# Compression of First-Order Resolution Proofs by Partial Regularization

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Abstract. This paper describes a generalization of the recently developed RecyclePivotsWithIntersection algorithm applicable to first-order logic proofs generated by automated theorem provers. RecyclePivotsWithIntersection removes inferences with a node  $\eta$  when its pivot literal occurs as the pivot of another inference located below in the path from  $\eta$  to the root of the proof. The algorithm is then combined with GreedyLinearFirstOrderLowerUnits in order to compress first-order proofs further. A preliminary empirical evaluation of the combination of these compression algorithms is presented.

### 1 Introduction

Most of the effort in automated reasoning so far has been dedicated to the design and implementation of proof systems and efficient theorem proving procedures. As a result, saturation-based first-order automated theorem provers have achieved a high degree of maturity, with resolution and superposition being among the most common underlying proof calculi. Proof production is an essential feature of modern state-of-the-art provers and proofs are crucial for applications where the user requires certification of the answer provided by the prover. Nevertheless, efficient proof production is non-trivial, and it is to be expected that the best, most efficient, provers do not necessarily generate the best, least redundant, proofs. Therefore, it is a timely moment to develop methods that post-process and simplify proofs.

For proofs generated by SAT- and SMT-solvers, which use propositional resolution as the basis for the DPLL and CDCL decision procedures, there is now a wide variety of proof compression techniques. Algebraic properties of the resolution operation that might be useful for compression were investigated in [5]. Compression algorithms based on rearranging and sharing chains of resolution inferences have been developed in [1] and [10]. Cotton [4] proposed an algorithm that compresses a refutation by repeteadly splitting it into a proof of a heuristically chosen literal  $\ell$  and a proof of  $\bar{\ell}$ , and then resolving them to form a new refutation. The Reduce&Reconstruct algorithm [9] searches for locally redundant subproofs that can be rewritten into subproofs of stronger clauses and

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with fewer resolution steps. A linear time proof compression algorithm based on partial regularization was proposed in [2] and improved in [6]. Furthermore, [6] also described a new linear time algorithm called LowerUnits, which delays resolution with unit clauses.

In contrast, for first-order theorem provers, there has been up to now (to the best of our knowledge) no attempt to design and implement an algorithm capable of taking a first-order resolution DAG-proof and efficiently simplifying it, outputting a possibly shorter pure first-order resolution DAG-proof. There are algorithms aimed at simplifying first-order sequent calculus tree-like proofs, based on cut-introduction [8, 7], and while in principle resolution DAG-proofs can be translated to sequent-calculus tree-like proofs (and then back), such translations lead to undesirable efficiency overheads. There is also an algorithm [12] that looks for terms that occur often in any TSTP [11] proof (including first-order resolution DAG-proofs) and introduces abbreviations for these terms. However, as the definitions of the abbreviations are not part of the output proof, it cannot be checked by a pure first-order resolution proof checker.

In this paper, we continue the process of lifting propositional proof compression techniques to the first-order case, by lifting the RecyclePivotsWithIntersection algorithm. As shown in Section 3, the fact that first-order resolution makes use of unification leads to many challenges that simply do not exist in the propositional case. In Section 4 we describe modifications necessary to overcome these challenges. In Section 5 we present preliminary experimental results obtained by applying this algorithm along with GreedyLinearFirstOrderLowerUnits on hundreds of proofs generated with the SPASS theorem prover. The next section introduces the first-order resolution calculus using notations that are more convenient for describing proof transformation operations.

#### 2 The Resolution Calculus

We assume that there are infinitely many variable symbols (e.g.  $X, Y, Z, X_1, X_2$ )  $\ldots$ ), constant symbols (e.g.  $a, b, c, a_1, a_2, \ldots$ ), function symbols of every arity (e.g.  $f, g, f_1, f_2, ...$ ) and predicate symbols of every arity (e.g.  $p, q, p_1, p_2, ...$ ). A term is any variable, constant or the application of an n-ary function symbol to nterms. An atomic formula (atom) is the application of an n-ary predicate symbol to n terms. A literal is an atom or the negation of an atom. The complement of a literal  $\ell$  is denoted  $\ell$  (i.e. for any atom  $p, \overline{p} = \neg p$  and  $\overline{\neg p} = p$ ). The set of all literals is denoted  $\mathcal{L}$ . A clause is a multiset of literals.  $\perp$  denotes the empty clause. A unit clause is a clause with a single literal. Sequent notation is used for clauses (i.e.  $p_1, \ldots, p_n \vdash q_1, \ldots, q_m$  denotes the clause  $\{\neg p_1, \ldots, \neg p_n, q_1, \ldots, q_m\}$ ). FV(t) (resp.  $FV(\ell)$ ,  $FV(\Gamma)$ ) denotes the set of variables in the term t (resp. in the literal  $\ell$  and in the clause  $\Gamma$ ). A substitution  $\{X_1 \setminus t_1, X_2 \setminus t_2, \ldots\}$  is a mapping from variables  $\{X_1, X_2, \ldots\}$  to, respectively, terms  $\{t_1, t_2, \ldots\}$ . The application of a substitution  $\sigma$  to a term t, a literal  $\ell$  or a clause  $\Gamma$  results in, respectively, the term  $t\sigma$ , the literal  $\ell\sigma$  or the clause  $\Gamma\sigma$ , obtained from t,  $\ell$  and  $\Gamma$  by replacing all occurrences of the variables in  $\sigma$  by the corresponding terms in  $\sigma$ . The set

of all substitutions is denoted S. A unifier of a set of literals is a substitution that makes all literals in the set equal. A resolution proof is a directed acyclic graph of clauses where the edges correspond to the inference rules of resolution and contraction (as explained in detail in Definition 1). A resolution refutation is a resolution proof with root  $\bot$ .

## Definition 1 (First-Order Resolution Proof).

A directed acyclic graph  $\langle V, E, \Gamma \rangle$ , where V is a set of nodes and E is a set of edges labeled by literals and substitutions (i.e.  $E \subset V \times 2^{\mathcal{L}} \times \mathcal{S} \times V$  and  $v_1 \stackrel{\ell}{\underset{\sigma}{\longrightarrow}} v_2$  denotes an edge from node  $v_1$  to node  $v_2$  labeled by the literal  $\ell$  and the substitution  $\sigma$ ), is a proof of a clause  $\Gamma$  iff it is inductively constructible according to the following cases:

- **Axiom:** If  $\Gamma$  is a clause,  $\widehat{\Gamma}$  denotes some proof  $\langle \{v\}, \varnothing, \Gamma \rangle$ , where v is a new (axiom) node.
- **Resolution:** If  $\psi_L$  is a proof  $\langle V_L, E_L, \Gamma_L \rangle$  with  $\ell_L \in \Gamma_L$  and  $\psi_R$  is a proof  $\langle V_R, E_R, \Gamma_R \rangle$  with  $\ell_R \in \Gamma_R$ , and  $\sigma_L$  and  $\sigma_R$  are substitutions such that  $\ell_L \sigma_L = \overline{\ell_R} \sigma_R$  and  $\mathrm{FV}((\Gamma_L \setminus \{\ell_L\}) \sigma_L) \cap \mathrm{FV}((\Gamma_R \setminus \{\ell_R\}) \sigma_R) = \emptyset$ , then  $\psi_L \odot_{\ell_L \ell_R}^{\sigma_L \sigma_R} \psi_R$  denotes a proof  $\langle V, E, \Gamma \rangle$  s.t.

$$V = V_L \cup V_R \cup \{v\}$$

$$E = E_L \cup E_R \cup \left\{ \rho(\psi_L) \xrightarrow{\{\ell_L\}} v, \rho(\psi_R) \xrightarrow{\{\ell_R\}} v \right\}$$

$$\Gamma = (\Gamma_L \setminus \{\ell_L\}) \sigma_L \cup (\Gamma_R \setminus \{\ell_R\}) \sigma_R$$

where v is a new (resolution) node and  $\rho(\varphi)$  denotes the root node of  $\varphi$ . The resolved atom  $\ell$  is such that  $\ell = \ell_L \sigma_L = \overline{\ell_R} \sigma_R$  or  $\ell = \overline{\ell_L} \sigma_L = \ell_R \sigma_R$ .

- Contraction: If  $\psi'$  is a proof  $\langle V', E', \Gamma' \rangle$  and  $\sigma$  is a unifier of  $\{\ell_1, \dots \ell_n\}$  with  $\{\ell_1, \dots \ell_n\} \subseteq \Gamma'$ , then  $\lfloor \psi \rfloor_{\{\ell_1, \dots \ell_n\}}^{\sigma}$  denotes a proof  $\langle V, E, \Gamma \rangle$  s.t.

$$V = V' \cup \{v\}$$

$$E = E' \cup \{\rho(\psi') \xrightarrow{\{\ell_1, \dots \ell_n\}} v\}$$

$$\Gamma = (\Gamma' \setminus \{\ell_1, \dots \ell_n\}) \sigma \cup \{\ell\}$$

where v is a new (contraction) node,  $\ell = \ell_k \sigma$  (for any  $k \in \{1, ..., n\}$ ) and  $\rho(\varphi)$  denotes the root node of  $\varphi$ .

The resolution and contraction (factoring) rules described above are the standard rules of the resolution calculus, except for the fact that we do not require resolution to use most general unifiers. The presentation of the resolution rule here uses two substitutions, in order to explicitly handle the necessary renaming of variables, which is often left implicit in other presentations of resolution.

When we write  $\psi_L \odot_{\ell_L \ell_R} \psi_R$ , we assume that the omitted substitutions are such that the resolved atom is most general. We write  $\lfloor \psi \rfloor$  for an arbitrary maximal contraction, and  $\lfloor \psi \rfloor^{\sigma}$  for a (pseudo-)contraction that does merge no literals

but merely applies the substitution  $\sigma$ . When the literals and substitutions are irrelevant or clear from the context, we may write simply  $\psi_L \odot \psi_R$  instead of  $\psi_L \odot_{\ell_L \ell_R}^{\sigma_L \sigma_R} \psi_R$ . The  $\odot$  operator is assumed to be left-associative. In the propositional case, we omit contractions (treating clauses as sets instead of multisets) and  $\psi_L \odot_{\ell \bar{\ell}}^{\emptyset \emptyset} \psi_R$  is abbreviated by  $\psi_L \odot_{\ell} \psi_R$ .

If  $\psi = \varphi_L \odot \varphi_R$  or  $\psi = \lfloor \varphi \rfloor$ , then  $\varphi$ ,  $\varphi_L$  and  $\varphi_R$  are direct subproofs of  $\psi$  and  $\psi$  is a child of both  $\varphi_L$  and  $\varphi_R$ . The transitive closure of the direct subproof relation is the subproof relation. A subproof which has no direct subproof is an axiom of the proof.  $V_{\psi}$ ,  $E_{\psi}$  and  $\Gamma_{\psi}$  denote, respectively, the nodes, edges and proved clause (conclusion) of  $\psi$ . If  $\psi$  is a proof ending with a resolution node, then  $\psi_L$  and  $\psi_R$  denote, respectively, the left and right premises of  $\psi$ .

## 3 First-Order Challenges

In this section, we describe challenges that have to be overcome in order to successfully adapt RecyclePivotsWithIntersection to the first-order case. The first example illustrates the need to take unification into account. The other two examples discuss complex issues that can arise when unification is take into account in a naive way.

Example 1. Consider the following proof  $\psi$ , noting that the proof is largely redundant. Naively computed, the safe literals for  $\eta_3$  are  $\{\vdash q(c), p(a, X)\}$ .  $\eta_1$  and  $\eta_5$  and these two literals are unifiable. Further, the safe literals for  $\eta_1$  includes  $\eta_5$ . Thus the proof can be regularized by recycling  $\eta_1$ .

$$\frac{\eta_{1}: \vdash p(W,X) \qquad \eta_{2}: p(W,X) \vdash q(c)}{\eta_{3}: \vdash q(c)} \frac{\eta_{4}: q(c) \vdash p(a,X)}{\eta_{5}: \vdash p(a,X)} \qquad \eta_{6}: p(Y,b) \vdash \psi: \bot$$

Regularization of the proof by recycling  $\eta_1$  results in deleting the edge between  $\eta_2$  and  $\eta_3$ , which in turn replaces  $\eta_3$  by  $\eta_1$ . Since  $\eta_1$  cannot be resolved against  $\eta_4$ , and  $\eta_1$  contained safe literals,  $\eta_5$  is replaced by  $\eta_1$ . The result is the much shorter proof below.

$$\frac{\eta_1 \colon \vdash p(W,X) \qquad \eta_2 \colon p(Y,b) \vdash}{\psi' \colon \bot}$$

Unlike in the propositional case, where the pivots and their corresponding safe literal list are all syntactically equal, in the first-order case, this is not necessarily the case. As illustrated above, p(W, X) and p(a, X) are not syntactically equal. Nevertheless, they are unifiable, and the proof can be regularized.

Example 2. There are cases, as shown below, that require more careful care when attempting to regularize. Again, naively computed the safe literals for  $\eta_3$  are  $\{\vdash q(c), \ p(a, X)\}$ , and so  $\eta_1$  and  $\eta_2$  appear to be candidates for regularization.

However, if we attempt to regularize the proof, the same series of actions as in Example 1 would result in the following resolution, which cannot be completed.

$$\frac{\eta_1: \vdash p(a,c) \quad \eta_2: p(Y,b) \vdash}{\psi': ??}$$

The observations above lead to the idea of requiring pivots to satisfy the following property before collecting them to be reused.

**Definition 2.** Let  $\eta$  be a clause with literal  $\ell'$  with corresponding safe literal  $\ell$  which is resolved against literals  $\ell_1, \ldots, \ell_n$  in a proof  $\psi$ .  $\eta$  is said to satisfy the pre-regularization unifiability property in  $\psi$  if  $\ell_1, \ldots, \ell_n$ , and  $\overline{\ell'}$  are unifiable.

One technique to ensure this property is met is to apply the unifier of a resolution to each resolvent before computing the safe literals. In the case of Example 2, this would result in  $\eta_1$  having the safe literals  $\{\vdash q(c), p(a,b)\}$ , and now it is clear that the literal in  $\eta_1$  is not safe.

Example 3. Due to complications with unification, there are also cases where satisfying the pre-regularization unifiability property is not sufficient to attempt regularization. Consider the proof of  $\psi$  below. After collecting the safe literals,  $\eta_3$ 's safe literals are  $\{q(B,V), p(c,d) \vdash q(f(a,e),c)\}$ .

Since  $q(f(a, X), Y) \in \eta_2$  and q(B, V) (in  $\eta_3$ 's safe literals) are unifiable, regularization would be attempted. However, in this case, we would mark the edge between  $\eta_2$  and  $\eta_3$  for deletion, and as a result,  $\eta_3$  will be replaced with  $\eta_1$ .  $\eta_1$  does not contain the required pivot for  $\eta_5$ , and so  $\eta_5$  is also replaced with  $\eta_1$ , and resolution is attempted before  $\eta_1$  and  $\eta_6$ , which results in  $\eta'_7$ , and an inability to complete the proof, as shown below.

In order to avoid these scenarios, we perform an additional check during edge deletion. The node  $\eta*$  which will replace a resolution  $\eta$  (because  $\eta$  would have a deleted parent), must be entirely contained, via unification which modifies only

 $\eta^*$ 's variables, in the safe literals of  $\eta$ . In the case of this example,  $\eta_1$  would not satisfy this property: in order to unify with  $\eta_3$ 's safe literals, it would be necessary to send  $V \to Z$  due to  $\eta_1$ 's second literal, but leave V unchanged due  $\eta_1$ 's first literal, which is not possible. Note that this check is not necessary in the propositional case, as the replacement node would be contained exactly in the set of safe literals.

## 4 First-Order RecyclePivotsWithIntersection

This section presents FirstOrderRecyclePivotsWithIntersection (Algorithm 1), a first order generalization of RecyclePivotsWithIntersection, which aims to compress irregular proofs. Recall that RecyclePivotsWithIntersection is a modification of the RecyclePivots algorithm, and RecyclePivotsWithIntersection provides better compression on proofs where nodes have several children, when compared to RecyclePivots. Through a small modification to our algorithm (described later), a first order generalization of RecyclePivots is also possible.

Our generalization, Algorithm 1, follows the propositional idea of traversing the proof in a bottom-up manner, storing for every node a set of *safe literals* that get resolved in all paths below it in the proof (or that already occurred in the root clause of the original proof). If one of the node's resolved literals can be unified to a literal in the set of safe literals, then it may be possible to regularize the node by replacing it by one of its parents.

In the propositional case, regularization of a node replaces it by the parent whose clause contains the resolved literal that is safe. In the first order case, because unification introduces complications like those seen in Example 3, we ensure that the replacement parent is (possibly after unification) contained entirely in the safe literals. This ensures that the remainder of the proof does not expect a variable to be unified to different values simultaneously. After regularization, all nodes below the regularized node may have to be fixed. Similar to RecyclePivotsWithIntersection, instead of replacing the irregular node by one of its parents immediately, its other parent is replaced by deletedNodeMarker, as shown in Algorithm 2. As in the propositional case, fixing of the proof is postponed to another (single) traversal, as regularization

```
input: A first-order proof \psi
output: A possibly less-irregular first-order proof \psi'

1 \psi' \leftarrow \psi;
2 traverse \psi' bottom-up and foreach node \eta in \psi' do
3 if \eta is a resolvent node then
4 setSafeLiterals(\eta);
5 regularizeIfPossible(\eta)
6 \psi' \leftarrow \text{fix}(\psi');
7 return \psi';
```

Algorithm 1: FirstOrderRecyclePivotsWithIntersection

```
input : A node \psi = \psi_L \odot_{\ell_L \ell_R}^{\sigma_L \sigma_R} \psi_R output: nothing (but the proof containing \psi may be changed)

1 if \exists \sigma and l \in \psi.safeLiterals such that \sigma l = l_R or l = \sigma l_R then

2 if \exists \sigma such that \sigma \psi_R \subseteq \psi.safeLiterals then

3 replace \psi_L of \eta by deletedNodeMarker;

4 mark \psi as regularized

5 else if \exists \sigma and l \in \psi.safeLiterals such that \sigma l = l_L or l = \sigma l_L then

6 if \exists \sigma such that \sigma \psi_L \subseteq \psi.safeLiterals then

7 replace \psi_R by deletedNodeMarker;

8 mark \psi as regularized
```

Algorithm 2: regularizeIfPossible

proceeds bottom up and only nodes below a regularized node may require fixing. During fixing, the irregular node is actually replaced by the parent that is not deletedNodeMarker.

The RecyclePivotsWithIntersection and the RecyclePivots algorithms differ from each other mainly in the computation of the safe literals of a node that has many children. While the former returns the intersection as shown in Algorithm 3, the latter returns the empty set. Further, while in RecyclePivotsWithIntersection the safe literals of the root node contain all the literals of the root clause, in RecyclePivots the root node is always assigned an empty set of literals. This is easy accomplished in the first order case by changing lines 11 and 2, respectively, of Algorithm 3. This makes a difference only when the proof is not a refutation.

The set of safe literals of a node  $\eta$  can be computed from the set of safe literals of its children (cf. Algorithm 3), in a manner identical to the propositional case.

```
input : A node \eta
    output: nothing (but the node \eta gets a set of safe literals)
 1 if \eta is a root node with no children then
         \eta.safeLiterals \leftarrow \eta.clause
 3 else
         foreach \eta' \in \eta.children do
 4
              if \eta' is marked as regularized then
 5
                   safeLiteralsFrom(\eta') \leftarrow \eta'.safeLiterals;
 6
              else if \eta is left parent of \eta' then
 7
                   safeLiteralsFrom(\eta') \leftarrow \eta'.safeLiterals \cup \{ \eta'.rightResolvedLiteral \} ;
 8
              else if \eta is right parent of \eta' then
 9
                   safeLiteralsFrom(\eta') \leftarrow \eta'.safeLiterals \cup \{ \eta'.leftResolvedLiteral \} ;
10
         \eta. \text{safeLiterals} \leftarrow \bigcap_{\eta' \in \eta. \text{children}} \, \text{safeLiteralsFrom}(\eta')
11
```

Algorithm 3: setSafeLiterals

# 5 Experiments

A prototype<sup>1</sup> version of FirstOrderRecyclePivotsWithIntersection has been implemented in the functional programming language  $Scala^2$  as part of the Skeptik library<sup>3</sup>. GreedyLinearFirstOrderLowerUnits prototype was developed earlier for the same system [].

Evaluation of this algorithm was performed on the same 308 real first-order proofs generated to evaluate GreedyLinearFirstOrderLowerUnits. For consistency, the same hardware and metrics were recorded. For full details, see [].

The total time required by SPASS to solve the 308 problems for which proofs were generated was approximately 40 minutes (running on a cluster and including parsing time and proof generation time for each problem). The total time for GreedyLinearFirstOrderLowerUnits and FirstOrderRecyclePivotsWithIntersection to be executed on all 308 proofs was just under 5 seconds on a simple laptop (including parsing each proof). These compression algorithms continue to be very fast, and may simplify the proof considerably for a relatively quick time cost.

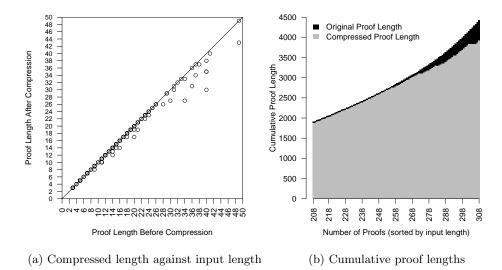


Fig. 1: Experimental results

<sup>&</sup>lt;sup>1</sup> Source code available at https://github.com/jgorzny/Skeptik

<sup>&</sup>lt;sup>2</sup> http://www.scala-lang.org/

<sup>&</sup>lt;sup>3</sup> https://github.com/Paradoxika/Skeptik

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