

# Restricted Combinatory Unification

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**Abstract.** First-order theorem provers are commonly utilised as backends to proof assistants. In order to improve efficiency, it is desirable that such provers can carry out some higher-order reasoning. In his 1991 paper, Dougherty proposed a combinatory unification algorithm for higher-order logic. The algorithm removes the need to deal with  $\lambda$ -binders and  $\alpha$ -renaming, making it attractive to implement in first-order provers. However, since publication it has garnered little interest due to its poor characteristics. It fails to terminate on many trivial instances and requires polymorphism. We present a restricted version of Dougherty’s algorithm that is incomplete, terminating and does not require polymorphism. Further, we describe its implementation in the Vampire theorem prover, including a novel use of a substitution tree as a filtering index for higher-order unification. Finally, we analyse the performance of the algorithm on two benchmark sets and show that it is a significant step forward.

## 1 Introduction

Higher-order logic has many applications from the formalisation of mathematics through to uses in verifying the safety and security of computer systems. This has led to a growing interest in the *automation* of reasoning in higher-order logic (which is undecidable in general). A successful step in this direction has been via translation to first-order logic and utilisation of first-order theorem provers, made possible by the high level of maturity and sophistication of such provers. Proof assistants such as Isabelle [23] and Coq [9] along with automated provers such as Leo-III [29], interact with first-order provers by translating their native logic into first-order logic [21]. These translations tend to be incomplete and suffer from a number of problems of which two of the most important are highlighted below. This paper addresses these problems with a higher-order unification algorithm for combinatory logic and its pragmatic realisation within the first-order Vampire theorem prover [17].

The translation of nameless or  $\lambda$ -functions is often carried out using combinators. However, when translating to monomorphic first-order logic, supported by most first-order provers, an infinite set of combinators is required to guarantee completeness. Thus, most translation schemes suffice with including the combinators necessary to translate the  $\lambda$ -functions present in the input. Consider the somewhat contrived conjecture  $\exists X : X \ b \ a = a$ . On negation, this becomes  $X \ b \ a \neq a$ . As there are no ‘ $\lambda$ ’s there would be no combinators present in the translation. Accordingly, the prover would be unable to synthesise the combinatory equivalent (which is **CK**) of the  $\lambda$ -term  $\lambda xy.y$  and would be unable to find a proof. Now consider the same conjecture, but assume that some combinator axioms are present in the first-order translation (this could be

via the heuristic addition of combinator axioms, an option in Vampire). In this case, the axioms can superpose amongst themselves. For example, the  $K$  combinator axiom  $K\ X\ Y = X$  could superpose onto the right hand side of the  $S$  combinator axiom  $S\ X\ Y\ Z = X\ Z(Y\ Z)$  to produce the equation  $S\ K\ Y\ Z = Z$ . A consequence of the combinator axioms has been derived that is of no use in proving the goal.

Both of these problems stem from attempting to achieve what the goal-oriented procedure of higher-order unification (HOU) does using the non-goal-oriented superposition calculus. Thus, there is a strong argument that introducing some form of higher-order unification into first-order provers would significantly improve their performance on problems generated by proof-assistants. This is particularly so if this can be achieved without harming performance on the first-order portion of the problems.

Indeed, replacing syntactic first-order unification with unification modulo the combinator axioms and adding an extra inference rule called ‘extended narrowing’ suffices to turn ordered resolution into a complete proof calculus for intensional HOL [13] [7]. Unfortunately, the required proof method does not easily extend to superposition. Unification modulo the combinator axioms would result in a complete superposition calculus for higher-order logic if a reduction ordering compatible with the combinator axioms could be found [31]. However, such an ordering is impossible as any ordering that partitions  $K\ X\ Y$  and  $X$  into an equivalence class must violate the subterm property.

**Contribution** The usage of  $\lambda$ -binders adds complications and subtleties to the implementation of higher-order unification. In particular, during the application of substitutions, bound variables require  $\alpha$ -renaming. It is precisely to deal with such issues that explicit substitution calculi [12] [10] have been investigated.

First-order provers are generally not able to handle binders, so rather than explicit substitution calculi, we focus on higher-order unification in the setting of combinatory logic. The only existing algorithm in this setting is Dougherty’s algorithm. The algorithm is a complete unification procedure for *polymorphic* higher-order terms. It is unattractive for implementation because it produces many redundant unifiers and does not terminate in many cases. Our main contributions in this paper are:

- A modification of Dougherty’s algorithm that works on *monomorphic* higher order terms (Section 4). Our algorithm is incomplete, but terminating and has shown strong experimental results.
- A method of imperfect filtering that facilitates the implementation of higher-order unification without harming performance on first-order problems (Section 5).

These techniques are implemented in the Vampire theorem prover [17] (along with other extensions reported elsewhere for higher-order reasoning) and experimental results (Section 6) show that combinatory unification can help solve new problems.

## 2 Preliminaries

In this paper some knowledge of first-order unification and substitution tree indexing is assumed. The reader is referred to [15] and [14] for further details. We present the logical terminology used throughout the rest of the paper. We work with the combinatory-logic (CL) first developed by Schönfinkel, but popularised by Curry. As Dougherty’s

original algorithm works with polymorphic terms and our modification works with monomorphic terms, both are presented here.

Terms are built over a set of types. Let  $S$  be a set of sort symbols that act as syntactic identifiers for the base types of the logic and  $V_{ty}$  be a set of sort variables. The set of types is defined as:

$$\begin{aligned} \textbf{Monomorphic Types} \quad \tau &::= \sigma \mid \tau \rightarrow \tau && \text{where } \sigma \in S \\ \textbf{Polymorphic Types} \quad \tau &::= \sigma \mid \alpha \mid \tau \rightarrow \tau && \text{where } \sigma \in S, \alpha \in V_{ty} \end{aligned}$$

A *polymorphic* type declaration is of the form  $\Pi \overline{\alpha_m}. \tau$  where each  $\alpha_i$  is a type variable and  $\tau$  is a potentially polymorphic type containing type variables from  $\overline{\alpha_m}$  ( $\overline{\alpha_m}$  is a list of type variables). A *monomorphic* type declaration is simply  $\tau$  for some monomorphic type  $\tau$ .

For each type  $\tau$  let  $V_\tau$  be a set of term variables of type  $\tau$  and let  $V = \bigcup_{\tau \in T} V_\tau$ . Further, let  $\Sigma$  be a set of typed constant symbols. When working in monomorphic CL, for every type  $\tau$ , there exists a constant  $\mathbf{I} : \tau \rightarrow \tau \in \Sigma$ . For every pair of types  $\tau, \rho$ , there exists a constant  $\mathbf{K} : \tau \rightarrow \rho \rightarrow \tau \in \Sigma$  and for every triple of types  $\tau, \rho, \sigma$ , there exists a constant  $\mathbf{S} : (\tau \rightarrow \rho \rightarrow \sigma) \rightarrow (\tau \rightarrow \rho) \rightarrow \tau \rightarrow \sigma \in \Sigma$ . The constants  $\mathbf{I}, \mathbf{K}$  and  $\mathbf{S}$  are known as *basic combinators*. When working in polymorphic CL, the existence of only three polymorphic basic combinators is required. From now on, unless required for clarity, type subscripts are omitted.

We define monomorphic and polymorphic terms together as follows. Let  $f : \Pi \overline{\alpha_m}. \tau$  be a member of  $\Sigma$ . In the monomorphic case,  $m = 0$ . Then,  $f$  applied to  $m$  type arguments:  $f \langle \overline{\sigma_m} \rangle$  is a term of type  $\tau \{ \overline{\alpha_m} \rightarrow \overline{\sigma_m} \}$  for some tuple of types  $\overline{\sigma_m}$ . For all  $X \in V_\tau$ ,  $X$  is a term of type  $\tau$ . If  $t$  is a term of type  $\tau \rightarrow \sigma$  and  $t'$  is a term of type  $\tau$ , then  $tt'$  is a term of type  $\sigma$ . Where type arguments are irrelevant, they are dropped from the presentation.

Terms of the form  $tt'$  are called *applications*. Non-applicative terms  $X, \zeta \in V \cup \Sigma$  are called heads. A term can be decomposed uniquely into a head and  $n$  arguments e.g.  $\zeta t_1 \dots t_n$  or in shorter form  $\zeta \overline{t_n}$ . By  $head(t)$  the unique head of  $t$  is intended e.g.  $head(f a b) = f$ . A head is first-order if it is not a variable or combinator. A term is *passive* if it does not have a combinator head. The positions  $pos(t)$  of term  $t$  are defined in the standard fashion; we write  $t|_p$  for the subterm of  $t$  at position  $p$ . Recall the partial ordering  $<$  on positions such that  $p < p'$  if  $t|_{p'}$  is a subterm of  $t|_p$ . The set of all positions over  $t$  is denoted  $pos(t)$  and the size of  $t$ , denoted  $|t|$ , is the cardinality of  $pos(t)$ . A *higher-order subterm*<sup>1</sup> is a subterm with a variable or combinator head. A term that contains no higher-order subterms is called first-order. The set of *first-order positions* over a term  $t$  is defined as all  $p \in pos(t)$  such that, for all  $p' < p$ ,  $head(t|_{p'})$  is not a variable or combinator. A term is *linear* if it contains no repeated variables. In a term  $\zeta \overline{t_n}$ , subterms of the form  $\zeta \overline{t_i}$  for  $i < n$  are known as *prefix* subterms.

In what follows, capital letters such as  $X, Y, Z \dots$  are used to denote variables,  $s, t, u$  denote arbitrary terms,  $a, b, c \dots$  denote constants.

**Unification** Unification involves substituting terms for (free) variables in order to make two or more terms equal. This equality could be syntactic equality, as is generally the

<sup>1</sup> Note that the definition of higher-order subterm here is different to its usage in [3]

case in first-order theorem proving, or equality modulo a set of axioms. In classic HOU, the goal is to find substitution(s)  $\theta_1 \dots \theta_n$  for terms  $t_1, t_2 \dots t_n$  such that  $t_1\theta_i =_{\beta\eta} t_2\theta_i =_{\beta\eta} \dots =_{\beta\eta} t_n\theta_i$  where  $=_{\beta\eta}$  is equality modulo the axioms of  $\beta$  and  $\eta$  reduction. In this paper, we are interested in the relationship  $=_c$  (defined below) on terms of the combinatory logic. A substitution that unifies two or more terms is known as a *unifier*. When working with polymorphic terms, a substitution  $\theta$  is a *pair*, a term substitution  $\theta_0$  and a type substitution  $\theta_1$ . By an abuse of notation, the same symbols are used to refer to these dual substitutions and standard monomorphic substitutions.

For two unifiers  $\sigma$  and  $\theta$ ,  $\sigma$  is more general than  $\theta$  ( $\sigma \leq \theta$ ) iff there exists a substitution  $\gamma$  such that  $\sigma\gamma = \theta$ . In this case,  $\theta$  is *redundant*. If neither  $\sigma \leq \theta$ , nor  $\theta \leq \sigma$  then  $\sigma$  and  $\theta$  are *independent*. In syntactic first-order unification, if two terms have a unifier then they have a unique (up to variable naming) *most general unifier* (mgu). This is not the case with HOU and the notion of mgu is generalised to that of *complete set of unifiers* (csu). Let  $\Gamma$  be a set of unifiers of terms  $t_1 \dots t_n$ .  $\Gamma$  is a csu iff for all  $\sigma \in \text{unifiers}(\overline{t_n})$  such that  $\sigma \notin \Gamma$ , we have  $\exists \sigma' \in \Gamma$  such that  $\sigma' \leq \sigma$ .  $\Gamma$  is a minimal csu iff for all  $\sigma_1, \sigma_2 \in \Gamma$ ,  $\sigma_1$  and  $\sigma_2$  are independent. With respect to HOU, the minimal csu may be infinite.

The HOU problem is undecidable and any complete algorithm must produce redundant unifiers [16]. Let  $\stackrel{up}{=}$  be the least congruence relation on combinatory terms which contains  $\{(t_1, t_2) \mid \text{head}(t_1), \text{head}(t_2) \in V\}$ . The pre-unification problem is to find substitutions  $\theta_1 \dots \theta_n$  such that for terms  $t_1 \dots t_n$ ,  $t_i\theta_k \stackrel{up}{=} t_j\theta_k$  for all  $i, j$  and  $k$ . Huet devised a famous complete algorithm for pre-unification [16] that is irredundant.

**Definition 1.** For CL terms  $t_1$  and  $t_2$ ,  $t_1 =_c t_2$  or equivalently  $t_1$  is C-equal to  $t_2$ , iff  $\Lambda(t_1) =_{\beta\eta} \Lambda(t_2)$  where  $\Lambda$  is the following translation between combinatory terms and terms of the  $\lambda$ -calculus.

$$\begin{aligned} \Lambda(a) &= a \text{ for } a \text{ not a combinator} & \Lambda(\mathbf{S}) &= \lambda XYZ.XZ(YZ) \\ \Lambda(\mathbf{I}) &= \lambda X.X & \Lambda(t_1 t_2) &= \Lambda(t_1)\Lambda(t_2) \\ \Lambda(\mathbf{K}) &= \lambda XY.X \end{aligned}$$

The translation  $\Lambda$  can be used to derive unifiers of  $\lambda$ -terms from unifiers of CL terms. The details can be found in Dougherty's paper [11]. If  $\theta$  is a substitution such that  $\theta$  unifies two or more terms with respect to  $=_c$ ,  $\theta$  is referred to as a C-unifier.

Following Dougherty, a *system* is defined as a multiset of pairs of CL terms. A pair is *trivial* if its components are identical and it is *valid* if its components are C-equal. The definition of flex-flex, flex-rigid and rigid-rigid pairs is as common in HOU literature [27]. The definitions of *trivial* and *valid* are extended to systems in the obvious way. The *extensional combinatory unification* problem is to find, for any given system  $\mathcal{S}$ , a set of unifiers  $U$  such that  $\forall \langle t_1, t_2 \rangle \in \mathcal{S}$  and  $\forall \theta \in U$   $t_1\theta =_c t_2\theta$ . A system  $\mathcal{S}$  is *simple* if for all pairs  $\langle t, t' \rangle$  in  $\mathcal{S}$ , terms  $t$  and  $t'$  do not have identical rigid heads and both are passive.

**Definition 2 (Solved System).** For some system  $\mathcal{S}$ , a pair  $\langle X, t_2 \rangle \in \mathcal{S}$  is solved if  $X$  doesn't occur in  $t_2$  or in any other pair in  $\mathcal{S}$ . A system  $\mathcal{S}$  is solved if  $\forall p \in \mathcal{S}$ , either  $p$  is trivial or solved.

The importance of the concept of solved systems can be seen from the fact the solved pairs of a solved system  $\mathcal{S}$  form a *most general unifier* of  $\mathcal{S}$  (see [11]).

### 3 Dougherty's Combinatory Unification Algorithm

Dougherty's algorithm is a complete, finitely-branching, polymorphic HOU algorithm. It is presented here as a set of non-deterministic transformation rules that act on a system of unification pairs. Let  $\Rightarrow$  represent the application of a transformation rule to a system,  $\Rightarrow^+$  the transitive closure of  $\Rightarrow$  and  $\Rightarrow^*$  its reflexive transitive closure. We use  $\uplus$  for the multiset sum of two multisets. It is assumed that the order of the terms in the pairs is immaterial.

Polymorphism is an essential feature in Dougherty's algorithm even if the original terms are monomorphic. In the SXX'-narrow transform (given below) an applied variable head is replaced with the term  $\mathcal{S} X' X''$  and then reduced. Applying this transform to the system  $\{\langle X_{\iota \rightarrow \iota} a_{\iota}, b_{\iota} \rangle\}$  results in  $\{\langle X' a(X'' a), b \rangle\}$ . Because the type of  $a$  is  $\iota$  the type of the fresh variable  $X''$  must be  $\iota \rightarrow ?$ , but there is no way to determine what type  $?$  should be. Similarly the type of  $X'$  must be  $\iota \rightarrow ? \rightarrow \iota$ , but again  $?$  cannot be determined. Thus, in both cases  $?$  is set to a type variable which may be instantiated during subsequent unification. In only this transformation are the types of the introduced variables not deducible.

Our presentation differs from that of Dougherty's by having WEAKREDUCE as a separate transformation, rather than a special case of HEADNARROW.

1. ADDARG

$$\{\langle t_1, t_2 \rangle\} \uplus \mathcal{S} \Rightarrow \{\langle t_1 \theta \ d, t_2 \theta \ d \rangle\} \uplus \mathcal{S} \theta$$

Where either  $t_1$  or  $t_2$  has an under applied combinator as its head,  $d$  is a fresh constant and  $\theta$  is the type-unifier of the types of  $t_1, t_2$  and  $\alpha \rightarrow \tau$  for fresh type variables  $\alpha$  and  $\tau$  (in case  $t_1$  and  $t_2$  are both of atomic type).

2. SPLIT:

$$\{\langle X \ \overline{t_n}, h \ \overline{s'_m} \ \overline{s''_n} \rangle\} \uplus \mathcal{S} \Rightarrow \{\langle h \ \overline{X'_m} \ \overline{t_n}, h \ \overline{s'_m} \ \overline{s''_n} \rangle\} \theta \uplus \mathcal{S} \theta$$

Where  $\theta = (\theta_0, \theta_1)$ ,  $\theta_0 = \{X \rightarrow h \ \overline{X'_m}\}$  and  $\theta_1$  is the mgu of  $type(X)$  and  $type(h \ \overline{s'_m})$ . Each  $X'_i$  is a fresh variable.

3. WEAKREDUCE:

$$\{\langle \mathbf{I} \ t \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \Rightarrow \{\langle t \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad (\text{I-reduce})$$

$$\{\langle \mathbf{K} \ t \ t' \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \Rightarrow \{\langle t \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad (\text{K-reduce})$$

$$\{\langle \mathbf{S} \ t \ t' \ t'' \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \Rightarrow \{\langle t \ t'' \ (t' t'') \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad (\text{S-reduce})$$

4. HEADNARROW: The variables introduced by the rules are assumed to be fresh for the system in all cases. In all rules,  $\theta = (\theta_0, \theta_1)$  where  $\theta_0$  is the syntactic unifier of a non-variable prefix subterm and the left-hand side of a suitably renamed

combinator axiom and  $\theta_1$  is the relevant type unifier. For example, in the first rule  $\theta_0 = \{X \rightarrow \mathbf{I}\}$  and  $\theta_1 = mgu(type(X), type(\mathbf{I}))$ .

$$\{\langle X \ t \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad \Longrightarrow \quad \{\langle t \ \overline{t_n}, s' \rangle\} \theta \uplus \mathcal{S} \theta \quad (\text{I-narrow})$$

$$\{\langle X \ t \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad \Longrightarrow \quad \{\langle X' \ \overline{t_n}, s' \rangle\} \theta \uplus \mathcal{S} \theta \quad (\text{KX-narrow})$$

$$\{\langle X \ t \ t' \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad \Longrightarrow \quad \{\langle t \ \overline{t_n}, s' \rangle\} \theta \uplus \mathcal{S} \theta \quad (\text{K-narrow})$$

$$\{\langle X \ t \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad \Longrightarrow \quad \{\langle X' \ t \ (X'' \ t) \ \overline{t_n}, s' \rangle\} \theta \uplus \mathcal{S} \theta \quad (\text{SXX'-narrow})$$

$$\{\langle X \ t \ t' \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad \Longrightarrow \quad \{\langle X' \ t' \ (t \ t') \ \overline{t_n}, s' \rangle\} \theta \uplus \mathcal{S} \theta \quad (\text{SX-narrow})$$

$$\{\langle X \ t \ t' \ t'' \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad \Longrightarrow \quad \{\langle t \ t'' \ (t' \ t'') \ \overline{t_n}, s' \rangle\} \theta \uplus \mathcal{S} \theta \quad (\text{S-narrow})$$

These four transformation rules are collectively known as the HUT-transformations. They are used alongside syntactic transformations DECOMP, ELIMINATE and TYPEUNIFY. For a system  $\mathcal{S}$ , its *derived* system is the system of type pairs formed by replacing each term in  $\mathcal{S}$  with its type.

5. DECOMP:

$$\{\langle f \ \overline{t_n}, f \ \overline{s_n} \rangle\} \uplus \mathcal{S} \quad \Longrightarrow \quad \{\langle t_1, s_1 \rangle \dots \langle t_n, s_n \rangle\} \uplus \mathcal{S}$$

6. ELIMINATE:

$$\{\langle X, t \rangle\} \uplus \mathcal{S} \quad \Longrightarrow \quad \{\langle X, t \rangle\} \uplus \mathcal{S} \theta$$

where  $\theta = \{X \rightarrow t\}$  and  $X$  does not occur in  $t$ .

7. TYPEUNIFY

$$\mathcal{S} \quad \Longrightarrow \quad \mathcal{S} \theta$$

Where  $\theta$  is type unifier of the derived system of  $\mathcal{S}$ .

For any system  $\mathcal{S}$ , an exhaustive application of WEAKREDUCE, DECOMP and ADDARG results in a simple system  $\mathcal{S}'$  with the same unifiers as  $\mathcal{S}$  as proved by Dougherty. In [11] the following non-deterministic algorithm for enumerating  $C$ -unifiers is called  $U$  and is proven to be sound and complete.

1. Reduce the system to a simple system then apply some HUT-transformation out of an unsolved pair.
2. If at any point the system is syntactically unifiable by a pure substitution then optionally return a most general unifier of the system.

A substitution  $\sigma$  is *pure* if  $\forall x \in dom(\sigma)$ ,  $\sigma(x)$  does not contain any constants introduced by ADDARG. Unfortunately  $U$  contains infinite computation paths in many cases where Huet's classical algorithm does terminate. Worse, even when restricted to pre-unification, the algorithm produces redundant unifiers.

**Lemma 1.** *If, for a system of unification pairs  $\Sigma$ , there exists a computation path of  $U$  that includes a HEADNARROW step, then there exists an infinite computation path of  $U$  on  $\mathcal{S}$ .*

*Proof.* Let  $ty_1$  and  $ty_2$  be meta-type variables, standing for arbitrary types. We show that if a pair of the form  $\langle X_{ty_1 \rightarrow ty_2} t_{ty_1} \overline{t_n}, t' \rangle$  (\*) is part of a simple system, then an SXX'-narrow step can be applied and the resulting system transformed to a simple system containing a pair of the same form.

For the application of a HEADNARROW step, there must exist a simple system  $\mathcal{S}_1$  such that  $\mathcal{S} \Rightarrow^* \mathcal{S}_1$  by a series of  $U$ -steps and  $\mathcal{S}_1$  includes a pair  $p = \langle X_{\alpha \rightarrow \tau} t_\alpha \overline{t_n}, t' \rangle$ . Assume that  $t'$  has a rigid head or a flexible head different to  $X$  (if the head of  $t'$  is  $X$ , the proof still holds, but is slightly more complex). The pair  $p$  is of the form (\*). The following HEADNARROW step can then be applied:

$$\mathcal{S}_1 = p \uplus \mathcal{S}_2 \Rightarrow_{SXX'-narrow} \{ \langle X'_{\alpha \rightarrow \gamma \rightarrow \tau} t_\alpha (X''_{\alpha \rightarrow \gamma} t_\alpha) \overline{t_n}, t' \rangle \} \theta \uplus \mathcal{S}_2 \theta = \mathcal{S}_3$$

The algorithm proceeds by reducing  $\mathcal{S}_3$  to a simple system  $\mathcal{S}_4$ . As  $\text{head}(t') \neq X$ , we have that  $\text{head}(t') = \text{head}(t'\theta)$ . Since neither  $X'$  nor  $\text{head}(t')$  is a combinator, no WEAKREDUCE or ADDARG rules can be applied to the pair during the reduction phase. As  $X'$  is not rigid, DECOMP is not applicable either.

Therefore, the pair  $\langle (X'_{\alpha \rightarrow \gamma \rightarrow \tau} t_\alpha (X'' t) \overline{t_n}) \theta \sigma, t' \theta \sigma \rangle$  is a part of  $\mathcal{S}_4$  where  $\sigma$  is a possibly empty type substitution introduced by ADDARG steps. By taking  $ty_1 = \alpha \theta \sigma$  and  $ty_2 = (\gamma \rightarrow \tau) \theta \sigma$ , we have that  $\mathcal{S}_4$  is a simple system that contains a pair of form (\*).

**Lemma 2.** *Even if  $U$  is restricted, such that no transformation steps are carried out on flex-flex pairs,  $U$  can still produce redundant unifiers.*

*Proof.* Consider the simple system  $\{ \langle Xa, a \rangle \}$ . Then by a single application of I-narrow the unifier  $\{ X \rightarrow \mathbf{I} \}$  can be produced. Alternatively the derivation path  $\{ \langle Xa, a \rangle \} \Rightarrow_{SXX'-narrow} \{ \langle X'a(X''a), a \rangle \} \Rightarrow_{K-narrow} \Rightarrow \{ \langle a, a \rangle \}$  can be followed leading to the unifier  $\{ X \rightarrow \mathbf{SKX''} \}$ .  $\mathbf{SKX''} =_c \mathbf{I}$  and is thus a redundant unifier.

Lemmas 1 and 2 show that Dougherty's algorithm, whilst interesting from a theoretical aspect, is not suitable for a practical implementation. In as yet unpublished work [4], Bentkamp et al. present a modification of the given-clause algorithm that deals with possibly infinite streams of unifiers. But even such a method would be unable to handle Dougherty's algorithm as almost all unification problems are likely to be non-terminating quickly leading to memory issues on difficult problems. Instead, we propose a modification to the algorithm that eliminates these unpleasant properties at the cost of completeness.

## 4 Restricted Combinatory Unification

The pair of problems identified with Dougherty's algorithm in the previous section are both linked to the SXX'-narrow transform. As this step introduces type variables, typing cannot be used to restrict its application. In our modification of Dougherty's algorithm,

we remove this head-narrow step. As this step was the only one to introduce type variables, polymorphism can now be eliminated. The three polymorphic combinator axioms used in the HEADNARROW step now become an infinite set of monomorphic axioms. To this set two new axioms schemas are added related to the  $C$  and  $B$  combinators. These schemas are  $BXYZ = X(YZ)$  and  $CXYZ = XZY$ . The  $C$  and  $B$  combinators are redundant, in the sense that they can be defined in terms of  $S$ ,  $K$  and  $I$ , yet their usage often makes combinatory terms smaller.

Below, the modifications to Dougherty's algorithm are presented. The resulting algorithm is referred to as Restricted Combinatory Unification or RCU. In the calculation of the unifier  $\theta$  in the steps below, no type unification is required. Further Dougherty's syntactic transformation step TYPEUNIFY is no longer required resulting in DECOMP and ELIMINATE being the only syntactic transforms needed.

**Definition 3.** *The set of all variables contained in a system  $\mathcal{S}$ , denoted  $vars(\mathcal{S})$ , is divided into two disjoint subsets  $R$  and  $B$ . Members of  $R$  are referred to as **red** variables and members of  $B$  as **blue** variables. We define  $R = \{X \in vars(\mathcal{S}) \mid X \text{ introduced by CX-narrow transform}\}$  and  $B = vars(\mathcal{S}) - R$ .*

1. The following WEAKREDUCE rules are added in addition to the three in Dougherty's algorithm.

$$\{\langle B \ t \ t' \ t'' \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad \Longrightarrow \quad \{\langle t \ (t' t'') \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad (\text{B-reduce})$$

$$\{\langle C \ t \ t' \ t'' \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad \Longrightarrow \quad \{\langle t \ t'' \ t' \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad (\text{C-reduce})$$

2. The SXX'-narrow step is removed from Dougherty's rules and the following HEADNARROW steps are added. In all cases,  $\theta$  is the syntactic (first-order) unifier of a non-variable prefix subterm and the left-hand side of a suitably renamed combinator axiom.

$$\{\langle X \ t \ t' \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad \Longrightarrow \quad \{\langle X' \ (t \ t') \ \overline{t_n}, s' \rangle\} \theta \uplus \mathcal{S} \theta \quad (\text{BX-narrow})$$

$$\{\langle X \ t \ t' \ t'' \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad \Longrightarrow \quad \{\langle t \ (t' t'') \ \overline{t_n}, s' \rangle\} \theta \uplus \mathcal{S} \theta \quad (\text{B-narrow})$$

$$\{\langle X \ t \ t' \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad \Longrightarrow \quad \{\langle X' \ t' \ t \ \overline{t_n}, s' \rangle\} \theta \uplus \mathcal{S} \theta \quad (\text{CX-narrow})$$

Where  $X$  is not a **red** variable

$$\{\langle X \ t \ t' \ t'' \ \overline{t_n}, s' \rangle\} \uplus \mathcal{S} \quad \Longrightarrow \quad \{\langle t \ t'' \ t' \ \overline{t_n}, s' \rangle\} \theta \uplus \mathcal{S} \theta \quad (\text{C-narrow})$$

The reason for the restriction on the CX-narrow step is to prevent infinite computation paths such as  $\langle Xab, s \rangle \Longrightarrow \langle X'ba, s \rangle \Longrightarrow \langle X''ab, s \rangle \Longrightarrow \dots$ . The convention that no transformations are carried out on solved or trivial pairs is adopted.

Restricting Dougherty's algorithm would be of little interest if the restricted version suffered the same problems as the original. This is not the case with RCU.

**Theorem 1.** *Every sequence of RCU transformations terminates*



*Proof.* A proof sketch is provided here (see Appendix A for full proof). Dougherty proves that the set of transforms WEAKREDUCE, DECOMP and ADDARG are terminating. We reduce the proof of termination of RCU to this proof by showing that the remaining transformation can only appear finitely many times on a computation path. Intuitively, for any type  $\sigma$ ,  $size(\sigma)$  is the number of ‘ $\rightarrow$ ’s in  $\sigma$ .

- Each of transforms ELIMINATE and SPLIT, reduce the number of unsolved variables in a system by 1, whilst all other transforms maintain or reduce this measure.
- For HEADNARROW, consider the measure  $(\sum_{v \in vars(S)} size(type(v)) , \#S)$  where  $\#S$  is the number of blue variables in a system  $S$ . HEADNARROW reduces this measure whilst WEAKREDUCE, DECOMP and ADDARG maintain or reduce it.

An obvious corollary of Theorem 1 is that RCU is not a complete HOU algorithm. It does not, in general, find the csu. It would be of interest to compare RCU with other restricted forms of higher-order unification such as pattern unification [22]. However, it is not readily comparable with pattern unification and similar restrictions, as these tend to be restrictions on the *input terms* whilst RCU is a restriction on the *transformations*. As such, it most closely resembles depth-bound version of Huet’s algorithm. We have not studied the complexity of RCU, but in Section 6, empirical evidence is presented that suggests its performance is reasonable.

## 5 Imperfect Filtering

In first-order provers, unification is generally carried out via term-indexes. Let  $R$  be a relationship on terms. A term-indexing data-structure stores terms in a manner that facilitates the rapid retrieval of all terms  $l$  such that  $R(l, t)$  for some *query term*  $t$ . In the context of theorem-proving, the relationship  $R$  could be “is unifiable with”, “is a generalisation of” etc. Indexing structures for first-order theorem proving have been intensively studied and efficient indexing structures such as substitution trees, fingerprint indexes and perfect discrimination trees have been developed.

These structures are either *perfect* or *imperfect* depending on whether they return all and only those terms that match the query, or they return some sub/superset of the same. Substitution trees stores substitutions in their nodes. Variables of the form  $*_i$  are used to denote substitutions in the tree. The equation  $*_i = t$  represents the substitution of the variable  $*_i$  by the term  $t$ . A path from the root to a leaf represents a term formed by the composition of substitutions on the path (view Figure 1). Substitution trees act as perfect filters for first-order unification. This is achieved by traversing the tree left-right depth-first. In the root, the query term is unified with  $*_0$ . Each time we move down to a node  $*_i = t$  the current unifier is extended with the unifier of  $(*_i, t)$  in what is known as *incremental unification*. On backtracking, the unifier is reset to its previous value.

With respect to higher-order unification, some work has been carried out on developing indexing data structures [20] [24], but has gained little acceptance. In [28] the author suggests that the reason for this is the complexity or undecidability of many of the operations required to build and maintain higher-order indexing structures. For example, higher-order unification, anti-unification and matching are all either undecidable or have large complexities. This is a daunting obstacle to developing perfect higher-order indexing structures. However, it does not preclude the development of imperfect filters.

We have modified substitution trees to act as imperfect filters for higher-order unification. The insights behind this modification are two-fold:

1. If two terms disagree on a function symbol that is not below an applied variable or combinator, then the terms have no higher-order unifier
2. Two terms that are first-order can only have a first-order unifier

**Description of Filtering Algorithm** prior to any term being inserted into the tree all higher-order subterms are replaced with special sort-correct constants  $\#_\tau$  not appearing in the input. We call this process *hashing* and its inverse *de-hashing*. When performing incremental unification, ‘ $\#$ ’s unify with all terms. Let  $t$  be a query term and  $T$  a hashed substitution tree. The filtering algorithm works as follows:

1. Calculate  $t' = \text{hash}(t)$ .
2. Run the standard first-order algorithm to find all unification partners of  $t'$  in  $T$ . Let  $U = \{\langle \sigma_i, t_i \rangle \mid t_i \text{ unifies with } t' \text{ with unifier } \sigma_i\}$  be the output of this algorithm.
3. For all  $\langle \sigma_i, t_i \rangle$  in  $U$ , if both  $t$  and  $\text{dehash}(t_i)$  are first-order then return  $\sigma_i$  as the only unifier of  $t$  and  $\text{dehash}(t_i)$ .<sup>2</sup>
4. Otherwise the pair  $\langle t, t_i \rangle$  has passed filtering and is handed over to RCU.

**Correctness of Algorithm** to show that the algorithm is correct, we need to show that (1) if incremental unification at a node  $*_i = t$  fails due to CLASH or OCCURSCHECK (terminology from [1]), then for all terms sharing this substitution, none of them can have a higher-order unifier with the query term. We also need to show that (2) if two terms are first-order then higher-order unification can only produce the first-order unifier. The following two lemmas are used to show (1).

**Lemma 3.** *If  $t|_p = s$  for first-order position  $p$ , then  $(t\theta)|_p = s\theta$  for all substitutions  $\theta$ .*

*Proof.* Proof is by induction on the length of  $p$ . If  $p = \epsilon$  then  $t\theta|_\epsilon = t\theta = s\theta$ . In the inductive case,  $t\theta|_p = t\theta|_{p'.i} \stackrel{IH}{=} (\zeta \ s'_1 \dots s'_{i-1}, s, s'_{i+1} \dots s'_n)\theta|_i = (\zeta \ s'_1\theta \dots s'_{i-1}\theta, s\theta, s'_{i+1}\theta \dots s'_n\theta)|_i = s\theta$ .

**Lemma 4.** *Let  $p$  be a first-order position in terms  $t_1$  and  $t_2$ . Then  $t_1$  and  $t_2$  have no higher-order unifiers if:*

1. *Both  $\text{head}(t_1|_p)$  and  $\text{head}(t_2|_p)$  are first order and  $\text{head}(t_1|_p) \neq \text{head}(t_2|_p)$*
2.  *$t_1|_p = X$ ,  $X$  occurs in  $t_2|_p$  at a first-order position and  $X \neq t_2|_p$  or vice versa.*<sup>3</sup>

<sup>2</sup> The implementation differs here slightly from the algorithm by returning  $\sigma_i$  if  $t$  and  $\text{dehash}(t_i)$  are variable disjoint and linear and all higher-order subterms of  $t$  are beneath a variable in first-order position in  $\text{dehash}(t_i)$  and vice versa. Proving the correctness of this is difficult, so it has been dropped from the algorithm.

<sup>3</sup> In an earlier version of this paper, this part of the lemma incorrectly had ‘ $X \in \text{vars}(t_2|_p)$ ’ rather than the correct condition ‘ $X$  occurs in  $t_2|_p$  at a first-order position’. This error is reflected in our implementation where filtering rejects pairs such as  $\langle X, IX \rangle$ . This does not affect the soundness of RCU, but does affect its completeness. We conjecture that without this error, RCU would be more useful rather than less and therefore our experimental results are valid. We thank the anonymous reviewer who pointed out this error.

*Proof.* Assume that  $\theta$  is a unifier of  $t_1$  and  $t_2$ . Let  $t_1|_p$  be  $s_1$  and  $t_2|_p$  be  $s_2$ . By Lemma 3,  $(t_1|_p)\theta = s_1\theta$  and  $(t_2|_p)\theta = s_2\theta$ . Therefore, we must have that  $s_1\theta = s_2\theta$ .

In case (1),  $s_1 = f \overline{s'_n}$ ,  $s_2 = g \overline{t'_m}$  and  $f \neq g$ . However,  $s_1\theta = (f \overline{s'_n})\theta = f \overline{(s'_n\theta)} \neq g \overline{(t'_m\theta)} = (g \overline{t'_m})\theta$  and thus  $\theta$  cannot be a unifier.

In case (2),  $s_1 = X$  and  $s_2 = \zeta \overline{t_n}$  such that for some  $t_i$  and position  $p'$ ,  $t_i|_{p'} = X$ . By Lemma 3 and the fact  $i.p'$  is a first-order position in  $s_2$ , we have that  $s_2\theta|_{i.p'} = X\theta$ . But then we cannot have that  $s_1\theta = s_2\theta$  since  $|s_1\theta| = |X\theta| \leq |t_i\theta| < |\zeta \overline{(t_n)}\theta| = |s_2\theta|$ .

Now consider incremental unification at a node  $*_i = t$ . Assume that  $*_i$  is bound to a subterm  $t'$  of the hashed query term. If a CLASH occurs in unifying  $t$  with  $t'$ , then the query term and all terms sharing the substitution  $*_i = t$  must disagree on a head symbol occurring at a first-order position. By Lemma 4, the query term and all terms sharing the substitution  $*_i = t$  can have no higher-order unifiers. The case where unification of  $t$  and  $t'$  fails due to OCCURSCHECK is similar.

To show (2) we prove the following lemma.

**Lemma 5.** *Let  $t_1$  and  $t_2$  be first-order terms. Then, for any computation path  $\{\langle t_1, t_2 \rangle\} \implies^* S'$ , we have:*

1. *All terms in  $S'$  are first-order.*
2. *In the computation path, only DECOMP and ELIMINATE are used.*

*Proof.* Proof by induction on the length of the  $\implies^*$  path. The base case is trivial. In the inductive case, after  $p$  steps the original system is transformed into  $\{\langle s_1, s_2 \rangle \dots \langle s_{n-1}, s_n \rangle\}$  where each  $s_i$  is first-order by the induction hypothesis. In the  $p + 1$  step, an arbitrary pair  $\langle s_i, s_{i+1} \rangle$  is transformed. If either  $s_i$  or  $s_{i+1}$  is a variable then the transformation is ELIMINATE and the resulting system again contains only first-order terms. Otherwise  $s_i$  and  $s_{i+1}$  are of the form  $\zeta \overline{t_m}$  and  $\zeta \overline{r_m}$  and the only applicable step is DECOMP. After performing DECOMP, the resulting system is  $\{\langle s_1, s_2 \rangle \dots \langle t_m, r_m \rangle \dots \langle s_{n-1}, s_n \rangle\}$  and again all terms are first-order.

Since the usage of DECOMP and ELIMINATE is deterministic, and these two transforms form a sound and complete unification algorithm for syntactic first-order unification [1], we have that if two terms are first-order and unifiable then running RCU on the terms will result in the single mgu produced by first-order unification. The result is presented in terms of RCU, but is in reality general.

**Example** Consider searching the tree in Figure 1 for unifiers of  $g(f X)b$ . The original substitution is  $\sigma_0 = \{*_0 \rightarrow g(f X)b\}$ . In the root, the substitution is extended to unify  $*_0$  with  $g *_1 *_2$  resulting in  $\sigma_1 = \sigma_0 \cup \{*_1 \rightarrow f X, *_2 \rightarrow b\}$ . In the left child,  $*_1$  is unified with  $\#$ . This succeeds without adding anything to the unifier, so  $\sigma_3 = \sigma_2$ . Finally, in the left-most leaf,  $*_2$  is unified with  $b$ , again succeeding with the empty substitution. The search then backtracks and attempts to enter the second-to-left leaf. This requires unifying  $*_2$  which is bound to  $b$ , with  $c$  and fails due to CLASH. The terms  $g(f X)b$  and  $g(I a)c$  can have no unifiers as symbols  $b$  and  $c$  which are not below a variable or combinator disagree.

The set of terms eventually returned by the query is  $\{g(X\ a)b, g(f\ a)b, g(f(Z\ d))b\}$ . As both  $g(f\ X)b$  and  $g(f\ a)b$  are first-order, RCU does not need to run on this pair. RCU is run on the pairs  $\langle g(f\ X)b, g(X\ a)b \rangle$  and  $\langle g(f\ X)b, g(f(Z\ d))b \rangle$

Note that if the input problem is first-order, then all terms in the index and all query terms will be first-order. Thus, in this case, unification will always be first-order unification, and the addition of RCU to Vampire is *graceful* in the sense of [3].

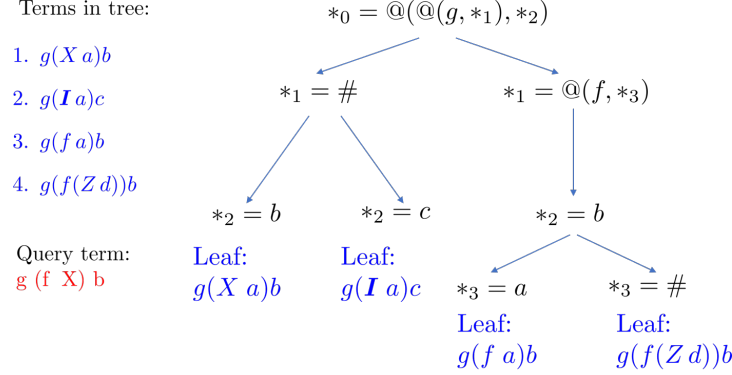


Fig. 1: Example of substitution tree being used as a filter for higher-order unification. The query will return terms (1),(3) and (4). Higher-order unification only needs to be run on the pair  $\langle g(f\ X)b, g(X\ a)b \rangle$

## 6 Experimental Results

As with most successful first-order provers, Vampire is a portfolio prover. In finding a proof, it runs a set of *strategies* known as a *schedule*. Each strategy is a predefined set of proof search parameters. Normally, if a problem is solvable, it is solvable within a short space of time using a particular strategy. We created two custom higher-order schedules that include various options linked to higher-order proof search. These options are described in Table 1. Further details can be found in [5].

To evaluate the effect of combinatory unification, two experiments were run. In the first experiment, we ran Vampire twice using one of its higher-order schedules, once with combinatory unification forced on and once with it forced off, over the higher-order portion of the TPTP library. The time limit was 500s. The results of this experiment can be found in Table 2. Forcing combinatory unification on leads to 90 new proofs, demonstrating its value.

In the second experiment, the CASC-2018 versions of leading higher-order theorem provers, Leo-III version 1.3 and Satallax version 3.3 [6] were run on the monomorphic higher-order section of the TPTP library alongside Vampire HOL. Attention was restricted to problems that are not known to be satisfiable as both Leo-III and Vampire

Table 1: Higher-order parameters in Vampire

| Option Name                           | Description  |
|---------------------------------------|--|
| <code>equality_to_equiv</code>        | A preprocessing option. If set on, equality between boolean terms is converted into equivalence  |
| <code>always_use_proxies</code>       | A preprocessing option. If set on, logical constants are always translated to ‘proxy’ functions  |
| <code>add_func_ext_ax</code>          | Adds a set of functional extensionality axioms to the problem based on the sorts present in the input  |
| <code>extended_narrowing</code>       | Switches on an inference rule similar to primitive substitution. An attempt is made to ‘guess’ the logical structure of literals with variable heads.  |
| <code>hol_constant_elimination</code> | Switches on a set of inference rules to handle logical proxies.  |
| <code>hol_short_circuit_eval</code>   | An inference rule that allows logical proxies not at the literal level to be replaced by boolean values.   |
| <code>comb_unif</code>                | Switches on off combinatory unification as described in this paper   |
| <code>comb_select_val</code>          | Defines how to handle look-ahead literal selection when running with combinatory unification. This option can be set to <code>actual</code> in which case combinatory unification is run to ascertain the number of inferences possible were a particular literal to be selected. Other options include setting a penalty for potential inferences that use combinatory unification. |
| <code>combinator_elimination</code>   | This option can be set to <code>axioms</code> in which case combinators are axiomatised. It can be set to <code>inference_rules</code> to enable a set of inferences that rewrite fully applied combinators. Axioms and rewriting can be used together by setting the option to <code>both</code>  |
| <code>add_combinators</code>          | The <code>add_combinators</code> heuristically adds combinators to the problem based on the sorts present in the input. A further option controls the number of combinators added.   |

are incomplete. This leaves 2727 problems which are either theorems, unsatisfiable or unknown. A (wall-clock) time limit of 520s per problem was used. The results of this experiment can be found in Table 3. Despite the fact that Leo-III and Satallax have been tuned to the higher-order portion of the TPTP library, Vampire is reasonably close to them. It is conjectured that with more time to fettle the higher-order schedules, Vampire’s figures would be even closer.

We also tested Vampire against Leo-III and Satallax on a set of 1253 benchmarks generated by Sledgehammer, kindly made available to us by the Matryoshka team. Following their naming convention, these benchmarks are referred to as SH- $\lambda$ . For this test all provers were run with a 300s CPU time limit.

The experiments were performed on StarExec [30] nodes equipped with four Intel Xeon E5-2609 0 CPUs each with 8192 MB of memory and clock speed 2.40 GHz.

Table 2: Combinatory unification on and off

|                | Number Solved | Number of Uniques |
|----------------|---------------|-------------------|
| <b>RCU on</b>  | 1894          | 90                |
| <b>RCU off</b> | 1893          | 89                |

Table 3: Number of problems proved theorem or unsat

|                    | TPTP problems | SH- $\lambda$ |
|--------------------|---------------|---------------|
| <b>Vampire HOL</b> | 1947          | 714           |
| <b>Leo-III</b>     | 2097          | 668           |
| <b>Satallax</b>    | 2095          | 513           |

Our experimental data is publicly available<sup>4</sup>. Amongst the TPTP benchmarks, Vampire solves 31 problems not solved by Leo-III and Satallax<sup>5</sup>. Out of these problems, 3 (SEV016<sup>56</sup>, SEV032<sup>5</sup> and SEU684<sup>1</sup>) are difficulty rating 1.00 problems, meaning that they are unsolvable by any current theorem prover. Amongst the 31 problems 18 are solved by strategies that utilise combinatory unification showing its value. On the SH- $\lambda$  benchmarks, Vampire solves 53 problems that Leo-III and Satallax cannot. All 53 as well as 560 other problems are solved by strategies that use combinatory unification.

Finally, we investigated the efficiency of combinatory unification. It would have been interesting to compare it against first-order unification, but this is not possible in Vampire as first order unification is carried out incrementally whilst RCU is carried out term-to-term. Instead, the amount of time spent on RCU in each run was recorded as well as the number of unifiers produced. The results can be found in Table 4. It can be seen that combinatory unification is not dominating the running time. Further the number of combinatory unifiers produced suggests that whatever the worst case complexity is, in practice the procedure is efficient.

## 7 Conclusion and Related Work

Pragmatic approaches to higher-order theorem proving include Otter- $\lambda$ , a prover for lambda logic [2] developed by Michael Beeson. Lambda logic is a relatively weak extension of first-order logic. Also included is Cruanes’ prover Zipperposition [8] which he extended to HOL. The prover rewrites using the combinator definitions which resembles our approach, but is less goal directed.

<sup>4</sup> The csv output files along with instructions on obtaining benchmarks and provers can be found at [https://github.com/vprover/vampire\\_publications/tree/master/experimental\\_data/CADE-2019-RCU](https://github.com/vprover/vampire_publications/tree/master/experimental_data/CADE-2019-RCU)

<sup>5</sup> Some of these problems are marked as being solvable by Satallax on the TPTP website. However, the CASC-2018 version of Satallax that we used in our tests was unable to find a proof

<sup>6</sup> Though this problem can be solved by the new version of E, Ehoh developed by Vukmirović et al.

Table 4: Efficiency of RCU

| Problem Category | Average time spent on combinatory unification (as % of total time) | Average number of unifiers produced per problem |
|------------------|--|---|
| <b>SYO</b>       | 11.71%   | 63764   |
| <b>SEU</b>       | 9.5%   | 42968   |
| <b>SET</b>       | 9.89%  | 57339   |
| <b>NUM</b>       | 9.55%  | 22779   |
| <b>ALG</b>       | 11.08%   | 54723   |

The approach we present here resembles that taken by the Leo-III higher-order prover [29]. Leo-III implements Huet’s complete algorithm for higher-order unification, but then imposes a depth bound, thereby losing completeness. It is felt that RCU is more amenable to implementation within a first-order prover than depth-bound Huet’s algorithm and therefore our approach is complementary. By retaining the ordering restrictions of the superposition calculus, our approach further resembles that of Leo-III which makes use of the computational path order (CPO) further losing completeness.

Related to our work is the Matryoshka team’s extension of superposition to lambda-free higher-order logic [3] and, in as yet unpublished work, to full higher-order logic [4]. Their approach aims for completeness and thus has to deal with possible infinite sets of unifiers. Due to the incompleteness of our method, there will certainly be problems provable by a complete calculus that are inaccessible to us. On the other hand, it appears likely that, at least on some problems, the overhead of dealing with infinite streams of possibly redundant unifiers will allow lightweight but incomplete solutions such as RCU to outperform complete methods. However, what promises to be an interesting empirical comparison of the two approaches is future work.

As far as restrictions to higher-order unification are concerned, our approach adds to a long list of attempts to devise useful restrictions. Foremost amongst these are *pattern unification* [22] and its generalisation by Libal and Miller [19]. Pattern unification has gained popularity, because it is decidable and mgus exist. Bounding the number of ‘ $\lambda$ ’s that can appear in a unifier has been shown to make higher-order unification decidable [26]. Various other restrictions have been shown to either be decidable or undecidable in [18] and [25]. As far as we are aware, we are the first to address restrictions to combinatory higher-order unification algorithms.

On the mildly higher-order Sledgehammer benchmarks, Vampire with RCU outperformed full higher-order solvers. It remains to be investigated precisely what role combinatory unification played in this. It also remains to be seen whether this results holds across larger benchmark sets. Other lines of investigation, include implementing Dougherty’s algorithm, but utilising it in a limited form. Consider the following inference which we call HYPEREQRES:

$$\frac{t_1 \neq t_2 \vee t_3 \neq t_4 \dots \vee t_{n-1} \neq t_n}{\Box} \text{HYPEREQRES}$$

where Dougherty’s algorithm is used to find a unifier  $\theta$  that simultaneously unifies each pair of terms. As this leads directly to a refutation, the problem of redundant unifiers

is circumvented. Likewise, polymorphism can be restricted to the unification algorithm and there is no need to introduce it to the prover’s kernel. Finally, it would be interest to evaluate the usage of substitution trees as imperfect filters. On average what percentage of terms in the index are discarded? In practice, how often does first-order unification suffice?

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## A Restricted Combinatory Unification is Terminating

We prove the termination of an algorithm identical to RCU, except that reductions can be performed at all positions. That RCU is terminating follows immediately. A straightforward corollary of this is that RCU is incomplete.

**Lemma 6.** *For any (finite) system  $\mathcal{S}$ , if there exists an infinite RCU computation path on  $\mathcal{S}$ , then there exists a system  $\mathcal{S}'$  such that  $\mathcal{S} \Longrightarrow^* \mathcal{S}'$  and there exists an infinite computation path on  $\mathcal{S}'$  that does not include the ELIMINATE or SPLIT transforms.*

*Proof.* Both ELIMINATE and SPLIT reduce the number of unsolved variables in  $\mathcal{S}$ . As  $\mathcal{S}$  is finite, it can only contain a finite number of unsolved variables. A case analysis of the other rules shows that either they reduce the number of unsolved variables or leave it unchanged. Thus SPLIT and ELIMINATE can only be carried out a finite number of times.  $\square$

Based on Lemma 6, to prove that RCU is terminating, it suffices to prove that RCU without the eliminate and split transforms is terminating. Call the resulting set of transformation rules RCU $-$ . Next a result analogous to 6 is proved with respect to the HEADNARROW transformation.

**Definition 4 (Size).** *The size of a type  $\sigma$  is defined inductively as follows:*

- $\sigma$  is atomic, the  $size(\sigma) = 0$
- $\sigma = \alpha \rightarrow \beta$ , then  $size(\sigma) = size(\alpha) + size(\beta) + 1$

*For a term  $t$ , its type is denoted by  $\tau(t)$*

Intuitively,  $size(\sigma)$  is the number of ‘ $\rightarrow$ ’s in  $\sigma$ .

**Lemma 7.** *For any (finite) system  $\mathcal{S}$ , if there exists an infinite RCU $-$  computation path on  $\mathcal{S}$ , then there exists a system  $\mathcal{S}'$  such that  $\mathcal{S} \Longrightarrow^* \mathcal{S}'$  and there exists an infinite computation path on  $\mathcal{S}'$  that does not include the head narrow transform.*

*Proof.* Consider the following measure on systems:

$$\left( \sum_{v \in vars(\mathcal{S})} size(\tau(v)) , \# \mathcal{S} \right)$$

Where the pairs are compared lexicographically and  $\# \mathcal{S}$  denotes the number of blue variables in  $\mathcal{S}$  or equivalently, the cardinality of  $\mathcal{B}$ . The transformation rules of RCU $-$ , other than head narrow, keep this measure constant or reduce it. HEADNARROW reduces the measure, so there can only be a finite number of applications of head narrow. The former claim is demonstrated for a number of HEADNARROW steps:

1. KX-narrow. For a variable  $X$  to be eligible for a KX-narrow step, it must have type  $\alpha \rightarrow \beta$ . It is replaced by a term  $\mathbf{K}_{\beta \rightarrow \alpha \rightarrow \beta} X'_\beta$ . Clearly  $size(\tau(X')) < size(\tau(X))$  and so the first item of the measure is reduced.
2. BX-narrow. For a variable  $X$  to be eligible for a BX-narrow step, it must have type  $(\alpha \rightarrow \beta) \rightarrow \alpha \rightarrow \gamma$ . It is replaced by a term  $\mathbf{B}_{(\beta \rightarrow \gamma) \rightarrow (\alpha \rightarrow \beta) \rightarrow \alpha \rightarrow \gamma} X'_{\beta \rightarrow \gamma}$ . Again  $size(\tau(X')) < size(\tau(X))$  and so the first item of the measure is reduced.

3. CX-narrow. In this case, the size of the type of the variable being narrowed is not reduced. For a variable  $X$  to be eligible for a CX-narrow step, it must have type  $\alpha \rightarrow \beta \rightarrow \gamma$ . It is replaced by a term  $C_{(\beta \rightarrow \alpha \rightarrow \gamma) \rightarrow \alpha \rightarrow \beta \rightarrow \gamma} X'_{\beta \rightarrow \alpha \rightarrow \gamma}$ . Here  $size(\tau(X')) = size(\tau(X))$ . However, each CX-narrow step replaces a **blue** variable with a **red** variable and therefore the second item of the measure is reduced.  $\square$

Based on Lemma 7 to prove that RCU– is terminating, it suffices to prove that RCU– without the HEADNARROW transformation is terminating. This is precisely Dougherty’s VT transformations which he has proven to be terminating in [11]. Therefore we have:

**Theorem 2.** *Every sequence of RCU transformations terminates*