Automated Termination Analysis for Haskell: From Term Rewriting to Programming Languages*

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Abstract. There are many powerful techniques for automated termination analysis of term rewriting. However, up to now they have hardly been used for real programming languages. We present a new approach which permits the application of existing techniques from term rewriting in order to prove termination of programs in the functional language Haskell. In particular, we show how termination techniques for ordinary rewriting can be used to handle those features of Haskell which are missing in term rewriting (e.g., lazy evaluation, polymorphic types, and higher-order functions). We implemented our results in the termination prover AProVE and successfully evaluated them on existing Haskell-libraries.

1 Introduction

We show that termination techniques for term rewrite systems (TRSs) are also useful for termination analysis of programming languages like Haskell. Of course, any program can be translated into a TRS, but in general, it is not obvious how to obtain TRSs suitable for existing automated termination techniques. Adapting TRS-techniques for termination of Haskell is challenging for the following reasons:

- Haskell has a *lazy evaluation* strategy. However, most TRS-techniques ignore such evaluation strategies and try to prove that *all* reductions terminate.
- Defining equations in Haskell are handled from top to bottom. In contrast for TRSs, *any* rule may be used for rewriting.
- Haskell has polymorphic types, whereas TRSs are untyped.
- In Haskell-programs with infinite data objects, only certain functions are terminating. But most TRS-methods try to prove termination of *all* terms.
- Haskell is a *higher-order* language, whereas most automatic termination techniques for TRSs only handle first-order rewriting.

There are only few techniques for automated termination analysis of functional programs. Methods for first-order languages with strict evaluation strategy were developed in [5,10,16]. For higher-order languages, [1,3,17] study how to ensure termination by typing and [15] defines a restricted language where all evaluations terminate. A successful approach for automated termination proofs for a small Haskell-like language was developed in [11]. (A related technique is [4], which handles outermost evaluation of untyped first-order rewriting.) How-

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ever, these are all "stand-alone" methods which do not allow the use of modern termination techniques from term rewriting. In our approach we build upon the method of [11], but we adapt it in order to make TRS-techniques applicable.¹

We recapitulate Haskell in Sect. 2 and introduce our notion of "termination". To analyze termination, our method first generates a corresponding termination graph (similar to the "termination tableaux" in [11]), cf. Sect. 3. But in contrast to [11], then our method transforms the termination graph into dependency pair problems which can be handled by existing techniques from term rewriting (Sect. 4). Our approach in Sect. 4 can deal with any termination graph, whereas [11] can only handle termination graphs of a special form ("without crossings"). We implemented our technique in the termination prover AProVE [9], cf. Sect. 5.

2 Haskell

We now give the syntax and semantics for a subset of Haskell which only uses certain easy patterns and terms (without " λ "), and function definitions without conditions. Any Haskell-program (without type classes and built-in data structures)² can automatically be transformed into a program from this subset [14].³ For example, in our implementation lambda abstractions are removed by replacing every Haskell-term " $t_1...t_n \to t$ " with the free variables $t_1, ..., t_m$ by "f $t_1...t_m$ ". Here, f is a new function symbol with the defining equation f $t_1...t_m = t$.

2.1 Syntax of Haskell

In our subset of Haskell, we only permit user-defined data structures such as

data Nats =
$$Z \mid S$$
 Nats data List $a = Nil \mid Cons \ a$ (List a)

These data-declarations introduce two type constructors Nats and List of arity 0 and 1, respectively. So Nats is a type and for every type τ , "List τ " is also a type representing lists with elements of type τ . Moreover, there is a pre-defined binary type constructor \to for function types. Since Haskell's type system is polymorphic, it also has type variables like a which stand for any type.

For each type constructor like Nats, a data-declaration also introduces its *data* constructors (e.g., Z and S) and the types of their arguments. Thus, Z has arity 0 and is of type Nats and S has arity 1 and is of type Nats \rightarrow Nats.

Apart from data-declarations, a program has function declarations. Here, "from x" generates the infinite list of numbers starting with x and "take n xs" returns the first n elements of xs. The type of from is "List Nats" and take has type "Nats \rightarrow (List a) \rightarrow (List a)" where $\tau_1 \rightarrow \tau_2 \rightarrow \tau_3$ stands for $\tau_1 \rightarrow (\tau_2 \rightarrow \tau_3)$.

¹ Alternatively, one could simulate Haskell's evaluation strategy by *context-sensitive* rewriting (CSR), cf. [6]. But termination of CSR is hard to analyze automatically.

² See Sect. 5 for an extension to type classes and pre-defined data structures.

³ Of course, it would be possible to restrict ourselves to programs from an even smaller "core"-Haskell subset. However, this would not simplify the subsequent termination analysis any further. In contrast, the resulting programs would usually be less readable, which would make interactive termination proofs harder.

$$\begin{aligned} \operatorname{from} x &= \operatorname{Cons} x \left(\operatorname{from} \left(\operatorname{S} x \right) \right) & \operatorname{take} \operatorname{Z} xs &= \operatorname{NiI} \\ \operatorname{take} n \operatorname{NiI} &= \operatorname{NiI} \\ \operatorname{take} \left(\operatorname{S} n \right) \left(\operatorname{Cons} x \, xs \right) &= \operatorname{Cons} x \left(\operatorname{take} n \, xs \right) \end{aligned}$$

In general, function declarations have the form " $f \ell_1 \dots \ell_n = r$ ". The function symbols f on the "outermost" position of left-hand sides are called *defined*. So the set of function symbols is the disjoint union of the (data) constructors and the defined function symbols. All defining equations for f must have the same number of arguments n (called f's arity). The right-hand side r is an arbitrary term, whereas ℓ_1, \ldots, ℓ_n are special terms, so-called *patterns*. Moreover, the left-hand side must be linear, i.e., no variable may occur more than once in " $f \ell_1 \dots \ell_n$ ".

The set of terms is the smallest set containing all variables, function symbols, and well-typed applications $(t_1 t_2)$ for terms t_1 and t_2 . As usual, " $t_1 t_2 t_3$ " stands for " $((t_1 t_2) t_3)$ ". The set of patterns is the smallest set with all variables and terms " $c t_1 \dots t_n$ " where c is a constructor of arity n and t_1, \dots, t_n are patterns.

The positions of t are $Pos(t) = \{\varepsilon\}$ if t is a variable or function symbol. Otherwise, $Pos(t_1 t_2) = \{\varepsilon\} \cup \{1 \pi \mid \pi \in Pos(t_1)\} \cup \{2 \pi \mid \pi \in Pos(t_2)\}$. As usual, we define $t|_{\varepsilon} = t$ and $(t_1 t_2)|_{t_{\pi}} = t_i|_{\pi}$. The head of t is $t|_{1^n}$ where n is the maximal number with $1^n \in Pos(t)$. So the head of $t = \mathsf{take} \, n \, xs$ (i.e., "(take n) xs") is $t|_{11} = \mathsf{take}$.

2.2Operational Semantics of Haskell

Given an underlying program, for any term t we define the position $\mathbf{e}(t)$ where the next evaluation step has to take place due to Haskell's outermost strategy. So in most cases, $\mathbf{e}(t)$ is the top position ε . An exception are terms " $f t_1 \dots t_n t_{n+1} \dots t_m$ " where arity(f) = n and m > n. Here, f is applied to too many arguments. Thus, one considers the subterm " $f t_1 \dots t_n$ " at position 1^{m-n} to find the evaluation position. The other exception is when one has to evaluate a subterm of $f t_1 \dots t_n$ in order to check whether a defining f-equation $\ell = r$ will then become applicable on top position. We say that an equation $\ell = r$ from the program is feasible for a term t and define the corresponding evaluation position $\mathbf{e}_{\ell}(t)$ w.r.t. ℓ if either

- (a) ℓ matches t (then we define $\mathbf{e}_{\ell}(t) = \varepsilon$),
- (b) for the leftmost outermost position π where head($\ell|_{\pi}$) is a constructor and where $\operatorname{head}(\ell|\pi) \neq \operatorname{head}(t|\pi)$, the symbol $\operatorname{head}(t|\pi)$ is defined or a variable. Then $\mathbf{e}_{\ell}(t) = \pi$.

Since Haskell considers the order of the program's equations, t is evaluated below the top (on position $\mathbf{e}_{\ell}(t)$) whenever (b) holds for the first feasible equation $\ell = r$ (even if an evaluation with a subsequent defining equation would be possible at top position). Thus, this is no ordinary leftmost outermost evaluation strategy.

Definition 1 (Evaluation Position e(t)). For any term t, we define

$$\mathbf{e}(t) = \begin{cases} 1^{m-n} \ \pi, & \text{if } t = f \ t_1 \dots t_n \ t_{n+1} \dots t_m, \ f \ \text{is defined, } m > n = \text{arity}(f), \\ & \text{and } \pi = \mathbf{e}(f \ t_1 \dots t_n) \\ \mathbf{e}_{\ell}(t) \ \pi, & \text{if } t = f \ t_1 \dots t_n, \ f \ \text{is defined, } n = \text{arity}(f), \ \text{there are feasible} \\ & \text{equations for } t \ (\text{the first is "$\ell = r$"}), \ \mathbf{e}_{\ell}(t) \neq \varepsilon, \ \text{and } \pi = \mathbf{e}(t|_{\mathbf{e}_{\ell}(t)}) \\ \varepsilon, & \text{otherwise} \end{cases}$$

If $t = \mathsf{take}\,u\,(\mathsf{from}\,m)$ and $s = \mathsf{take}\,(\mathsf{S}\,n)\,(\mathsf{from}\,m)$, then $t|_{\mathbf{e}(t)} = u$ and $s|_{\mathbf{e}(s)} = \mathsf{from}\,m$.

We now present Haskell's operational semantics by defining the evaluation relation \to_H . For any term t, it performs a rewrite step on position $\mathbf{e}(t)$ using the first applicable defining equation of the program. So terms like "x Z" or "take Z" are normal forms: If the head of t is a variable or if a symbol is applied to too few arguments, then $\mathbf{e}(t) = \varepsilon$ and no rule rewrites t at top position. Moreover, a term $s = f \ s_1 \dots s_m$ with a defined symbol f and $m \ge \operatorname{arity}(f)$ is a normal form if no equation in the program is feasible for s. If head($s|_{\mathbf{e}(s)}$) is a defined symbol g, then we call s an error term (i.e., then g is not "completely" defined).

For terms t=c $t_1 \dots t_n$ with a constructor c of arity n, we also have $\mathbf{e}(t)=\varepsilon$ and no rule rewrites t at top position. However, here we permit rewrite steps below the top, i.e., t_1, \dots, t_n may be evaluated with \to_{H} . This corresponds to the behavior of Haskell-interpreters like Hugs which evaluate terms until they can be displayed as a string. To transform data objects into strings, Hugs uses a function "show". This function can be generated automatically for user-defined types by adding "deriving Show" behind the data-declarations. This show-function would transform every data object "c $t_1 \dots t_n$ " into the string consisting of "c" and of show $t_1, \dots,$ show t_n . Thus, show would require that all arguments of a term with a constructor head have to be evaluated.

Definition 2 (Evaluation Relation \rightarrow_H). We have $t \rightarrow_H s$ iff either

- (1) t rewrites to s on the position $\mathbf{e}(t)$ using the first equation of the program whose left-hand side matches $t|_{\mathbf{e}(t)}$, or
- (2) $t = c \ t_1 \dots t_n$ for a constructor c of arity $n, \ t_i \to_H s_i$ for some $1 \le i \le n$, and $s = c \ t_1 \dots t_{i-1} \ s_i \ t_{i+1} \dots t_n$

For example, we have the infinite evaluation $\operatorname{from} m \to_{\mathsf{H}} \operatorname{Cons} m (\operatorname{from} (\mathsf{S} \, m)) \to_{\mathsf{H}} \ldots \operatorname{On} \operatorname{the} \operatorname{other} \operatorname{hand}$, the following evaluation is finite: $\operatorname{take}(\mathsf{S}\,\mathsf{Z}) (\operatorname{from} m) \to_{\mathsf{H}} \operatorname{take}(\mathsf{S}\,\mathsf{Z}) (\operatorname{Cons} m (\operatorname{from} (\mathsf{S} \, m))) \to_{\mathsf{H}} \operatorname{Cons} m (\operatorname{take}\,\mathsf{Z} (\operatorname{from} (\mathsf{S} \, m))) \to_{\mathsf{H}} \operatorname{Cons} m \operatorname{Nil}.$

The reason for permitting non-ground terms in Def. 1 and 2 is that our termination method in Sect. 3 evaluates Haskell *symbolically*. Here, variables stand for arbitrary *terminating* terms. Def. 3 introduces our notion of termination.

Definition 3 (H-Termination). A ground term t is H-terminating iff

- (a) t does not start an infinite evaluation $t \rightarrow_{\mathsf{H}} \ldots$,
- (b) if t →_H* (f t₁...t_n) for a defined function symbol f, n < arity(f), and the term t' is H-terminating, then (f t₁...t_nt') is also H-terminating, and
 (c) if t→_H* (c t₁...t_n) for a constructor c, then t₁,..., t_n are also H-terminating.

A term t is H-terminating iff to is H-terminating for all substitutions σ with H-terminating ground terms (of the correct types). These substitutions σ may also introduce new defined function symbols with arbitrary defining equations.

So a term is only H-terminating if all its applications to H-terminating terms H-terminate, too. Thus, "from" is not H-terminating, as "from Z" has an infinite evaluation. But "take u (from m)" is H-terminating: when instantiating u and m by H-terminating ground terms, the resulting term has no infinite evaluation.

To illustrate that one may have to add defining equations to examine H-termination, consider the function nonterm of type $Bool \rightarrow (Bool \rightarrow Bool) \rightarrow Bool$:

nonterm True
$$x = \text{True}$$
 nonterm False $x = \text{nonterm}(x \text{ True}) x$ (1)

The term "nonterm False x" is not H-terminating: one obtains an infinite evaluation if one instantiates x by the function mapping all arguments to False. In full Haskell, such functions can of course be represented by lambda terms and indeed, "nonterm False ($y \to \text{False}$)" starts an infinite evaluation.

3 From Haskell to Termination Graphs

Our goal is to prove H-termination of a start term t. By Def. 3, H-termination of t implies that $t\sigma$ is H-terminating for all substitutions σ with H-terminating ground terms. Thus, t represents a (usually infinite) set of terms and we want to prove that they are all H-terminating. Without loss of generality, we can restrict ourselves to normal ground substitutions σ , i.e., substitutions where $\sigma(x)$ is a ground term in normal form w.r.t. \to_H for all variables x in t.

Regard the start term $t = \mathsf{take}\,u\,(\mathsf{from}\,m)$. A naive approach would be to consider the defining equations of all needed functions (i.e., take and from) as rewrite rules. However, this disregards Haskell's lazy evaluation strategy. So due to the non-terminating rule for "from", we would fail to prove H-termination of t.

Therefore, our approach starts evaluating the start term a few steps. This gives rise to a so-called *termination graph*. Instead of transforming defining Haskell-equations into rewrite rules, we then transform the termination graph into rewrite rules. The advantage is that the initial evaluation steps in this graph take the evaluation strategy and the types of Haskell into account and therefore, this is also reflected in the resulting rewrite rules.

To construct a termination graph for the start term t, we begin with the graph containing only one single node, marked with t. Similar to [11], we then apply expansion rules repeatedly to the leaves of the graph in order to extend it by new nodes and edges. As usual, a leaf is a node with no outgoing edges. We have obtained a termination graph for t if no expansion rules is applicable to its leaves anymore. Afterwards, we try to prove H-termination of all terms occurring in the termination graph, cf. Sect. 4. We now describe our five expansion rules intuitively using Fig. 1. Their formal definition is given in Def. 4.

When constructing termination graphs, the goal is to evaluate terms. How-ever, t = take u (from m) cannot be evaluated with \rightarrow_{H} , since it has a variable u on its evaluation position $\mathbf{e}(t)$. The evaluation can only continue if we know how u is going to be instantiated. Therefore, the first expansion

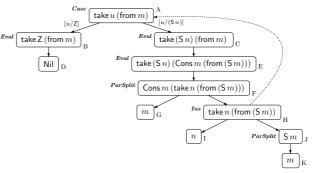


Fig. 1. Termination graph for "take u (from m)"

rule is called $Case\ Analysis\$ (or "Case", for short). It adds new child nodes where u is replaced by all terms of the form $(c\ x_1\dots x_n)$. Here, c is a constructor of the appropriate type and x_1,\dots,x_n are fresh variables. The edges to these children are labelled with the respective substitutions $[u/(c\ x_1\dots x_n)]$. In our example, u is a variable of type Nats. Therefore, the Case-rule adds two child nodes B and C to our initial node A, where u is instantiated by Z and by $(S\ n)$, respectively. Since the children of A were generated by the Case-rule, we call A a "Case-node". Every node in the graph has the following property: If all its children are marked with H-terminating terms, then the node itself is also marked by a H-terminating term. Indeed, if the terms in nodes B and C are H-terminating, then the term in node A is H-terminating as well.

Now the terms in nodes B and C can indeed be evaluated. Therefore, the **Evaluation**-rule ("**Eval**") adds the nodes D and E resulting from one evaluation step with \rightarrow_H . Moreover, E is also an **Eval**-node, since its term can be evaluated further to the term in node F. So the **Case**- and **Eval**-rule perform a form of narrowing that respects the evaluation strategy and the types of Haskell.

The term Nil in node D cannot be evaluated and therefore, D is a leaf of the termination graph. But the term " $\mathsf{Cons}\,m\,(\mathsf{take}\,n\,(\mathsf{from}\,(\mathsf{S}\,m)))$ " in node F may be evaluated further. Whenever the head of a term is a constructor like Cons or a variable, then evaluations can only take place on its arguments. We use a $\mathsf{Parameter}\,\mathsf{Split}$ -rule (" $\mathsf{ParSplit}$ ") which adds new child nodes with the arguments of such terms. Thus, we obtain the nodes G and H. Again, H-termination of the terms in G and H obviously implies H-termination of the term in node F.

The node G remains a leaf since its term m cannot be evaluated further for any normal ground instantiation. For node H, we could continue by applying the rules Case, Eval, and ParSplit as before. However, in order to obtain finite graphs (instead of infinite trees), we also have an Instantiation-rule ("Ins"). Since the term in node H is an instance of the term in node A, one can draw an instantiation edge from the instantiated term to the more general term (i.e., from H to A). We depict instantiation edges by dashed lines. These are the only edges which may point to already existing nodes (i.e., one obtains a tree if one removes the instantiation edges from a termination graph).

To guarantee that the term in node H is H-terminating whenever the terms in its child nodes are H-terminating, the Ins-rule has to ensure that one only uses instantiations with H-terminating terms. In our example, the variables u and m of node A are instantiated with the terms n and (Sm), respectively. Therefore, in addition to the child A, the node H gets two more children I and J marked with n and (Sm). Finally, the ParSplit-rule adds J's child K, marked with m.

Now we consider a different start term, viz. "take". If a defined function has "too few" arguments, then by Def. 3 we have to apply it to additional H-terminating arguments in order to examine H-termination. Therefore, we have a *Variable Expansion*-rule ("*VarExp*") which would add a child marked with "take x" for a fresh variable x. Another application of *VarExp* gives "take x xs". The remaining termination graph is constructed by the rules discussed before.

⁴ The reason is that " $x t_1 \dots t_n$ " H-terminates iff the terms t_1, \dots, t_n H-terminate.

Definition 4 (Termination Graph). Let G be a graph with a leaf marked with the term t. We say that G can be expanded to G' (denoted " $G \Rightarrow G'$ ") if G' results from G by adding new **child** nodes marked with the elements of **ch**(t) and by adding edges from t to each element of **ch**(t). Only in the **Ins**-rule, we also permit to add an edge to an already existing node, which may then lead to cycles. All edges are marked by the identity substitution unless stated otherwise.

Eval: $\mathbf{ch}(t) = \{\tilde{t}\}, \text{ if } t = (f t_1 \dots t_n), f \text{ is a defined symbol, } n \geq \operatorname{arity}(f), t \rightarrow_{\mathsf{H}} \tilde{t}$ **Case:** $\mathbf{ch}(t) = \{t\sigma_1, \dots, t\sigma_k\}, \text{ if } t = (f t_1 \dots t_n), f \text{ is a defined function symbol,}$ $n \geq \operatorname{arity}(f), t|_{\mathbf{e}(t)} \text{ is a variable } x \text{ of type "d} \tau_1 \dots \tau_m \text{" for a type constructor } d,$ the type constructor d has the data constructors c_i of arity n_i (where $1 \leq i \leq k$), and $\sigma_i = [x/(c_i x_1 \dots x_{n_i})]$ for fresh pairwise different variables x_1, \dots, x_{n_i} . The edge from t to $t\sigma_i$ is marked with the substitution σ_i .

<u>VarExp:</u> $\mathbf{ch}(t) = \{t \, x\}, \text{ if } t = (f \, t_1 \dots t_n), f \text{ is a defined function symbol,}$ $n < \operatorname{arity}(f), x \text{ is a fresh variable}$

ParSplit: $\mathbf{ch}(t) = \{t_1, ..., t_n\}$ if $t = (c t_1 ... t_n)$, c is a constructor or variable, n > 0Ins: $\mathbf{ch}(t) = \{s_1, ..., s_m, \tilde{t}\}$, if $t = (f t_1 ... t_n)$, t is not an error term, f is a defined symbol, $n \ge \operatorname{arity}(f)$, $t = \tilde{t}\sigma$ for some term \tilde{t} , $\sigma = [x_1/s_1, ..., x_m/s_m]$.

Moreover, either $\tilde{t} = (x y)$ for fresh variables x and y, or \tilde{t} is an Eval-node, or \tilde{t} is a Case-node and all paths starting in \tilde{t} reach an Eval-node or a leaf with an error term after traversing only Case-nodes. The edge from t to \tilde{t} is called an instantiation edge.

If the graph already contained a node marked with \tilde{t} , then we permit to reuse this node in the **Ins**-rule. So in this case, instead of adding a new child marked with \tilde{t} , one may add an edge from t to the already existing node \tilde{t} .

Let G_t be the graph with a single node marked with t and no edges. G is a termination graph for t iff $G_t \Rightarrow^* G$ and G is in normal form $w.r.t. \Rightarrow$.

If one disregards Ins, then for each leaf there is at most one rule applicable. However, the Ins-rule introduces indeterminism. Instead of applying the Case-rule on node A in Fig. 1, we could also apply Ins and generate an instantiation edge to a new node with $\tilde{t}=(\mathsf{take}\,u\,ys)$. Since the instantiation is $[ys/(\mathsf{from}\,m)]$, node A would get an additional child node marked with the non-H-terminating term ($\mathsf{from}\,m$). Then our approach in Sect. 4 which tries to prove H-termination of all terms in the termination graph would fail, whereas it succeeds for the graph in Fig. 1. Therefore, in our implementation we developed a heuristic for constructing termination graphs which tries to avoid unnecessary applications of Ins (since applying Ins means that one has to prove H-termination of more terms).

An instantiation edge to $\tilde{t} = (xy)$ is needed to get termination graphs for functions like tma which are applied to "too many" arguments in recursive calls.

$$\mathsf{tma}\,(\mathsf{S}\,m) = \mathsf{tma}\,m\,m \tag{2}$$

⁵ This ensures that every cycle of the graph contains at least one *Eval*-node.

 $^{^{6}}$ No rule is applicable to leaves with variables, constructors of arity 0, or error terms.

Here, tma has the type Nats $\to a$. We obtain the termination graph in Fig. 2. After applying Case and Eval, we result in "tma m m" in node D which is not an instance of the start term "tma n" in node A. Of course, we could continue with

Case and Eval infinitely often, but to obtain a termination graph, at some point we need to apply the Ins-rule. Here, the only possibility is to regard $t = (\operatorname{tma} m \, m)$ as an instance of the term $\tilde{t} = (x \, y)$. Thus, we obtain an instantiation edge to the new node E. As the instantiation is $[x/(\operatorname{tma} m), y/m]$, we get additional child nodes F and G marked with "tma m" and m, respectively. Now we can "close" the graph, since "tma m" is an instance of the start term "tma n" in node A. So the

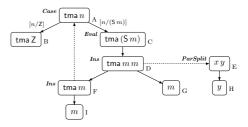


Fig. 2. Termination graph for "tma n"

instantiation edge to the special term (xy) is used to remove "superfluous" arguments (i.e., it permits to go from "tmamm" in node D to "tmam" in node F). Thm. 5 shows that by the expansion rules of Def. 4 one can always obtain normal forms.⁷

Theorem 5 (Existence of Termination Graphs). The relation \Rightarrow is normalizing, i.e., for any term t there exists a termination graph.

4 From Termination Graphs to DP Problems

Now we present a method to prove H-termination of all terms in a termination graph. To this end, we want to use existing techniques for termination analysis of term rewriting. One of the most popular techniques for TRSs is the dependency pair (DP) method [2]. In particular, the DP method can be formulated as a general framework which permits the integration and combination of any termination technique for TRSs [7]. This DP framework operates on so-called DP problems $(\mathcal{P}, \mathcal{R})$. Here, \mathcal{P} and \mathcal{R} are TRSs that may also have rules $\ell \to r$ where r contains extra variables not occurring in ℓ . \mathcal{P} 's rules are called dependency pairs. The goal of the DP framework is to show that there is no infinite chain, i.e., no infinite reduction $s_1\sigma_1 \to_{\mathcal{P}} t_1\sigma_1 \to_{\mathcal{R}}^* s_2\sigma_2 \to_{\mathcal{P}} t_2\sigma_2 \to_{\mathcal{R}}^* \dots$ where $s_i \to t_i \in \mathcal{P}$ and σ_i are substitutions. In this case, the DP problem $(\mathcal{P}, \mathcal{R})$ is called finite. See [7] for an overview on techniques to prove finiteness of DP problems.⁸

Instead of transforming termination graphs into TRSs, the information available in the termination graph can be better exploited if one transforms these

⁷ All proofs can be found at http://aprove.informatik.rwth-aachen.de/eval/Haskell/.

⁸ In the DP literature, one usually does not regard rules with extra variables on right-hand sides, but almost all existing termination techniques for DPs can also be used for such rules. (For example, finiteness of such DP problems can often be proved by eliminating the extra variables by suitable argument filterings [2].)

graphs into DP problems, cf. the end of this section. In this way, we also do not have to impose any restrictions on the form of the termination graph (as in [11] where one can only analyze certain start terms which lead to termination graphs "without crossings"). Then finiteness of the resulting DP problems implies H-termination of all terms in the termination graph.

Note that termination graphs still contain higher-order terms (e.g., applications of variables to other terms like " $x\,y$ " and partial applications like "take u"). Since most methods and tools for automated termination analysis only operate on first-order TRSs, we translate higher-order terms into applicative first-order terms containing just variables, constants, and a binary symbol ap for function application. So terms like " $x\,y$ ", "take u", and "take $u\,xs$ " are transformed into the first-order terms ap(x,y), ap(take,u), and ap(ap(take,u),xs), respectively. As shown in [8], the DP framework is well suited to prove termination of applicative TRSs automatically. To ease readability, in the remainder we will not distinguish anymore between higher-order and corresponding applicative first-order terms, since the conversion between these two representations is obvious.

Recall that if a node in the termination graph is marked with a non-H-terminating term, then one of its children is also marked with a non-H-terminating term. Hence, every non-H-terminating term corresponds to an infinite path in the termination graph. Since a termination graph only has finitely many nodes, infinite paths have to end in a cycle. Thus, it suffices to prove H-termination for all terms occurring in cycles resp. in strongly connected components (SCCs) of the termination graph. Moreover, one can analyze H-termination separately for each SCC. Here, an SCC is a maximal subgraph G' of the termination graph such that for all nodes n_1 and n_2 in G' there is a non-empty path from n_1 to n_2 traversing only nodes of G'. (In particular, there must also be a non-empty path from every node to itself in G'.) The termination graph for "take u (from m)" in Fig. 1 has just one SCC with the nodes A, C, E, F, H. The following definition is needed to extract dependency pairs from SCCs of the termination graph.

Definition 6 (DP Path). Let G' be an SCC of a termination graph containing a path from a node marked with s to a node marked with t. We say that this path is a DP path if it does not traverse instantiation edges, if s has an incoming instantiation edge in G', and if t has an outgoing instantiation edge in G'.

So in Fig. 1, the only DP path is A, C, E, F, H. Since every infinite path has to traverse instantiation edges infinitely often, it also has to traverse DP paths infinitely often. Therefore, we generate a dependency pair for each DP path. If there is no infinite chain with these dependency pairs, then no term corresponds to an infinite path, i.e., then all terms in the graph are H-terminating.

More precisely, whenever there is a DP path from a node marked with s to a node marked with t and the edges of the path are marked with $\sigma_1, \ldots, \sigma_m$, then we generate the dependency pair $s\sigma_1 \ldots \sigma_m \to t$. In Fig. 1, the first edge of the DP path is labelled with the substitution [u/(Sn)] and all remaining edges are labelled with the identity. Thus, we generate the dependency pair

$$\mathsf{take}\,(\mathsf{S}\,n)\,(\mathsf{from}\,m)\to\mathsf{take}\,n\,(\mathsf{from}\,(\mathsf{S}\,m)). \tag{3}$$

The resulting DP problem is $(\mathcal{P}, \mathcal{R})$ where $\mathcal{P} = \{(3)\}$ and $\mathcal{R} = \emptyset$. Automated termination tools can easily show that this DP problem is finite. Hence, the start term "take u (from m)" is H-terminating in the original Haskell-program.

Similarly, finiteness of the DP problem ($\{\mathsf{tma}\,(\mathsf{S}\,m)\to\mathsf{tma}\,m\},\varnothing$) for the start term "tma n" from Fig. 2 is also easy to prove automatically.

A slightly more challenging example is obtained by replacing the last take-rule by the following two rules, where p computes the predecesor function.

$$take (S n) (Cons x xs) = Cons x (take (p (S n)) xs) p (S x) = x (4)$$

Now the resulting termination graph can be obtained from the graph in Fig. 1 by replacing the subgraph starting with node F by the subgraph in Fig. 3.

We want to construct an infinite chain whenever the termination graph contains a non-H-terminating term. In this case, there also exists a DP path with first node s such that s is not H-terminating. So there is a normal ground substitu-

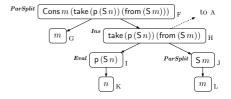


Fig. 3. Subtree at node F of Fig. 1

tion σ where $s\sigma$ is not H-terminating either. There must be a DP path from s to a term t labelled with the substitutions $\sigma_1, \ldots, \sigma_m$ such that σ is an instance of $\sigma_1 \ldots \sigma_m$ and such that $t\sigma$ is also not H-terminating. Os the first step of the desired corresponding infinite chain is $s\sigma \to_{\mathcal{P}} t\sigma$. The node t has an outgoing instantiation edge to a node \tilde{t} which starts another DP path. So to continue the construction of the infinite chain in the same way, we now need a non-H-terminating instantiation of \tilde{t} with a normal ground substitution. Obviously, \tilde{t} matches t by some matcher τ . But while $\tilde{t}\tau\sigma$ is not H-terminating, the substitution $\tau\sigma$ is not necessarily a normal ground substitution. The reason is that t and hence τ may contain defined symbols.

This is also the case in our example. The only DP path is A, C, E, F, H which would result in the dependency pair take (Sn) (from m) $\to t$ with t = take(p(Sn)) (from (Sm)). Now t has an instantiation edge to node A with $\tilde{t} = take u$ (from m). The matcher is $\tau = [u/(p(Sn)), m/(Sm)]$. So $\tau(u)$ is not normal.

In this example, the problem can be avoided by already evaluating the right-hand sides of dependency pairs as much as possible. So instead of a dependency pair $s\sigma_1 \ldots \sigma_m \to t$ we now generate the dependency pair $s\sigma_1 \ldots \sigma_m \to \mathbf{ev}(t)$. For a node marked with t, $\mathbf{ev}(t)$ is the term reachable from t by traversing only **Eval**-nodes. So in our example $\mathbf{ev}(\mathbf{p}(Sn)) = n$, since node I is an **Eval**-node with an

⁹ Def. 11 will explain how to generate \mathcal{R} in general.

To ease the presentation, we require that user-defined data structures (base types) may not be "empty". (But our approach can easily be extended to "empty" structures as well.) Then we may restrict ourselves to substitutions σ where all subterms of $\sigma(x)$ with base type have a constructor as head, for all variables x in s. This ensures that for every Case-node in the DP path, one child corresponds to the instantiation σ . To obtain a ground term $t\sigma$, we extend the substitution σ appropriately to the variables in t that do not occur in s. These variables were introduced by VarExp.

edge to node K. Moreover, $\mathbf{ev}(t)$ can also evaluate subterms of t if t is an Ins-node or a ParSplit-node with a constructor as head. We obtain $\mathbf{ev}(Sm) = Sm$ for node J and $\mathbf{ev}(\mathsf{take}(\mathsf{p}(Sn))(\mathsf{from}(Sm))) = \mathsf{take}\,n\,(\mathsf{from}(Sm))$ for node H. Thus, the resulting DP problem is again $(\mathcal{P},\mathcal{R})$ with $\mathcal{P} = \{(3)\}$ and $\mathcal{R} = \emptyset$.

To see how $\mathbf{ev}(t)$ must be defined for ParSplit-nodes where head(t) is a variable, we regard the function nonterm again, cf. (1). In the termination graph for the start term "nonterm bx", we obtain a DP path from the node with the start term to a node with "nonterm $(x \operatorname{True})x$ " labelled with the substitution $[b/\operatorname{False}]$. So the resulting DP problem only contains the dependency pair "nonterm $\operatorname{False} x \to \operatorname{ev}(\operatorname{nonterm}(x \operatorname{True})x)$ ". If we would define $\operatorname{ev}(x \operatorname{True}) = x \operatorname{True}$, then ev would not modify the term "nonterm $(x \operatorname{True})x$ ". But then the resulting DP problem would be finite and one could falsely prove H-termination. (The reason is that the DP problem contains no rule to transform any instance of " $x \operatorname{True}$ " to False .) But as discussed in Sect. 3, $x \operatorname{can}$ be instantiated by arbitrary H-terminating functions and then, " $x \operatorname{True}$ " can evaluate to any term. Therefore, ev must replace terms like " $x \operatorname{True}$ " by fresh variables.

Definition 7 (ev). Let G be a termination graph with a node t. 11 Then

$$\mathbf{ev}(t) = \begin{cases} t, & \text{if t is a leaf, a $\it Case-node, or a $\it VarExp-node} \\ x, & \text{if t is $\it ParSplit-node, head}(t)$ is a variable, and x is a fresh variable} \\ \mathbf{ev}(\tilde{t}), & \text{if t is an $\it Eval-node with child \tilde{t}} \\ \tilde{t}[x_1/\mathbf{ev}(t_1), \ldots, x_n/\mathbf{ev}(t_n)], & \text{if $t = \tilde{t}[x_1/t_1, \ldots, x_n/t_n]$ and either} \\ & t \text{ is an $\it Ins-node with the children t_1, \ldots, t_n, \tilde{t} or} \\ & t \text{ is a $\it ParSplit-node, and $\tilde{t} = (c\,x_1\,\ldots\,x_n)$ for a constructor c} \end{cases}$$

Our goal was to construct an infinite chain whenever s is the first node in a DP path and $s\sigma$ is not H-terminating for a normal ground substitution σ . As discussed before, there is a DP path from s to t such that the chain starts with $s\sigma \to_{\mathcal{P}} \mathbf{ev}(t)\sigma$ and such that $t\sigma$ and hence $\mathbf{ev}(t)\sigma$ is also not H-terminating. The node t has an instantiation edge to some node \tilde{t} . Thus $t = \tilde{t}[x_1/t_1, \dots, x_n/t_n]$ and $\mathbf{ev}(t) = \tilde{t}[x_1/\mathbf{ev}(t_1), \dots, x_n/\mathbf{ev}(t_n)]$. In order to continue the construction of the infinite chain, we need a non-H-terminating instantiation of \hat{t} with a normal ground substitution. Clearly, if t is instantiated by the substitution $[x_1/\mathbf{ev}(t_1)\sigma,\ldots,x_n/\mathbf{ev}(t_n)\sigma]$, then it is again not H-terminating. However, the substitution $[x_1/\mathbf{ev}(t_1)\sigma,\ldots,x_n/\mathbf{ev}(t_n)\sigma]$ is not necessarily normal. The problem is that ev does not perform those evaluations that correspond to instantiation edges and to edges from *Case*-nodes. Therefore, we now generate DP problems which do not just contain dependency pairs \mathcal{P} , but they also contain all rules \mathcal{R} which might be needed to evaluate $\mathbf{ev}(t_i)\sigma$ further. Then we obtain $s\sigma \to_{\mathcal{P}} \mathbf{ev}(t)\sigma \to_{\mathcal{R}}^* \tilde{t}\sigma'$ for a normal ground substitution σ' . Since \tilde{t} is again the first node in a DP path, now this construction of the chain can be continued in the same way infinitely many times. Hence, we obtain an infinite chain.

As an example, we replace the equation for p in (4) by the following two defining equations:

$$p(SZ) = Z \qquad p(Sx) = S(px)$$
 (5)

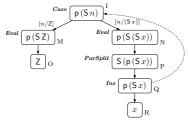
 $^{^{11}}$ To simplify the presentation, we identify nodes with the terms they are labelled with.

In the termination graph for "take u (from m)" from Fig. 1 and 3, the node I would now be replaced by the subtree in Fig. 4. So I is now a Case-node. Thus, instead of (3) we obtain the dependency pair

$$\mathsf{take}(\mathsf{S}\,n)\,(\mathsf{from}\,m)\to\mathsf{take}\,(\mathsf{p}\,(\mathsf{S}\,n))\,(\mathsf{from}\,(\mathsf{S}\,m)),\tag{6}$$

since now **ev** does not modify its right-hand side anymore (i.e., $\mathbf{ev}(\mathsf{p}(\mathsf{S}\,n)) = \mathsf{p}(\mathsf{S}\,n)$). Hence, now the resulting DP problem must contain all rules \mathcal{R} that might be used to evaluate $\mathsf{p}(\mathsf{S}\,n)$ when instantiated by σ .

So for any term t, we want to detect rules that might be needed to evaluate $\mathbf{ev}(t)\sigma$ further for normal ground substitutions σ . To this end, we first compute the set $\mathbf{con}(t)$ of those terms that are reachable from t, but where the computation of \mathbf{ev} stopped. So $\mathbf{con}(t)$ contains all terms which might give rise to further \mathbf{con} tinuing evaluations that are not captured by \mathbf{ev} . To compute $\mathbf{con}(t)$, we traverse all paths starting in t. If we reach a \mathbf{Case} -node s, we stop traversing



 ${f Fig.\,4.}$ Subtree at node I of Fig. 3

this path and insert s into $\mathbf{con}(t)$. Moreover, if we traverse an instantiation edge to some node \tilde{t} , we also stop and insert \tilde{t} into $\mathbf{con}(t)$. So in the example of Fig. 4, we obtain $\mathbf{con}(\mathsf{p}(\mathsf{S}\,n)) = \{\mathsf{p}(\mathsf{S}\,n)\}$, since I is now a Case-node. If we started with the term $t = \mathsf{take}(\mathsf{S}\,n)$ (from m) in node C, then we would reach the Case-node I and the node A which is reachable via an instantiation edge. So $\mathbf{con}(t) = \{\mathsf{p}(\mathsf{S}\,n), \mathsf{take}\,u\,(\mathsf{from}\,m)\}$. Finally, \mathbf{con} also stops at VarExp-nodes (they are in normal form w.r.t. \rightarrow_H) and at ParSplit-nodes whose head is a variable (since \mathbf{ev} already "approximates" their result by fresh variables).

Definition 8 (con). Let G be a termination graph with a node t. Then

$$\mathbf{con}(t) = \begin{cases} \varnothing, & \textit{if t is a leaf, a $VarExp-$, or a $ParSplit-node with variable head} \\ \{t\}, & \textit{if t is a $Case-node} \\ \{\tilde{t}\} \cup \mathbf{con}(t_1) \cup \ldots \cup \mathbf{con}(t_n), & \textit{if t is an $Ins-node with the} \\ & \textit{children } t_1, \ldots, t_n, \tilde{t} \textit{ and an instantiation edge from t to \tilde{t}} \\ \bigcup_{t'child \textit{ of } t} \mathbf{con}(t'), & \textit{otherwise} \end{cases}$$

Now we can define how to extract a DP problem $\mathbf{dp}_{G'}$ from every SCC G' of the termination graph. As mentioned, we generate a dependency pair $s\sigma_1 \dots \sigma_m \to \mathbf{ev}(t)$ for every DP path from s to t labelled with $\sigma_1, \dots, \sigma_m$ in G'. If $t = \tilde{t}[x_1/t_1, \dots, x_n/t_n]$ has an instantiation edge to \tilde{t} , then the resulting DP problem must contain all rules that can be used reduce the terms in $\mathbf{con}(t_1) \cup \dots \cup \mathbf{con}(t_n)$. For any term s, let $\mathbf{rl}(s)$ be the rules that can be used to reduce $s\sigma$ for normal ground substitutions σ . We will give the definition of \mathbf{rl} afterwards.

Definition 9 (dp). For a termination graph containing an SCC G', we define $d\mathbf{p}_{G'} = (\mathcal{P}, \mathcal{R})$. Here, \mathcal{P} and \mathcal{R} are the smallest sets such that

- " $s\sigma_1 \dots \sigma_m \to \mathbf{ev}(t)$ " $\in \mathcal{P}$ and
- $\mathbf{rl}(q) \subseteq \mathcal{R}$,

whenever G' contains a DP path from s to t labelled with $\sigma_1, \ldots, \sigma_m, t = \tilde{t}[x_1/t_1, \ldots, x_n/t_n]$ has an instantiation edge to \tilde{t} , and $q \in \mathbf{con}(t_1) \cup \ldots \cup \mathbf{con}(t_n)$.

In our example with the start term "take u (from m)" and the p-equations from (5), the termination graph in Fig. 1, 3, and 4 has two SCCs G_1 (consisting of the nodes A, C, E, F, H) and G_2 (consisting of I, N, P, Q). Finiteness of the two DP problems \mathbf{dp}_{G_1} and \mathbf{dp}_{G_2} can be proved independently. The SCC G_1 only has the DP path from A to H leading to the dependency pair (6). So we obtain $\mathbf{dp}_{G_1} = (\{(6)\}, \mathcal{R}_1)$ where \mathcal{R}_1 contains $\mathbf{rl}(q)$ for all $q \in \mathbf{con}(\mathsf{p}(\mathsf{S}\,n)) = \{\mathsf{p}(\mathsf{S}\,n)\}$. Thus, $\mathcal{R}_1 = \mathbf{rl}(\mathsf{p}(\mathsf{S}\,n))$. The SCC G_2 only has the DP path from I to Q. Hence, $\mathbf{dp}_{G_2} = (\mathcal{P}_2, \mathcal{R}_2)$ where \mathcal{P}_2 consists of the dependency pair " $\mathsf{p}(\mathsf{S}(\mathsf{S}\,x)) \to \mathsf{p}(\mathsf{S}\,x)$ " (since $\mathbf{ev}(\mathsf{p}(\mathsf{S}\,x)) = \mathsf{p}(\mathsf{S}\,x)$) and \mathcal{R}_2 contains $\mathbf{rl}(q)$ for all $q \in \mathbf{con}(x) = \emptyset$, i.e., $\mathcal{R}_2 = \emptyset$. Thus, finiteness of \mathbf{dp}_{G_2} can easily be proved automatically.

For every term s, we now show how to extract a set of rules $\mathbf{rl}(s)$ such that every evaluation of $s\sigma$ for a normal ground substitution σ corresponds to a reduction with $\mathbf{rl}(s)$.¹² The only expansion rules which transform terms into "equal" ones are **Eval** and **Case**. This leads to the following definition.

Definition 10 (Rule Path). A path from a node marked with s to a node marked with t is a rule path if s and all other nodes on the path except t are **Eval**- or **Case**-nodes and t is no **Eval**- or **Case**-node. So t may also be a leaf.

In Fig. 4, there are two rule paths starting in node I. The first one is I, M, O (since O is a leaf) and the other is I, N, P (since P is a *ParSplit*-node).

While DP paths give rise to dependency pairs, rule paths give rise to rules. Therefore, if there is a rule path from s to t labelled with $\sigma_1, \ldots, \sigma_m$, then $\mathbf{rl}(s)$ contains the rule $s\sigma_1 \ldots \sigma_m \to \mathbf{ev}(t)$. In addition, $\mathbf{rl}(s)$ must also contain all rules required to evaluate $\mathbf{ev}(t)$ further, i.e., all rules in $\mathbf{rl}(q)$ for $q \in \mathbf{con}(t)$.¹³

Definition 11 (rl). For a node labelled with s, $\mathbf{rl}(s)$ is the smallest set with

- " $s\sigma_1 \dots \sigma_m \to \mathbf{ev}(t)$ " $\in \mathbf{rl}(s)$ and
- $\mathbf{rl}(q) \subseteq \mathbf{rl}(s)$,

whenever there is rule path from s to t labelled with $\sigma_1, \ldots, \sigma_m$, and $q \in \mathbf{con}(t)$.

For the start term "take u (from m)" and the p-equations from (5), we obtained the DP problem $\mathbf{dp}_{G_1} = (\{6\}, \mathbf{rl}(\mathsf{p}(\mathsf{S}\,n)))$. Here, $\mathbf{rl}(\mathsf{p}(\mathsf{S}\,n))$ consists of

$$p\left(S\:Z\right)\to Z \hspace{1cm} (\text{due to the rule path from I to o}) \hspace{1cm} (7)$$

$$p(S(Sx)) \rightarrow S(p(Sx))$$
 (due to the rule path from I to P), (8)

More precisely, $s\sigma \to_{\mathsf{H}}^* q$ implies $s\sigma \to_{\mathsf{rl}(s)}^* q'$ for a term q' which is "at least as evaluated" as q (i.e., one can evaluate q further to q' if one also permits evaluation steps below or beside the evaluation position).

¹³ So if $t = \tilde{t}[x_1/t_1, \dots, x_n/t_n]$ has an instantiation edge to \tilde{t} , then here we also include all rules of $\mathbf{rl}(\tilde{t})$, since $\mathbf{con}(t) = {\tilde{t}} \cup \mathbf{con}(t_1) \cup \dots \cup \mathbf{con}(t_n)$. In contrast, for the definition of \mathbf{dp} in Def. 9 we only regard the rules $\mathbf{rl}(q)$ for $q \in \mathbf{con}(t_1) \cup \dots \cup \mathbf{con}(t_n)$, whereas the evaluations of \tilde{t} are captured by the dependency pairs.

as **ev** does not modify the right-hand sides of (7) and (8). Moreover, the requirement " $\mathbf{rl}(q) \subseteq \mathbf{rl}(\mathsf{p}(\mathsf{S}\,n))$ for all $q \in \mathbf{con}(\mathsf{Z})$ and all $q \in \mathbf{con}(\mathsf{S}\,(\mathsf{p}(\mathsf{S}\,x)))$ " does not add further rules. The reason is that $\mathbf{con}(\mathsf{Z}) = \varnothing$ and $\mathbf{con}(\mathsf{S}\,(\mathsf{p}(\mathsf{S}\,x))) = \{\mathsf{p}(\mathsf{S}\,n)\}$. Now finiteness of $\mathbf{dp}_{G_1} = (\{6\}, \{(7), (8)\})$ is also easy to show automatically.

Finally, consider the following program which leads to the graph in Fig. 5.

$$f x = applyToZero f$$
 $applyToZero x = x Z$

This example shows that one also has to traverse edges resulting from VarExp when constructing dependency pairs. Otherwise one would falsely prove H-termination. Since the only DP path goes from node A to F, we obtain the DP problem $(\{f x \to f y\}, \mathcal{R})$ with $\mathcal{R} = \mathbf{rl}(y) = \emptyset$. This problem is not finite (and indeed, "f x" is not H-terminating). In contrast, the definition of \mathbf{rl} stops at VarExp-nodes.

The example also illustrates that \mathbf{rl} and \mathbf{dp} handle instantiation edges differently, cf. Footnote 13. Since there is a rule path from A to B, we would obtain $\mathbf{rl}(\mathsf{f}\,x) = \{\mathsf{f}\,x \to \mathsf{applyToZero}\,\mathsf{f}\} \cup \mathbf{rl}(\mathsf{applyToZero}\,x)$, since $\mathbf{con}(\mathsf{applyToZero}\,\mathsf{f}) = \mathsf{applyToZero}\,x$. So for the construction of \mathbf{rl} we also have to include the rules resulting from nodes like C which are only reachable by instantiation edges. We obtain $\mathbf{rl}(\mathsf{applyToZero}\,x) = \{\mathsf{applyToZero}\,x \to z\}$, since $\mathbf{ev}(x\,\mathsf{Z}) = z$ for a fresh variable z. The following theorem states the soundness of our approach.

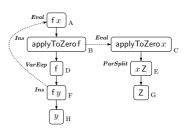


Fig. 5. Termination graph for "f x"

Theorem 12 (Soundness). Let G be termination graph. If the DP problem $d\mathbf{p}_{G'}$ is finite for all $SCCs\ G'$ of G, then all nodes t in G are H-terminating.¹⁵

While we transform termination graphs into DP problems, it would also be possible to transform termination graphs into TRSs instead and then prove termination of the resulting TRSs. However, this approach has several disadvantages. For example, if the termination graph contains a VarExp-node or a ParSplit-node with a variable as head, then we would result in rules with extra variables on right-hand sides and thus, the resulting TRSs would never be terminating. In contrast, a DP problem $(\mathcal{P}, \mathcal{R})$ with extra variables in \mathcal{P} and \mathcal{R} can still be finite, since dependency pairs from \mathcal{P} are only be applied on top positions in chains and since \mathcal{R} need not be terminating for finite DP problems $(\mathcal{P}, \mathcal{R})$.

5 Extensions, Implementation, and Experiments

We presented a technique for automated termination analysis of Haskell which works in three steps: First, it generates a termination graph for the given start

¹⁴ This is different in the definition of **dp**. Otherwise, we would have $\mathcal{R} = \mathbf{rl}(y) \cup \mathbf{rl}(f x)$.

¹⁵ Instead of $\mathbf{dp}_{G'} = (\mathcal{P}, \mathcal{R})$, for H-termination it suffices to prove finiteness of $(\mathcal{P}^{\sharp}, \mathcal{R})$.

Here, \mathcal{P}^{\sharp} results from \mathcal{P} by replacing each rule $f(t_1, ..., t_n) \to g(s_1, ..., s_m)$ in \mathcal{P} by $f^{\sharp}(t_1, ..., t_n) \to g^{\sharp}(s_1, ..., s_m)$, where f^{\sharp} and g^{\sharp} are fresh "tuple" function symbols [2].

term. Then it extracts DP problems from the termination graph. Finally, one uses existing methods from term rewriting to prove finiteness of these DP problems.

To ease readability, we did not regard Haskell's type classes and built-in data structures in the preceding sections. However, our approach easily extends to these concepts [14]. To deal with type classes, we use an additional *Case*-rule in the construction of termination graphs, which instantiates type variables by all instances of the corresponding type class. Built-in data structures like Haskell's lists and tuples simply correspond to user-defined types with a different syntax. To deal with integers, we transform them into a notation with the constructors Pos and Neg (which take arguments of type Nats) and provide pre-defined rewrite rules for integer operations like addition, subtraction, etc. Floating-point numbers can be handled in a similar way (e.g., by representing them as fractions).

We implemented our approach in the termination prover AProVE [9]. It accepts the full Haskell 98 language defined in [12] and we successfully evaluated our implementation with standard Haskell-libraries from the Hugs-distribution such as Prelude, Monad, List, FiniteMap, etc. To access the implementation via a web interface, for details on our experiments, and for the proofs of all theorems, see http://aprove.informatik.rwth-aachen.de/eval/Haskell/.

We conjecture that term rewriting techniques are also suitable for termination analysis of other kinds of programming languages. In [13], we recently adapted the dependency pair method in order to prove termination of *logic* programming languages like Prolog. In future work, we intend to examine the use of TRS-techniques for *imperative* programming languages as well.

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