

## Chapter 7

# Proof producing CLP(LI+UIF)

CLP(Q) [52] is a useful building block for verification tools. However, CLP(Q) does not currently produce proofs, which are needed to compute interpolants, and does not deal with the theory of uninterpreted functions, which is useful for modelling complex operations when verifying programs. In this chapter, we present a tool CLP(LI+UIF) that checks unsatisfiability of conjunctive constraints in the theory of linear arithmetic and uninterpreted functions and also produces a proof tree when unsatisfiability is detected.

The existing simplex based proof producing algorithms [14, 23] use a version of simplex that does not apply constant propagation. These algorithms construct proofs by relying on an instrumentation of the input constraints. This instrumentation leads to the creation of many additional variables. In this chapter, we present an alternative proof producing simplex based algorithm that relies on an instrumentation of an incremental, constant propagating simplex. Our instrumentation does not require incremental simplex to introduce additional variables for proof construction and does not prohibit constant propagation.

In following sections, first we will present the algorithm used in CLP(Q) and its extension for supporting uninterpreted functions. Second, we will discuss the incompatibility of existing algorithms for proof tree generation with CLP(Q). Third, we will present our instrumentation of the algorithm in CLP(Q).

### 7.1 CLP(Q)

CLP(Q) [52] is a linear programming tool. Since, We are only interested in the unsatisfiability of conjunctive constraints, we will only consider *phase 1* of simplex. In CLP(Q), this phase is implemented as a version of incremental simplex.

The incremental simplex takes as input a sequence of linear atoms. At any instant, the input so far is stored in a so called *solved form* that represents the input in a normal form. Given the next input from the input sequence and the current solved form, the incremental simplex computes the next solved form. A solved form of a conjunctive constraint exists if and only if the conjunctive constraint is satisfiable. Therefore, failure to compute a solved form indicates that the input considered so far is unsatisfiable. In practice, the incremental simplex is more efficient than a non-incremental one for satisfiability checking [53].

The algorithm of the CLP(Q) solver is described in [51] and is an optimized version of algorithm presented in [70]. We will now reformulate this algorithm in the notation that is convenient to us. The CLP(Q) solver has the following important optimizations that affect proof tree extraction.

- The CLP(Q) solver avoids introduction of as many slack variables as possible.
- If the input implies that a variable is equal to a constant then the CLP(Q) solver replaces this variable with the constant.

## Solved form

In general, a solved form is a variant of the standard simplex tableau [77]. There are various kinds of solved forms with different properties regarding data structure representation, ability to detect equalities and disequalities, and efficiency of transforming a conjunctive constraints into the solved form [53]. The CLP(Q) uses a solved form in which equality detection is most efficient and therefore the treatment of disequalities is trivial, but the cost of computing the solved form is high. Equality detection is also very significant for us since congruence checker for uninterpreted functions depends on equality detection.

Formally, the solved form in CLP(Q) is a tuple  $(X, Basis, Def, Low, Up, Active, Val)$  where

- $X = \{x_1, \dots, x_n\}$  is a finite ordered set of rational variables,
- $Basis \subseteq X$  is called a *basis*,
- $Def : X \rightarrow \text{linear terms}$ ,  $Def$  assigns definitions to variables and we require that for each  $k \in 1..n$ ,

$$Def(x_k) = c + \sum_{j \in J} c_j x_j,$$

where  $c \in \mathbb{Q}$ ,  $J \subseteq 1..n$  and  $\forall j \in J. c_j \in \mathbb{Q} \setminus \{0\}$ ,

- $Low : X \rightarrow \mathbb{Q} \cup \{-\infty\}$ ,  $Low$  defines lower bounds on variables,
- $Up : X \rightarrow \mathbb{Q} \cup \{+\infty\}$ ,  $Up$  defines upper bounds on variables,
- $Active : X \rightarrow \{\text{none}, \text{lower}, \text{upper}\}$ ,
- $Val : X \rightarrow \mathbb{Q}$ ,
- and the conditions listed below are satisfied.

Let  $k \in 1..n$ .  $x_k$  is *undefined* if  $Def(x_k) = x_k$  and is *defined* otherwise.  $x_k$  is *unbounded* if  $Low(x_k) = -\infty$  and  $Up(x_k) = +\infty$ , otherwise  $x_k$  is *bounded*.  $x_k$  is *active* if  $Active(x_k) \neq \text{none}$ , and is *inactive* otherwise. A solved form must satisfy the following conditions:

- (1)  $Def(x_k)$  only contains undefined variables.
- (2) If  $x_k \in Basis$  then  $x_k$  is defined, bounded, inactive, and all variables appearing in  $Def(x_k)$  are active.
- (3) If  $x_k \notin Basis$  and  $x_k$  is defined then  $x_k$  is unbounded and inactive.
- (4) If  $x_k$  is active then  $x_k$  is bounded, undefined, and there is  $x_b \in Basis$  such that  $x_k$  occurs in  $Def(x_b)$ .
- (5)  $Low(x_k) < Up(x_k)$ .
- (6) If  $Active(x_k) = \text{lower}$  then  $Low(x_k) \neq -\infty$ , and if  $Active(x_k) = \text{upper}$  then  $Up(x_k) \neq +\infty$ .
- (7) If  $x_k$  is undefined then

$$Val(x_k) = \begin{cases} Low(x_k) & \text{if } Active(x_k) = \text{lower}, \\ Up(x_k) & \text{if } Active(x_k) = \text{upper}, \\ 0 & \text{if } Active(x_k) = \text{none}. \end{cases}$$

- (8) If  $x_k$  is defined and  $Def(x_k) = c + \sum_{j \in J} c_j x_j$  then  $Val(x_k) = c + \sum_{j \in J} c_j Val(x_j)$ .
- (9) If  $x_k \in Basis$  then  $Low(x_k) \leq Val(x_k) \leq Up(x_k)$ .

Kind	Condition	Basis	Defined	Active	Bounded	Remark
1	$x_k \in \text{Basis}$	✓	✓*	×*	✓*	If $\text{Def}(x_k) = c + \sum_{j \in J} c_j x_j$ then $\forall j \in J. x_j$ is undefined and active*
2	$x_k \notin \text{Basis}$ $x_k$ is defined	×	✓	×*	×*	If $\text{Def}(x_k) = c + \sum_{j \in J} c_j x_j$ then $\forall j \in J. x_j$ is undefined*
3	$x_k$ is active	×*	×*	✓	✓*	$\exists x_b \in \text{Basis}. x_k \in \text{Smb}(\text{Def}(x_b))^*$
4	$x_k$ is undefined $x_k$ is inactive	×*	×	×		

Figure 7.1: Solved form implicitly induces above four kinds of variables. \* denotes the property is a restriction imposed by a condition of solved form.

Conditions (1)–(4) impose a syntactic restriction, while (5)–(9) require arithmetic evaluation of solved form.  $\text{Def}$  represents a set of linear equations and condition (1) states that these equations are in a triangular form, which is usually obtained by Gaussian elimination. Conditions (2)–(4) induce four kinds of variables in the solved form that are presented in Figure 7.1. Note that variables of the fourth kind vacuously satisfy (2)–(4), since they violate the respective if-conditions.

A solved form is equivalent to the conjunctive constraint.

$$\bigwedge_{k=1}^n (x_k = \text{Def}(x_k) \wedge \text{Low}(x_k) \leq x_k \leq \text{Up}(x_k)) \quad (7.1)$$

The conditions (1)–(9) imply that conjunctive constraints in Equation (7.1) are satisfiable. For a given solved form, we can construct a satisfying assignment  $\text{Val}'$  in following way. We choose assignments for variables in order of first kind, third kind, fourth kind, and second kind.

- For each  $x_k$  variable of first or third kind, let  $\text{Val}'(x_k) = \text{Val}(x_k)$ .
- Let  $x_k$  be a variable of fourth kind.  $x_k$  can only appear in the definition of variables of the second kind. The second kind variables are unbounded, therefore, we can choose any value for  $\text{Val}'(x_k)$  that is between  $\text{Low}(x_k)$  and  $\text{Up}(x_k)$ .
- Let  $x_k$  be a variable of the second kind such that  $\text{Def}(x_k) = c + \sum_{j \in J} c_j x_j$ . We have assigned  $\text{Val}'$  map for all the undefined variables therefore we can evaluate  $\text{Def}(x_k)$  under assignments of  $\text{Val}'$ . Let  $\text{Val}'(x_k) = c + \sum_{j \in J} c_j \text{Val}'(x_j)$ .

Due to conditions (5)–(9),  $\text{Val}'$  is a satisfying assignment.

A satisfiable conjunctive constraint can always be transformed into an equisatisfiable solved form. The resulting solved form may contain more variables than the original constraint due to the introduction of slack variables in the process of transformation. The solved form may not be unique.

**Example 3** (Solved form). The constraints shown in Figure 7.2(a) are satisfiable. In figure 7.2(b), we show a solved form for the constraints. Variables  $x_1, x_2, x_3$ , and  $x_4$  appear in the original constraints. Variables  $u, v$ , and  $w$  are slack variable that are introduced during the transformation to the solved form.  $x_4$  and  $x_2$  are variables of the first kind.  $x_3$  is variable of the second kind.  $x_1, u, w$ , and  $v$  are variables of the third kind. There is no fourth kind of variable in this solved form therefore  $\text{Val}$  is satisfying assignment to the original constants.

### CLP(Q) algorithm

Figures 7.3, 7.4, and 7.5 present incremental simplex in CLP(Q) [51]. This algorithm takes linear atoms as input sequence. Given an input and the current solved form, CLP(Q) computes the next solved form. If CLP(Q) fails to compute the next solved form then it throws an exception “Unsatisfiable”.

If the input is an equation then ADDEQUALITY is called. If the input is an inequality then ADDINEQUALITY is called. We refer to these two procedures as *entry* procedures.

$x_1 - x_2 + 2x_3 - 2 \leq 0$

$x_2 - x_1 - x_3 + 3 \leq 0$

$x_4 + x_3 - 2 \leq 0$

$2 - x_4 \leq 0$

$x_1 - 10 \leq 0$

$2 - x_2 \leq 0$

(a)

	Variable	Def	Low	Up	Active	Val		
{	basis	$x_4$	$3 + u + v - w$	2	$+\infty$	none	3	}
		$x_2$	$-4 + x_1 - u - 2v$	2	$+\infty$	none	6	
		$x_3$	$-1 - u - v$	$-\infty$	$+\infty$	none	-1	
{	slack variables	$x_1$	$x_1$	$-\infty$	10	upper	10	}
		$u$	$u$	0	$+\infty$	lower	0	
		$v$	$v$	0	$+\infty$	lower	0	
		$w$	$w$	0	$+\infty$	lower	0	

(b)

Figure 7.2: (a) An example input to the CLP(Q) solver. (b) Solved form computed by CLP(Q) for the input.  $x_4$  and  $x_2$  are variables of first kind.  $x_3$  is variable of second kind.  $x_1$ ,  $u$ ,  $w$ , and  $v$  are variables of third kind.

**Global data structures** The global maps  $X$ ,  $Def$ ,  $Low$ ,  $Up$ ,  $Active$ , and  $Val$  are components of the solved form. They are initialized to be empty. So initially the solved form is empty. Note that when we pick a fresh variable  $x_k$  at line 11 of `ADDINEQUALITY` that means  $x_k$  is not referred by any of the input constraints, and  $x_k$  is not in current  $X$ . During the run of `CLP(Q)`, some variables are detected to be equal to a constant. Such equalities are stored in *queue* and these equalities are added to the solved form at the end of execution of the entry procedures (In `ADDINEQUALITY`, lines 13–15 and in `ADDINEQUALITY` lines 21–23).

Now we will describe procedures of the algorithm.

**Procedures Deref and Initialize** Both the entry procedures call `Deref` to de-reference the term of the input atom. `Deref` replaces each variable appearing in the input term with its definition in the solved form. If a variable is not yet part of the solved form then the procedure `Initialize` is called to add the variable in the solved form as a non-basis, undefined, inactive, and unbounded variable. `Deref` eliminates all defined variables from the input term and returns a term over undefined variables.

**Procedure Substitute** This procedure takes an undefined variable  $x_m$  and a term over other undefined variables as input. `Substitute` replaces each occurrence of  $x_m$  in the definitions by the given input term. These replacements may lead to violation of condition (8). So `Substitute` also updates  $Val$  such that condition (8) holds at the end of this procedure. As a result, `Substitute` turns  $x_m$  into a defined variable.

**Procedure Pivot** The inputs of this procedure are a basis variable  $x_b$ , an activation direction  $act$ , and an undefined and active variable  $x_i$  that appears in the definition of  $x_b$ . `Pivot` removes  $x_b$  from the basis and adds  $x_i$  to the basis using `Substitute` at lines 1–3.  $x_b$  is now an undefined variable that appears in the definition of the basis variable  $x_i$ , so  $x_b$  has to be made active. `Pivot` activates  $x_b$  in the direction  $act$  by calling procedure `Activate` at line 5. Since  $x_i$  is added to the basis,  $x_i$  is made inactive at line 6.

**Procedures Activate and AddBasis** `Activate` activates an inactive variable. It also has to update  $Val$  to satisfy condition (7) and (8). The inputs of `AddBasis` are a defined variable  $x_m$  and an activation direction  $act$ . This procedure adds  $x_m$  to basis and makes it inactive. Each variable  $x_j$  appearing in the definition of  $x_m$  is activated at lines 4–13. If either of the bounds of  $x_j$  does not exist then the other bound is activated at lines 6–9. Otherwise, if  $c_j$  is positive then  $x_j$  is activated in the direction  $act$  and if  $c_j$  is negative then  $x_j$  is activated in the direction opposite to  $act$  at lines 10–13.  $\oplus$  denotes the logical xor operator.

**Procedure Addequality** This procedure takes a linear equality  $t = 0$  as input. At line 1,  $t$  is de-referenced using the solved form. If the solved form implies  $t = 0$  then the condition at line 2 is true and procedure continues at line 13. If the condition at line 4 is true then the conjunction of the solved form and

global variables

$$\left\{ \begin{array}{ll} X = \emptyset & : \text{set of variables} \\ Def = \emptyset & : X \rightarrow \text{linear terms} \\ Low = \emptyset & : X \rightarrow \mathbb{Q} \cup \{-\infty\} \\ Active = \emptyset & : X \rightarrow \{\text{none}, \text{lower}, \text{upper}\} \end{array} \right\} \quad \left\{ \begin{array}{ll} Basis = \emptyset & : \text{set of variables} \\ Up = \emptyset & : X \rightarrow \mathbb{Q} \cup \{+\infty\} \\ Val = \emptyset & : X \rightarrow \mathbb{Q} \end{array} \right\} : \text{solved form}$$

$queue = \emptyset$ : set of linear atoms

<pre> <b>procedure</b> ADDEQUALITY <b>input</b>   <math>t = 0</math> : linear constraint <b>begin</b> 1  <math>c + \sum_{j \in J} c_j x_j := \text{DEREF}(t)</math> 2  <b>if</b> <math>c = 0 \wedge J = \emptyset</math> <b>then</b> 3    <b>skip</b> 4  <b>elsif</b> <math>c \neq 0 \wedge J = \emptyset</math> <b>then</b> 5    <b>throw</b> "Unsatisfiable" 6  <b>elsif</b> <math>\exists i \in J. \text{Low}(x_i) = -\infty \wedge \text{Up}(x_i) = +\infty</math> <b>then</b> 7    <math>\text{SUBSTITUTE}(x_i, -\frac{1}{c_i}(c + \sum_{j \in J \setminus \{i\}} c_j x_j))</math> 8  <b>else</b> 9    <b>pick</b> <math>i \in J</math> 10   <math>\text{SUBSTITUTE}(x_i, -\frac{1}{c_i}(c + \sum_{j \in J \setminus \{i\}} c_j x_j))</math> 11   <math>\text{ADDBASIS}(x_i, \text{lower})</math> 12   <math>\text{REPAIRBASIS}()</math> 13  <b>if</b> <math>s = 0 \in \text{queue}</math> <b>then</b> 14    <math>\text{queue} := \text{queue} \setminus \{s = 0\}</math> 15   <math>\text{ADDEQUALITY}(s = 0)</math> <b>end</b> </pre>	<pre> <b>procedure</b> ADDINEQUALITY <b>input</b>   <math>t \leq 0</math> : linear constraint <b>begin</b> 1  <math>c + \sum_{j \in J} c_j x_j := \text{DEREF}(t)</math> 2  <b>if</b> <math>c \leq 0 \wedge J = \emptyset</math> <b>then</b> 3    <b>skip</b> 4  <b>elsif</b> <math>c &gt; 0 \wedge J = \emptyset</math> <b>then</b> 5    <b>throw</b> "Unsatisfiable" 6  <b>elsif</b> <math>t = a + a_i x_i</math> <b>then</b> 7    <math>\text{UPDATEBOUND}(a + a_i x_i \leq 0)</math> 8  <b>elsif</b> <math>J = \{j\}</math> <b>then</b> 9    <math>\text{UPDATEBOUND}(c + c_j x_j \leq 0)</math> 10 <b>else</b> 11   <b>pick</b> fresh <math>x_k</math> (* slack variable *) 12   <math>\text{INITIALIZE}(x_k)</math> 13   <math>\text{Low}(x_k) := 0</math> 14   <b>if</b> <math>\exists i \in J. \text{Low}(x_i) = -\infty \wedge \text{Up}(x_i) = +\infty</math> <b>then</b> 15     <math>\text{SUBSTITUTE}(x_i, -\frac{1}{c_i}(c + \sum_{j \in J \setminus \{i\}} c_j x_j + x_k))</math> 16   <b>else</b> 17     <math>\text{Def}(x_k) := -(c + \sum_{j \in J} c_j x_j)</math> 18     <math>\text{Val}(x_k) := -(c + \sum_{j \in J} c_j \text{Val}(x_j))</math> 19     <math>\text{ADDBASIS}(x_k, \text{lower})</math> 20     <math>\text{REPAIRVAR}(x_k)</math> 21   <b>if</b> <math>s = 0 \in \text{queue}</math> <b>then</b> 22     <math>\text{queue} := \text{queue} \setminus \{s = 0\}</math> 23   <math>\text{ADDEQUALITY}(s = 0)</math> <b>end</b> </pre>	
<pre> <b>procedure</b> Deref <b>input</b>   <math>c + \sum_{j \in J} c_j x_j</math> : linear term <b>begin</b> 1  <math>t := c</math> 2  <b>for</b> each <math>j \in J</math> <b>do</b> 3    <b>if</b> <math>\text{Def}(x_j) = \perp</math> <b>then</b> 4      <math>\text{INITIALIZE}(x_j)</math> 5    <math>t := t + c_j \text{Def}(x_j)</math> 6  <b>return</b> <math>t</math> <b>end</b> </pre>	<pre> <b>procedure</b> SUBSTITUTE <b>input</b>   <math>x_m</math> : undefined variable   <math>c + \sum_{j \in J} c_j x_j</math> : linear term <b>begin</b> 1  <math>d := c + \sum_{j \in J} c_j \text{Val}(x_j) - \text{Val}(x_m)</math> 2  <b>for</b> each <math>x_k \in X</math> : 3    <math>a + \sum_{i \in I} a_i x_i = \text{Def}(x_k) \wedge m \in I</math> <b>do</b> 4      <math>\text{Val}(x_k) := \text{Val}(x_k) + a_m d</math> 5      <math>\text{Def}(x_k) := a + \sum_{i \in I \setminus \{m\}} a_i x_i + a_m(c + \sum_{j \in J} c_j x_j)</math> <b>end</b> </pre>	<pre> <b>procedure</b> PIVOT <b>input</b>   <math>x_b</math> : basis variable   <math>act</math> : activation direction   <math>x_i</math> : undefined and active variable <b>begin</b> 1  <math>c + \sum_{j \in J} c_j x_j := \text{Def}(x_b)</math> 2  <math>t := -\frac{1}{c_i}(c + \sum_{j \in J \setminus \{i\}} c_j x_j - x_b)</math> 3  <math>\text{SUBSTITUTE}(x_i, t)</math> 4  <math>\text{Basis} := (\text{Basis} \setminus \{x_b\}) \cup \{x_i\}</math> 5  <math>\text{ACTIVATE}(x_b, act)</math> 6  <math>\text{Active}(x_i) := \text{none}</math> <b>end</b> </pre>

Figure 7.3: Algorithm in CLP(Q) page 1

<pre> <b>procedure</b> UPDATEBOUND <b>input</b>   <math>c + c_j x_j \leq 0</math> : single variable linear inequality <b>begin</b> 1  <b>if</b> <math>c_j &gt; 0</math> <b>then</b> 2    <math>Status := \text{UPDATEUPPER}(x_j, -c/c_j)</math> 3    <math>act := \text{lower}</math> 4  <b>else</b> 5    <math>Status := \text{UPDATELOWER}(x_j, -c/c_j)</math> 6    <math>act := \text{upper}</math> 7  <b>if</b> <math>Status = \text{updated} \wedge \text{Def}(x_j) \neq x_j</math> <b>then</b> 8    <b>if</b> <math>x_j \notin \text{Basis}</math> <b>then</b> 9      <math>a + \sum_{i \in I} a_i x_i := \text{Def}(x_j)</math> 10     <b>if</b> <math>\exists k \in I \text{ Low}(x_k) = -\infty \wedge \text{Up}(x_k) = +\infty</math> <b>then</b> 11       <math>\text{SUBSTITUTE}(x_k, -\frac{1}{a_k}(a + \sum_{i \in J \setminus \{k\}} a_i x_i - x_j))</math> 12     <b>else</b> 13       <math>\text{ADDBASIS}(x_j, act)</math> 14     <b>if</b> <math>x_j \in \text{Basis}</math> <b>then</b> 15       <math>\text{REPAIRVAR}(x_j)</math> 16 <b>end</b> </pre>		<pre> <b>procedure</b> ADDBASIS <b>input</b>   <math>x_m</math> : variable entering in basis   <math>act</math> : preferred activation <b>begin</b> 1  <math>\text{Basis} := \text{Basis} \cup \{x_m\}</math> 2  <math>\text{Active}(x_m) := \text{none}</math> 3  <math>c + \sum_{j \in J} c_j x_j := \text{Def}(x_m)</math> 4  <b>for each</b> <math>j \in J : \text{Active}(x_j) = \text{none}</math> <b>do</b> 5    <b>do</b> 6      <b>if</b> <math>\text{Low}(x_j) = -\infty</math> <b>then</b> 7        <math>\text{ACTIVATE}(x_j, \text{upper})</math> 8      <b>elseif</b> <math>\text{Up}(x_j) = +\infty</math> <b>then</b> 9        <math>\text{ACTIVATE}(x_j, \text{lower})</math> 10     <b>elseif</b> <math>act = \text{upper} \oplus c_j &gt; 0</math> <b>then</b> 11       <math>\text{ACTIVATE}(x_j, \text{lower})</math> 12     <b>else</b> 13       <math>\text{ACTIVATE}(x_j, \text{upper})</math> 14 <b>end</b> </pre>	
<pre> <b>procedure</b> UPDATELOWER <b>input</b>   <math>x_j</math> : variable   <math>lb : \mathbb{Q}</math> <b>begin</b> 1  <b>if</b> <math>\text{Up}(x_j) &lt; lb</math> <b>then</b> 2    <b>throw</b> “Unsatisfiable” 3  <b>elseif</b> <math>\text{Up}(x_j) = lb</math> <b>then</b> 4    <math>\text{ENQUEUE}(x_j = lb)</math> 5  <b>else</b> <math>\text{Low}(x_j) &lt; lb</math> <b>then</b> 6    <b>if</b> <math>\text{Active}(x_j) = \text{lower}</math> <b>then</b> 7      <math>_ := \text{PUSHUP}(x_j)</math> 8    <math>\text{Low}(x_j) := lb</math> 9    <b>if</b> <math>\text{Active}(x_j) = \text{lower}</math> <b>then</b> 10     <math>\text{ACTIVATE}(x_j, \text{lower})</math> 11    <b>return updated</b> 12 <b>return noChange</b> 13 <b>end</b> </pre>	<pre> <b>procedure</b> UPDATEUPPER <b>input</b>   <math>x_j</math> : variable   <math>ub : \mathbb{Q}</math> <b>begin</b> 1  <b>if</b> <math>\text{Low}(x_j) &gt; ub</math> <b>then</b> 2    <b>throw</b> “Unsatisfiable” 3  <b>elseif</b> <math>\text{Low}(x_j) = ub</math> <b>then</b> 4    <math>\text{ENQUEUE}(x_j = ub)</math> 5  <b>else</b> <math>\text{Up}(x_j) &gt; ub</math> <b>then</b> 6    <b>if</b> <math>\text{Active}(x_j) = \text{upper}</math> <b>then</b> 7      <math>_ := \text{PUSHLOW}(x_j)</math> 8    <math>\text{Up}(x_j) := ub</math> 9    <b>if</b> <math>\text{Active}(x_j) = \text{upper}</math> <b>then</b> 10     <math>\text{ACTIVATE}(x_j, \text{upper})</math> 11    <b>return updated</b> 12 <b>return noChange</b> 13 <b>end</b> </pre>	<pre> <b>procedure</b> ACTIVATE <b>input</b>   <math>x_m</math> : variable   <math>act</math> : activation direction <b>begin</b> 1  <math>\text{Active}(x_m) := act</math> 2  <b>match</b> <math>act</math> <b>with</b> 3      <math>\text{lower}</math> <math>\rightarrow</math> <math>new := \text{Low}(x_m)</math> 4      <math>\text{upper}</math> <math>\rightarrow</math> <math>new := \text{Up}(x_m)</math> 5  <math>d := new - \text{Val}(x_m)</math> 6  <b>for each</b> <math>x_k \in X</math> : 7    <math>c + \sum_{i \in I} c_i x_i = \text{Def}(x_k) \wedge m \in I</math> <b>do</b> 8      <math>\text{Val}(x_k) := \text{Val}(x_k) + c_m d</math> 9 <b>end</b> </pre>	
		<pre> <b>procedure</b> ENQUEUE <b>input</b>   <math>x_k = c</math> : variable equality <b>begin</b> 1  <math>queue := queue \cup \{x_k - c = 0\}</math> 2 <b>end</b> </pre>	

Figure 7.4: Algorithm in CLP(Q) page 2

<pre> <b>procedure</b> REPAIRBASIS <b>begin</b> 1  <i>LocalBasis</i> := <i>Basis</i> 2  <b>for</b> each <math>x_b \in \textit{LocalBasis} \wedge x_b \in \textit{Basis}</math> <b>do</b> 3    REPAIRVAR(<math>x_b</math>) <b>end</b> </pre>	<pre> <b>procedure</b> REPAIRVAR <b>input</b>   <math>x_b</math> : basis variable <b>begin</b> 1  <b>if</b> <math>\textit{Val}(x_b) \geq \textit{Up}(x_b)</math> <b>then</b> REPAIRUP(<math>x_b</math>) 2  <b>if</b> <math>\textit{Val}(x_b) \leq \textit{Low}(x_b)</math> <b>then</b> REPAIRLOW(<math>x_b</math>) <b>end</b> </pre>
<pre> <b>procedure</b> REPAIRUP <b>input</b>   <math>x_b</math> : basis variable <b>begin</b> 1  <b>if</b> <math>\textit{Val}(x_b) &lt; \textit{Up}(x_b)</math> <b>then</b> <b>return</b> 2  <math>c + \sum_{i \in I} c_i x_i := \textit{Def}(x_b)</math> 3  <b>if</b> <math>\exists i \in I. c_i &gt; 0 \wedge \textit{Active}(x_i) = \textit{upper}</math> <b>then</b> 4    <i>Status</i> := PUSHLOW(<math>x_i</math>) 5  <b>elsif</b> <math>\exists i \in I. c_i &lt; 0 \wedge \textit{Active}(x_i) = \textit{lower}</math> <b>then</b> 6    <i>Status</i> := PUSHUP(<math>x_i</math>) 7  <b>else</b> 8    <i>Status</i> := optimum 9    <b>if</b> <math>\textit{Val}(x_b) = \textit{Up}(x_b)</math> <b>then</b> 10     ENQUEUE( <math>x_b = \textit{Up}(x_b)</math> ) 11  <b>else</b> 12    <b>throw</b> "Unsatisfiable" 13  <b>match</b> <i>Status</i> <b>with</b> 14      applied -&gt; REPAIRUP(<math>x_b</math>) 15      nobound(<math>x_i</math>) -&gt; PIVOT(<math>x_b, \textit{upper}, x_i</math>) <b>end</b> </pre>	<pre> <b>procedure</b> REPAIRLOW <b>input</b>   <math>x_b</math> : basis variable <b>begin</b> 1  <b>if</b> <math>\textit{Val}(x_b) &gt; \textit{Low}(x_b)</math> <b>then</b> <b>return</b> 2  <math>c + \sum_{i \in I} c_i x_i := \textit{Def}(x_b)</math> 3  <b>if</b> <math>\exists i \in I. c_i &gt; 0 \wedge \textit{Active}(x_i) = \textit{lower}</math> <b>then</b> 4    <i>Status</i> := PUSHUP(<math>x_i</math>) 5  <b>elsif</b> <math>\exists i \in I. c_i &lt; 0 \wedge \textit{Active}(x_i) = \textit{upper}</math> <b>then</b> 6    <i>Status</i> := PUSHLOW(<math>x_i</math>) 7  <b>else</b> 8    <i>Status</i> := optimum 9    <b>if</b> <math>\textit{Val}(x_b) = \textit{Low}(x_b)</math> <b>then</b> 10     ENQUEUE( <math>x_b = \textit{Low}(x_b)</math> ) 11  <b>else</b> 12    <b>throw</b> "Unsatisfiable" 13  <b>match</b> <i>Status</i> <b>with</b> 14      applied -&gt; REPAIRLOW(<math>x_b</math>) 15      nobound(<math>x_i</math>) -&gt; PIVOT(<math>x_b, \textit{lower}, x_i</math>) <b>end</b> </pre>
<pre> <b>procedure</b> PUSHLOW <b>input</b>   <math>x_i</math> : undefined and active variable <b>begin</b> 1  (<math>lb, k</math>) := (<math>\textit{Low}(x_i) - \textit{Up}(x_i), i</math>) 2  <b>for</b> each <math>x_b \in \textit{Basis}</math> : (* Pick <math>x_b</math> in order *) 3    <math>\textit{Def}(x_b) = c + \sum_{j \in J} c_j x_j \wedge i \in J</math> <b>do</b> 4      <b>if</b> <math>c_i &gt; 0 \wedge \frac{\textit{Low}(x_b) - \textit{Val}(x_b)}{c_i} &gt; lb</math> <b>then</b> 5        (<math>lb, k, act</math>) := (<math>\frac{\textit{Low}(x_b) - \textit{Val}(x_b)}{c_i}, b, \textit{lower}</math>) 6      <b>if</b> <math>c_i &lt; 0 \wedge \frac{\textit{Up}(x_b) - \textit{Val}(x_b)}{c_i} &gt; lb</math> <b>then</b> 7        (<math>lb, k, act</math>) := (<math>\frac{\textit{Up}(x_b) - \textit{Val}(x_b)}{c_i}, b, \textit{upper}</math>) 8  <b>done</b> 9  <b>if</b> <math>k = i \wedge \textit{Low}(x_i) = -\infty</math> <b>then</b> 10   <b>return</b> nobound(<math>x_i</math>) 11  <b>elsif</b> <math>k = i</math> <b>then</b> 12   ACTIVATE(<math>x_i, \textit{lower}</math>) 13  <b>else</b> 14   PIVOT(<math>x_k, act, x_i</math>) 15  <b>return</b> applied <b>end</b> </pre>	<pre> <b>procedure</b> PUSHUP <b>input</b>   <math>x_i</math> : undefined and active variable <b>begin</b> 1  (<math>ub, k</math>) := (<math>\textit{Up}(x_i) - \textit{Low}(x_i), i</math>) 2  <b>for</b> each <math>x_b \in \textit{Basis}</math> : (* Pick <math>x_b</math> in order *) 3    <math>\textit{Def}(x_b) = c + \sum_{j \in J} c_j x_j \wedge i \in J</math> <b>do</b> 4      <b>if</b> <math>c_i &gt; 0 \wedge \frac{\textit{Up}(x_b) - \textit{Val}(x_b)}{c_i} &lt; ub</math> <b>then</b> 5        (<math>ub, k, act</math>) := (<math>\frac{\textit{Up}(x_b) - \textit{Val}(x_b)}{c_i}, b, \textit{upper}</math>) 6      <b>if</b> <math>c_i &lt; 0 \wedge \frac{\textit{Low}(x_b) - \textit{Val}(x_b)}{c_i} &lt; ub</math> <b>then</b> 7        (<math>ub, k, act</math>) := (<math>\frac{\textit{Low}(x_b) - \textit{Val}(x_b)}{c_i}, b, \textit{lower}</math>) 8  <b>done</b> 9  <b>if</b> <math>k = i \wedge \textit{Up}(x_i) = +\infty</math> <b>then</b> 10   <b>return</b> nobound(<math>x_i</math>) 11  <b>elsif</b> <math>k = i</math> <b>then</b> 12   ACTIVATE(<math>x_i, \textit{upper}</math>) 13  <b>else</b> 14   PIVOT(<math>x_k, act, x_i</math>) 15  <b>return</b> applied <b>end</b> </pre>

Figure 7.5: Algorithm in CLP(Q) page 3

$t = 0$  is unsatisfiable, and we throw an exception “**Unsatisfiable**”. If the de-referenced term contains an undefined and unbounded variable then this variable is substituted by the rest of de-referenced term in the solved form at line 7 and we get a solved form. Otherwise, we pick a variable appearing in the de-referenced term and the variable is substituted by the rest of de-referenced term in the solved form. Since, the variable is bounded and defined, we add the variable in basis at line 11. Note that we pass **lower** as the activation direction in the second argument of **ADDBASIS**, which is an arbitrary choice. These modifications of the solved form may leads to violation of condition (9), which is fixed by calling **REPAIRBASIS**. The code after line 13 is already discussed in description of the global data structures.

**Procedure ADDINEQUALITY** This procedure takes a linear inequality  $t \leq 0$  as input. At line 1,  $t$  is de-referenced using the solved form. If the solved form implies  $t \leq 0$  then the condition at line 2 is true and procedure continues at line 21. If the condition at line 4 is true then the conjunction of the solved form and  $t \leq 0$  is unsatisfiable, and we throw an exception “**Unsatisfiable**”. If either the input term or de-referenced term contains a single variable then **UPDATEBOUND** is called at line 7 or 9, respectively. Otherwise, we introduce a slack variable  $x_k$  and initialize the lower bound of  $x_k$  with 0 at lines 11–13. Now we need to add an equality between  $x_k$  and the negation of the de-referenced term in the solved form. If the de-referenced term contains an undefined and unbounded variable then this variable is substituted by the rest of de-referenced term added with  $x_k$  in the solved form at line 15 and we get a solved form. Otherwise, **ADDINEQUALITY** sets definition of  $x_k$  to negation of the de-referenced term and add  $x_k$  to the basis at line 17 and 19. Only  $x_k$  can violate condition (9). So **REPAIRVAR** is called to fix the violation at line 20. The code after line 21 is already discussed in description of the global data structures.

**Procedures REPAIRBASIS and REPAIRVAR** **REPAIRBASIS** iteratively changes the basis by pivot operations until condition (9) is satisfied. **REPAIRBASIS** keeps a local copy of the current basis and then iterate over the variables that will remain in the basis after the call to **REPAIRVAR** in each iteration. **REPAIRVAR** takes a basis variable  $x_b$  as input, checks if  $Val(x_b)$  violates any of its bounds, and calls accordingly **REPAIRUP** or **REPAIRLOW**, accordingly.

**Procedures REPAIRUP, REPAIRLOW, PUSHLOW, and PUSHUP** We only discuss **REPAIRUP** and **PUSHLOW**. The descriptions of **REPAIRLOW** and **PUSHUP** are similar, respectively.

**REPAIRUP** takes a basis variable  $x_b$  as input. **REPAIRUP** recursively attempts to decrease  $Val(x_b)$  such that  $Val(x_b) < Up(x_b)$  or moves  $x_b$  out of the basis. The condition (8) defines  $Val(x_b)$  in terms of values of variables appearing in  $Def(x_b)$ . The condition at line 3 holds if a variable  $x_i$  appears in  $Def(x_b)$  with a positive coefficient and is activated with the direction **upper**. We can decrease  $Val(x_b)$  by decreasing  $Val(x_i)$ . Since  $Val(x_i)$  is taking the maximum allowed value, it can be decreased. At line 4, procedure **PUSHLOW** is called to decrease value of  $Val(x_i)$ . The code at line 5 and 6 is symmetric therefore we will not discuss it. If both conditions at line 3 and 5 fail then we can not decrease  $Val(x_i)$  any further, and the execution continues at line 8. If  $Val(x_b)$  is equal to  $Up(x_b)$  then we have detected an equality and this equality is pushed into *queue*. Otherwise, the solved form is unsatisfiable and exception “**Unsatisfiable**” is thrown. The return value of the call to **PUSHLOW** at line 4 is stored in *Status*. *Status* equals to **applied** indicates that a progress in decreasing  $Val(x_b)$  has been made. Then, we decrease  $Val(x_b)$  further. *Status* equals to **nobound**( $x_i$ ) indicates that  $x_i$  can be decreased without any bound and by doing a pivot operation between  $x_b$  and  $x_i$  we can satisfy the conditions of the solved form.

In procedure **PUSHLOW** at line 1,  $k$  is set equal to  $i$  and  $lb$  records the maximum change in value of  $Val(x_i)$  allowed by  $Low(x_i)$ . Then at lines 2–8, **PUSHLOW** iterates over the basis variables and finds a basis variable  $x_k$  that may impose maximum bound on smallest value of  $lb$ , i.e., change in value of  $Val(x_i)$ . There are three possible cases at lines 9–14. The first and second case occur when no bounding basis variable exists and  $k$  remains equal to  $i$  at line 9. The first case occurs if there is no lower bound of  $x_i$ . In this case, a value **nobound**( $x_i$ ) is returned indicating that  $Val(x_i)$  can be decreased without any bound at line 10. The second case occurs if there is a lower bound on  $x_i$ . In this case, the activation direction of  $x_i$  is changed from **upper** to **lower** at line 12. This change leads to a decrease of  $Val(x_b)$ . The third case occurs if  $x_k$  is a



basis variable.  $x_k$  leaves the basis and  $x_i$  enters the basis at line 14. After the second and third cases, the execution continues at line 15 where **applied** is returned indicating to the caller that  $Val(x_b)$  is decreased by some amount.

**Procedures** UPDATEBOUND, UPDATELOWER, and UPDATEUPPER The procedure UPDATEBOUND takes an inequality that contains only one variable as input and updates bounds of this variable. Depending on the variable coefficient in the input inequality, upper or lower bound is updated by calling UPDATEUPPER or UPDATELOWER, respectively.

We will discuss UPDATEUPPER. The description of UPDATELOWER is symmetric. UPDATEUPPER takes a variable  $x_j$  and a new upper bound  $ub$  for  $x_j$  as input. If  $ub$  is strictly lower than the lower bound of  $x_j$  then UPDATEUPPER throws an exception “**Unsatisfiable**” at line 2. If  $ub$  is equal to the lower bound of  $x_j$  then we have detected that  $x_j$  to be constant and the corresponding constant equality is stored in *queue* at line 4. If  $Up(x_j) > ub > Low(x_j)$  then we update  $Up(x_j)$ . Due to conditions (7)–(9), updating an active bound is a difficult case. If  $Active(x_j) = \text{upper}$  then PUSHLOW is called at line 7. If PUSHLOW moves  $x_j$  into the basis or changes its activation direction then the difficulty is eliminated. Otherwise, PUSHLOW makes no changes in solved form and solved form imposes no limit in decrease of upper bound. In both case, we update  $Up(x_j)$  at line 8 without violating conditions (7)–(9) for any other variable. If  $Active(x_j)$  is still equal to **upper** at line 9 then we update  $Val$  by calling ACTIVATE to satisfy condition (9). UPDATEUPPER returns value **updated** only upper bound is changed otherwise **noChange** is returned to the caller, i.e., UPDATEBOUND.

In UPDATEBOUND at line 7, if a bound of  $x_j$  is updated and  $x_j$  is a defined variable then lines 8–13 are executed to maintain condition (2) and (3). At line 14, if  $x_j$  is in the basis then we check and repair any violation of condition (9).

### CLP(LI+UIF) using CLP(Q)

Figure 7.6 presents the CLP(LI+UIF) as an extension of CLP(Q). CLP(LI+UIF) solver extends CLP(Q) solver with a congruence checker for uninterpreted functions. The CLP(LI+UIF) contains an additional data structure *TermDef* that is a function from pairs of uninterpreted function symbols and lists of linear terms to a variable. *TermDef* is used to purify input atoms to produce linear atoms, and to check if a congruence axiom can be applied on input constraints and to produce new equalities. CLP(LI+UIF) takes  $\mathcal{T}_{LI+UIF}$  atoms as the input sequence. Given an input, the current solved form, the current *TermDef*, CLP(LI+UIF) computes the next solved form and *TermDef*. If CLP(LI+UIF) fails to compute the next solved form and *TermDef* then it throws an exception “**Unsatisfiable**”. CLP(LI+UIF) adds the following three procedures.

**Procedure** ADDCONSTRAINT At line 1, PURIFY is called to remove uninterpreted functions from the input term and to produce a linear term. Next, the purified atom is added to CLP(Q) solver using its entry procedures at lines 2–4. If the call to an entry procedure of CLP(Q) does not throw an exception “**Unsatisfiable**” then CONGCHK is called at line 5 to check if congruence rules can be applied between any two of the terms stored in *TermDef*.

**Procedure** PURIFY This procedure takes a term in  $\mathcal{T}_{LI+UIF}$ . PURIFY recursively traverses the input term in the bottom up order. During the traversal, PURIFY replaces each subterm whose top function symbol is uninterpreted with a variable. If the subterm is already seen before then the variable corresponding to the subterm is retrieved from *TermDef* at line 12. Otherwise, a fresh variable is chosen to replace for the subterm, and *TermDef* is updated accordingly at lines 9 and 10.

**Procedure** CONGCHK This procedure recursively executes until no new equality is detected from the solved form and *TermDef*. At lines 1–5, the new equalities are detected by the following if-condition. Let two variables  $x_j$  and  $x_k$  be in the range of *TermDef*. Assuming that in *TermDef*,  $x_j$  and  $x_k$  are mapped by the same function symbol  $f$  and lists of subterms  $s_1, \dots, s_m$  and  $t_1, \dots, t_m$ , respectively. For all  $i \in 1..m$ , if the solved form implies  $s_i = t_i$ , which is checked by call to DEREf, then due to the congruence rule,  $x_j = x_k$ .