'09]

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Step 1: Productivity

Productive SCFG

$\mathcal{G}$ is *productive* if every non-terminal $A \in N$ can reach a terminal word, i.e. $1 : A \Rightarrow_{\mathcal{G}}^* p : \alpha$ with $\alpha \in T^*$.

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But productivity is **not enough**: the productive $A \xrightarrow{2/3} AA$, $A \xrightarrow{1/3} \varepsilon$ reaches ε (but is **not AST**).

We must **count** how many non-terminals each step creates.

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Moment matrix $B_{\mathcal{G}}$: entry $(B_{\mathcal{G}})_{i,j}$ = expected number of S_j created from S_i ($N = \{S_1, \dots, S_k\}$)

$$(B_{\mathcal{G}})_{i,j} = \sum_{S_i \xrightarrow{p} \alpha \in P} p \cdot |\alpha|_{S_j}$$

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$(B_G)_{1,1}$: one A in two A-rules $\Rightarrow 1/3 \cdot 1 + 1/3 \cdot 1 = 2/3$

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$(B_G)_{1,2}$: one **B** in A's rules $\Rightarrow 1/3 \cdot 1 = 1/3$

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$$\rho(B_{\mathcal{G}}) = \frac{2+\sqrt{10}}{6} \approx 0.86 \leq 1 \Rightarrow \mathcal{G} \text{ is AST}$$

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GNT

GNT = **G**round + **N**on-**O**verlapping + **T**ail-**R**ecursive

Extracting the Grammar $\mathcal{T}_{\text{gram}}(\mathcal{P})$

Keep only non-terminals $N = lhs(\mathcal{P}) = \{\mathbf{f(a)}, \mathbf{f(b)}, \mathbf{g}\}$, $T = \emptyset$.

$$\mathbf{f(a)} \rightarrow \{1/3 : \mathbf{c(g, c(f(a), f(b)))}, 2/3 : \mathbf{c(a, b)}\}$$

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Lemma

For $\mathcal{P} \in \text{GNT}$: $\mathcal{P}$ is AST $\iff \mathcal{T}_{\text{gram}}(\mathcal{P})$ is AST.

The Transformation $\mathcal{T}_{\text{GNT}} : \text{RNT} \rightarrow \text{GNT}$

RNT

RNT = all PTRSs that are **R**ight-ground, **N**on-**O**verlapping, and **T**ail-**R**ecursive.

$\text{GNT} \subseteq \text{RNT}$

Idea: create one ground copy of each rule per relevant instance:

$$\mathcal{T}_{\text{GNT}}(\mathcal{P}) = \{ t \rightarrow \mu \mid t \in \text{instLhs}(\mathcal{P}), \ell \rightarrow \mu \in \mathcal{P}, t = \ell\sigma \}.$$

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Lemma

For $\mathcal{P} \in \text{RNT}$: $\mathcal{T}_{\text{GNT}}(\mathcal{P}) \in \text{GNT}$ and $\mathcal{P}$ is AST $\iff \mathcal{T}_{\text{GNT}}(\mathcal{P})$ is AST.

The Complete Decision Procedure for RNT

Theorem

AST is **decidable** for $\mathcal{P} \in \mathbf{RNT}$



Evaluation

Implemented in [AProVE](#), run on the 173 probabilistic TRSs of the *Termination Problem Data Base*.



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- ▶ First decision procedure for AST of a non-trivial class of PTRSs.
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Open Problems

- ▶ Can we drop *non-overlappingness* (deal with non-determinism)?
- ▶ Can we drop *tail-recursiveness* (deal with unbounded memory)?
- ▶ Decision procedures for *PAST* and expected complexity?

Why Term Rewriting in Program Analysis?

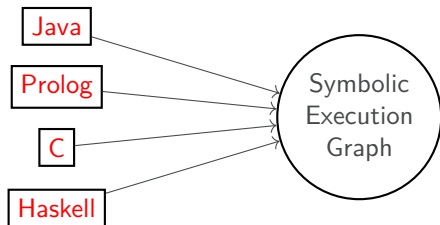
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Prolog

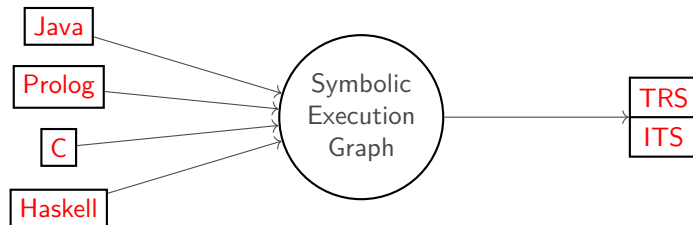
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Haskell

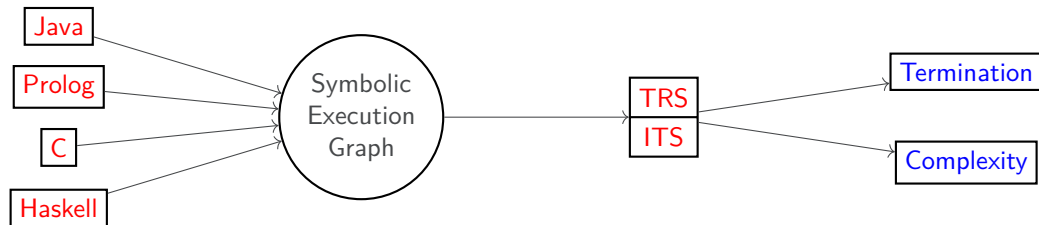
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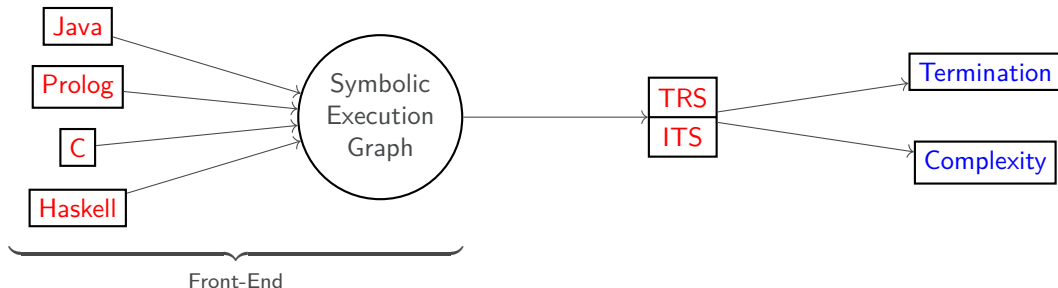
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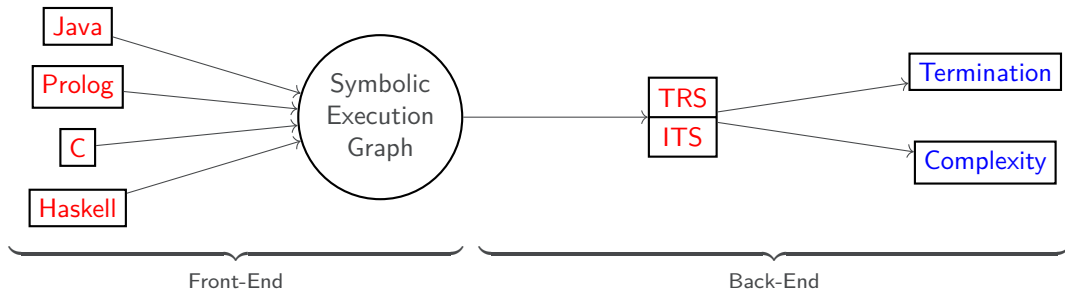
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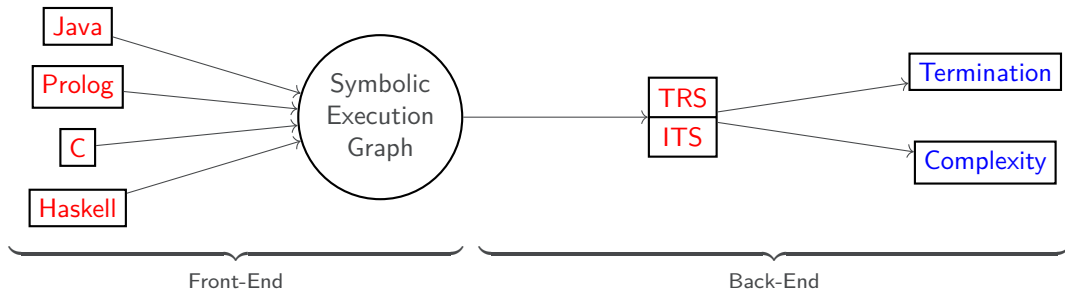
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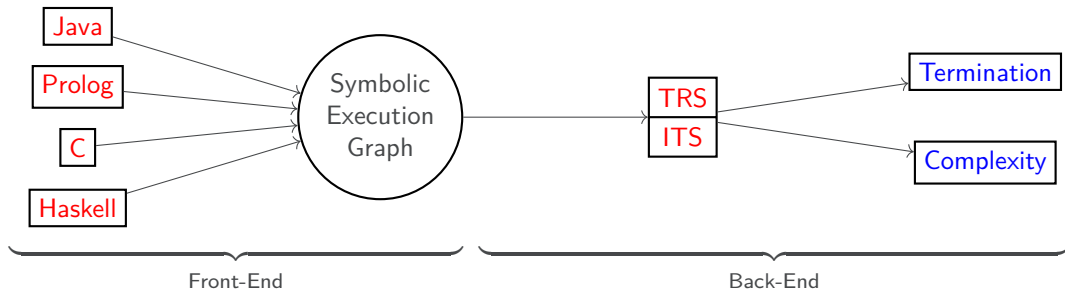


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- ▶ **Term Rewrite Systems (TRSs)** in the back-end for automated program analysis (used in **AProVE**, at the *Termination Competition* since 2004)
- ▶ **This talk:** randomized programs $\rightsquigarrow$ **Probabilistic TRSs**

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Deciding AST for an SCFG $\mathcal{G}$

1. $\mathcal{G}$ productive? No $\rightarrow$ **Reject**, Yes $\rightarrow$ go on.
2. $\rho(B_{\mathcal{G}}) > 1$? Yes $\rightarrow$ **Reject**, No $\rightarrow$ **Accept**.