## CHR grammars

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#### Abstract

A grammar formalism based upon CHR is proposed analogously to the way Definite Clause Grammars are defined and implemented on top of Prolog. These grammars execute as robust bottom-up parsers with an inherent treatment of ambiguity and a high flexibility to model various linguistic phenomena. The formalism extends previous logic programming based grammars with a form of context-sensitive rules and the possibility to include extragrammatical hypotheses in both head and body of grammar rules. Among the applications are straightforward implementations of Assumption Grammars and abduction under integrity constraints for language analysis. CHR grammars appear as a powerful tool for specification and implementation of language processors and may be proposed as a new standard for bottom-up grammars in logic programming.

KEYWORDS: constraint logic programming, constraint handling rules, logic grammars

#### 1 Introduction

Constraint Handling Rules (Frühwirth 1998b) (CHR) provide a natural framework for extending logic programming with bottom-up evaluation which, together with other qualities of CHR, makes it interesting to consider CHR for language processing. In general, constraint solving techniques have proved to be important for expressing and solving linguistic problems.

To promote and facilitate language processing in CHR, we propose a standard for a grammar notation built upon CHR, called CHR Grammars or CHRG for short. At a first glance, CHRG may be seen as a bottom-up counterpart to the well-known Definite Clause Grammars (Pereira and Warren 1980) (DCG), but the CHRG formalism includes additional facilities that are not obvious or possible in DCG. Most notably, the notation supports context-sensitive rules that may consider arbitrary symbols to the left and right of a sequence be matched. Counterparts to the different sorts of rules of CHR (propagation, simplification, and simpagation) are present in CHRG and grammar rules may also refer to extra-grammatical hypotheses in both head and body of rules. CHRGs are implemented by a compiler into CHR analogously to the way DCGs usually are translated into Prolog. This provides a seamless integration with CHR and Prolog, so that the high-level notation of CHRG is combined with the sort of tools and libraries that are relevant for practical applications.

When executed as a parser, a CHRG is robust of errors and provides an elegant handling of ambiguity: rules apply bottom-up as long as possible and grammar nodes corresponding to the different parses can be read out of the final constraint store.

The context-sensitive rules provide a high degree of expressiveness both for simplifying the overall grammar structure and for modeling phenomena such as long-distance reference and coordination in natural language. Context-sensitivity can also be used for classifying lexical tokens in a way quite similarly to the component called a tagger in language processing systems.

The possibility to apply extra-grammatical constraints in grammar rules makes it straightforward to express abductive language interpretation with integrity constraints written as CHR rules; no extra meta-level overhead is necessary. Facilities from Assumption Grammars (AG) are included in CHRG in a similar way; AGs are in many ways similar to abduction but provide also primitive scoping mechanisms not found in the abductive approach.

The CHRG system accepts any grammar whose context-free backbone is without empty-productions and loops and it has no problems with left-recursion as is the case for DCG. The efficiency is highly dependent on the grammar: For locally unambiguous grammars (to be defined), execution is linear and for a general context-free grammar cubic similarly to other general parsing algorithms.

The CHRG system is implemented in SICStus Prolog and is available on the Internet (Christiansen 2002b).

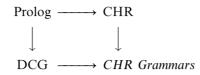
#### **Overview**

Section 2 provides the background and motivation of this work and reviews important, related work. Section 3 describes syntax and semantics of the CHRG notation together with the principles used for its implementation in CHR; Section 4 shows examples of CHRGs.

The approach to abductive language interpretation is described in Section 5, firstly at an abstract level as a general method for transforming abductive language interpretation into a deductive form which is not tied to a specific grammar formalism. We then show how the principles can be applied in CHRG in a version for unambiguous grammars and an extension for ambiguous grammars (some extra machinery is needed as to avoid cluttering up abducibles for different parses). Section 6 explains the implementation of Assumption Grammars in CHRG. Section 7 gives a summary and discusses future perspectives.

#### 2 Background and related work

Our work can be described as filling out the lower right corner in the following commutative diagram:



Definite Clause Grammars (Pereira and Warren 1980) (DCGs) have been an integral component of most Prolog systems for decades and are basically a derivative of Colmerauer's Metamorphosis Grammars (Colmerauer 1975) that were designed together with one of the first versions of Prolog.

DCGs are syntactic sugar for Prolog programs which in their now standard implementation represent strings by means of difference lists. When executed as a parser, a DCG inherits Prolog's top-down strategy with backtracking for checking out different alternatives. DCGs are very popular as they are very easy to write down and get running, especially for toy languages and not too complicated fragments of, say, natural language or programming languages. DCGs put very few restrictions on the context-free backbone of the grammar, as do most traditional methods for writing parsers; e.g. see Aho *et al.* (1986). The main drawbacks of DCGs are:

- lack of robustness, if the string to be analyzed does not conform with the grammar the result is simply failure,
- backtracking may lead to combinatorial explosions, so a grammar for a larger application needs to be tuned very carefully with cuts and the like to avoid this,
- lacking ability to handle left-recursive grammars.

To compensate partly for this, different authors (not referenced here) have proposed compiling DCGs into bottom-up parsers by traditional means.

The CHR language (Frühwirth 1998b) was introduced as a tool for writing constraint solvers in a declarative way for traditional constraint domains such as real or integer numbers and finite domains. CHR has proved to be of more general interest and is available as extension of, among others, SICStus Prolog (Swedish Institute of Computer Science 2003). The CHR web pages (Constraint Handling Rules Online 2002) contain a growing collection of applications. Being of special interest to language processing, Abdennadher and Schütz (1998) have shown that CHR adds bottom-up evaluation to Prolog and a flexibility to combine top-down and bottomup computations; Abdennadher and Christiansen (2000) have taken this a step further, showing that abductive logic programs can be expressed directly in CHR.

The metaphor given by the diagram above is very precise as we propose a notation that can be seen as a layer of syntactic sugar over CHR rules that parses bottom-up. A string is entered as a set of initial constraints and the rules apply over and over producing more and more syntax nodes from those already found. In this way we achieve a robustness not found in DCGs and avoid also the problems with backtracking and left-recursion; furthermore, this approach gives an inherent and elegant treatment of ambiguity without backtracking. In our approach, a string is encoded by means of integer word boundaries as also used in Datalog grammars (Dahl *et al.* 1994) and the classical paper on DCGs (Pereira and Warren 1980).

It is interesting to compare our CHRG formalism with Constraint Multiset Grammars (Marriott 1994) (CMGs) that can apply also to multidimensional languages such as diagrams. The rules of CMG include also context-conditions which seems capable of expressing the sort of context conditions included in CHRG. Meyer (2000) has applied CHR for parsing of CMGs with techniques very similar to ours, however without considering the compilation of a grammar notation into CHR. Recent work by (Bottoni *et al.* 2001) has proposed to apply a variant of linear logic for parsing CMGs.

Morawietz (2000) has implemented deductive parsing (Shieber *et al.* 1995) in CHR and shown that a specialization of a general bottom-up parser for context-free rules leads to propagation rules similar to those produced by our compiler. Our proposal for a grammar notation upon CHR was put forward in Christiansen (2001) and presented briefly in Christiansen (2002c); the CHRG system has also been presented as Christiansen (2003). An attempt to characterize the grammar of ancient Egyptian hieroglyph inscriptions by means of context-sensitive rules in CHRG is given by Hecksher *et al.* (2002).

In Christiansen and Dahl (2002; 2003), we have applied CHR for parsing with error detection and correction in which we employ CHRs ability to combine top-down and bottom-up computations, (Abdennadher and Schütz 1998): parsing proceeds bottom-up as described in the present paper and when symptoms of an error are seen, a top-down sweep for correcting the string is started, so that the parser may continue.

The notion of constraints, with slightly different meanings, is often associated with language processing. "Constraint grammars" and "unification grammars" are often used for feature-structure grammars, and constraint programming techniques have been applied for the complex constraints that arise in natural language processing; e.g. see, Gazdar and Mellish (1989), Allen (1995) and Duchier (2000) for an introduction and overview. One approach using CHR for this purpose in HPSG is that of Penn (2000).

Blache (2000) proposes a formalism with specific kinds of constraints for natural language which also seems to fit with an implementation in CHR. This approach combines constraints on the order in which things must occur, on which things imply the presence or absence of other things, etc. We have not tried to model this in CHRG, but CHRGs contexts and possible use of arbitrary hypotheses seems to be suited. See also Duchier and Thater (1999), Maruyama (1998) and Schröder *et al.* (2000) for similar approaches.

Our approach to abductive language interpretation using CHR Grammars is based on extension of our previous work (Abdennadher and Christiansen 2000) who showed how an abductive logic program with integrity constraint (but limited use of negation) can be rewritten as a CHR program; basically, the idea is to declare abducibles as constraints and write integrity constraints as CHR rules, and abduction works so to speak for free without any meta-level interpreter which usually is associated with abduction. We are not aware of other approaches to abductive language interpretation using CHR in this way.

The advantages of abduction for language interpretation – as theoretical model or as implementation – has been recognized be several authors (Charniak and McDermott 1985; Gabbay *et al.* 1997; Hobbs *et al.* 1993; Christiansen 1993), just to mention a small fraction, and this is taken in the present work as an established fact.

A conventional implementation of DCGs (Pereira and Warren 1980) applies a purely deductive interpretation method, synthesizing the meaning of a phrase from the meanings of its subphrases. This works well when context is known and every piece of information to be extracted is expressed in an explicit way. Abduction is in favour for more subtle meanings given, e.g., by linguistic implicature, and when the attention is on context comprehension. In Christiansen (1999) we have related Stalnaker's (1998) view of context comprehension to abductive language interpretation. One way to achieve abduction with logic grammars is, of course, to interpret a DCG using an interpreter for abductive logic programs such as Kakas et al. (2000); we have not made any benchmark tests but we expect this to be far less efficient than what is described in the present paper. An interesting variation of our method is to combine the core of our abduction method with DCGs as shown in example 12 below: the DCG is processed in the usual way but it may refer to abducible predicates defined as CHR constraints. An earlier paper (Christiansen 2002a) on our approach to abductive language interpretation discusses in more detail the relation to other abduction methods. In Christiansen and Dahl (2004), we have considered how our CHR versions of abduction and assumptions (Dahl et al. 1997) with integrity constraints can be used as an extension to Prolog.

#### 3 Syntax, semantics, and implementation of CHRG

#### 3.1 Preliminaries: First-order logic and CHR

First-order logic is assumed; variables are typically denoted by letters such as x, y, ... or with capital letters in typewriter font in programming notation; constants are typically denoted by letters such as a, b, ...; notation with a horizontal bar as in  $\bar{x}$  refers to a sequence of variables, similarly  $\bar{a},...$  for sequences of constants and  $\bar{t},...$  for sequences of terms.

We give the necessary definitions and properties for Constraint Handling Rules (CHR) in a slightly simplified form and refer to a general introduction elsewhere (Frühwirth 1998b).

Two disjoint sets of constraint predicates are assumed, called *defined constraints* (i.e. defined by the current program) and *built-in constraints*, the latter including "=", " $\neq$ ", true, and false. Atoms of constraint predicates are (with a slight overloading of usage) called (*defined* and *built-in*) constraints. Conjunctions are written by either " $\wedge$ " or, in programming notation, a comma.

The following CHR rules<sup>1</sup> are recognized:

**Progagation rules** H ==> G | B, **Simplification rules** H <=> G | B, and **Simpagation rules**  $H \setminus H' <=> G | B$  being an abbreviation for H, H' ==> G | H, B.

Each H (and  $H \setminus H'$ ) is called the *head*<sup>2</sup> of the rule and is a conjunction of one or more defined constraints indicated by commas, G the *guard* being a conjunction of built-in atoms, and B the *body* being a conjunction of constraints. A guard corresponding to true can be left out together with the vertical bar.

In examples and extensions to the framework we apply occasionally the possibility in the implemented CHR system of including arbitrary Prolog code in rule bodies, including those auxiliaries of the CHR system that goes beyond a declarative semantics as well as the abstract, procedural semantics given below. The same goes for the application of so-called deep guards in which constraints are called in the guard. In such cases we supply suitable informal descriptions.

A CHR program is a finite set of rules with its declarative semantics given as the conjunction of a logical reading of each rule as follows; the built-in "=" and " $\neq$ " have their standard syntactic meaning. Propagation rules and simplification rules in the format above are taken as abbreviations for the following respective formulas:

 $\forall \bar{x}((\exists \bar{y}G) \to (H \to \exists \bar{z}B))$ 

$$\forall \bar{x} ((\exists \bar{y} G) \to (H \leftrightarrow \exists \bar{z} B))$$

where  $\bar{x}$  refer to the variables in H,  $\bar{y}$  to those in G not overlapping with  $\bar{x}$ , and  $\bar{z}$  to those in B not overlapping with  $\bar{x}$ ; for simplicity it is assumed that  $\bar{y}$  and  $\bar{z}$  do not overlap; see Frühwirth (1998a; 1998b) for a generalization.

A rule with  $\bar{z}$  empty is said to be *range-restricted*. A *state* is defined to be a set of constraints and an *initial* state for a *query* Q (being a conjunction of constraints) is Q itself; we do not distinguish between sets and conjunctions. We distinguish a special state referred to as *failure* and any derivation step (below) leading to this state is said to be *failed*.

To execute  $a(n \text{ instance of } a) \text{ body } C \land E \land N$  where C are defined constraints, E and N built-in's with predicates "=" and " $\neq$ ", resp., in state S, consists of forming the state  $(S \cup C \cup N)\sigma$  where  $\sigma$  is a common, most general unifier for E. In addition, any  $s \neq t$  with s and t nonunifiable is removed. However, if no such  $\sigma$  exists or  $(S \cup N)\sigma$  contains  $t \neq t$  for some term t, the execution fails. Execution of a body containing false fails.

For an instance  $H \implies G | B$  of a propagation rule, we say that it *can be applied* in a state S whenever  $H \subseteq S$  and  $S \models \exists G$ , and to *apply* it means to execute B leading to a new state. When referring to an application of a rule  $H \implies G | B$  of

<sup>&</sup>lt;sup>1</sup> Our usage is to consider "CHR" as a name of a language rather that a written shorthand for a three-word term, thus "CHR rule" is not redundant.

 $<sup>^2</sup>$  Our terminology differs slightly from Frühwirth (1998b), who refers to *each* atom to the left of the arrow as a head.

the current program, this refers to some application of an instance  $(H => G | B)\sigma$ where  $\sigma$  is a substitution to the variables of H (referred to as  $\bar{x}$  above). No rule can be applied to a failure state. Application of simplification rules is defined in a similar way except that the head constraints are removed from the state before the body is executed.

A derivation for a query Q with a program P is a sequence of states  $Q = S_0, S_1, \ldots, S_n$ , where each  $S_i, 0 < i \le n$  is the result of applying a rule of P to  $S_{i-1}$  with  $S_{i-1} \ne S_i$ . A given propagation rule cannot be applied to the same constraints more than once. A state in a derivation is *final* if it is not failed and no rule can apply, and in this case the derivation is *successful*; a derivation ending with a failure state is said to be *failed*.

In practice, CHR programs are executed in a specific left-to-right order which may or may not restrict the final result. To define this, we must pay attention to the order in which conjunctions are written and the textual order of the rules; the actual computation rule applied in, say, the SICStus Prolog version of CHR (Swedish Institute of Computer Science 2003) is quite complicated, but the following simplified characterization is a good approximation that covers most cases. An *LR-derivation* is one in which:

- A state is a sequence of constraints  $c_1, \ldots, c_n$ .
- A built-in constraint is considered (as specified above) only when it appears as  $c_1$  and this takes priority over rule applications.
- For all *i*, no rule application involves any of  $c_i, \ldots, c_n$  if another application of a rule is possible.
- Rules are tested for applicability in the textual order in which they occur in the program.
- Whenever a rule is applied in a step, requiring constraints R to be removed from and A (as a sequence given by textual order in rule body) to be added to a state  $S = c_1, ..., c_n$ , the new state is A, S' where S' is S with R removed and with the order of the remaining constraints preserved.

This principle is also referred to as the *LR computation rule* and it implies that there is only one possible derivation. The version of CHR that underlies the implemented CHRG system (Christiansen 2002b) performs LR-derivations. A derivation without this computation rule is called *unrestricted*.

The following correctness properties for CHR derivations follow from Frühwirth (1998).

#### Proposition 1 (Soundness)

Let P be a CHR program, Q a ground query, and F a final state in a derivation for Q. Then  $P \models Q \leftrightarrow \exists F$  and  $P \cup Q \models \exists F$ .

#### Proposition 2 (Completeness)

Let *P* be a CHR program and *Q* a ground query which has at least one finite derivation and let *F* be a conjunction of constraints so that  $P \models Q \leftrightarrow \exists F$ . Then there exists a derivation with final state *F'* so that  $P \models \exists F' \leftrightarrow \exists F$ .

The following consequences are relevant for soundness and completeness of bottom-up parsers written in CHR.

## Proposition 3

Let P be a CHR program consisting of range-restricted propagation rules only and let F be a final state for a ground query Q. Then F is the least Herbrand model for  $P \cup Q$ .

In our treatment of abduction we may occasionally arrive at rules that are not range-restricted so the following refinement is useful.

## Proposition 4

Let P be a CHR program consisting of propagation rules only and let F be a final state for a ground query Q. Then there exists a ground instance of F which is a least Herbrand model for  $P \cup Q$ .

When using CHR for checking integrity constraints we rely on.

## Proposition 5

Let P be a CHR program with the property that any derivation with P is finite. We have, then, that  $P \cup \exists Q$  for any query Q is consistent if and only if there is a successful derivation for Q with P.

Soundness of disambiguation of grammars by replacing propagation rules by simplification rules follows from the following.

## Proposition 6

Let P be a CHR program consisting of propagation rules, and P' derived from P by changing some rules into simplification or simpagation rules, and let S and S' be final states for a given query with the programs P and P'. Then  $S' \subseteq S$ .

## 3.2 Syntax and informal semantics of CHRG

A CHR Grammar, or CHRG for short consists of finite sets of grammar symbols and constraints and a finite set of grammar rules, each of which may be a propagation (grammar) rule, a simplification (grammar) rule, or a simpagation (grammar) rule.

An attributed grammar symbol, for short called a grammar symbol, is formed as an atom whose predicate symbol is a grammar symbol; a grammar symbol formed by token/1 is called a *terminal*, any other grammar symbol a *nonterminal*. Sequences of terminal symbols token $(a_1)$ , ..., token $(a_n)$  may also be written  $[a_1, \ldots, a_n]$ ; if ground, such a sequence is called a *string*.

A few grammar symbols and operators are given a special meaning (made precise later):

• "..." and "i...j" with i < j called  $gaps^3$  supposed to match sequences of arbitrary length, resp., length n with  $i \le n \le j$ ,

<sup>&</sup>lt;sup>3</sup> These gaps provide a superficial resemblance with Gapping Grammars (Dahl 1984), however, in the present version of CHGR it is not possible to move around the string matched by a gap as in Gapping Grammars.

- "all" referring to the entire input string, which may be useful together with:
- " $\alpha$  \$\$  $\beta$ ", called *parallel match*, supposed to match strings that are matched by  $\alpha$  as well as  $\beta$ .

When referring to a sequence of grammar symbols, this may involve applications of the parallel match operator. A propagation rule is of the form

$$\alpha \neg \beta / - \gamma ::> G \mid \delta.$$

The part of the rule preceding the arrow ::> is called the *head*, G the guard, and  $\delta$  the body;  $\alpha, \beta, \gamma, \delta$  are sequences of grammar symbols and constraints so that  $\beta$  contains at least one grammar symbol, and  $\delta$  contains exactly one grammar symbol which is a nonterminal (and perhaps constraints);  $\alpha$  ( $\gamma$ ) is called *left (right) context* and  $\beta$  the *core* of the head; G is a conjunction of built-in constraints as in CHR and no variable in G can occur in  $\delta$ . If left or right context is empty, the corresponding marker is left out and if G is empty (interpreted as true), the vertical bar is left out. The convention from DCG is adopted that constraints (i.e. non-grammatical stuff) in head and body of a rule are enclosed by curly brackets). Gaps and parallel match are not allowed in rule bodies.

There is a restriction on the use of gaps in the core of a head so that the core must be *bounded* defined in the following way. This ensures that the core matches a specific interval of word boundaries when applied (and thus defines meaningful boundaries for the body):

- The core is *bounded* if it is *left* and *right bounded*.
- A sequence  $A_1, \ldots, A_n$  is left bounded (right bounded) if  $A_1$  ( $A_n$ ) is not a gap.
- A parallel match A \$\$ B is left bounded (right bounded) if at least one of A and B is left bounded (right bounded).

Furthermore, it is assumed that any variable appearing in body as well as guard also must occur in the head. A grammar rule is *range-restricted* if any variable in the body appears in the head.

A *simplification (grammar) rule* is similar to a propagation rule except that the arrow is replaced by <:>; a *simpagation (grammar) rule* is similar to a simplification except that one or more grammar symbols or constraints in the core of the head are prefixed by an exclamation mark "!". The intended meaning is that head core elements under a derivation are removed, except those prefixed by "!". (As the order of the elements in the head of a grammar rule does matter, we cannot take over the syntax from CHR.)

#### Example 1

The following source text shows the actual syntax used in the implemented system. The "handler" command is a reminiscent from the underlying CHR system; grammar symbols are declared by the grammar\_symbols construct as shown; constraints to be used in grammar rules are declared as in CHR which will be shown in subsequent examples. The final command has no effect in the present example, but it adds extra rules needed for the extensions of CHRG described in sections 5 and 6.

handler my\_grammar. grammar\_symbols np/0, verb/0, sentence/0. np, verb, np ::> sentence. [peter] ::> np. [mary] ::> np. [likes] ::> verb. end\_of\_CHRG\_source.

When the string "peter likes mary" is entered word by word, the words are recognized as a respectively np, verb, and np in that order, and then the rule for sentence can apply. Since this grammar consists of propagation rules, the lexical tokens as well as the nps and verb are not consumed. If we added a rule, say np, [likes] ::> sentence1, a sentence as well as a sentence1 would be recognized. If all rules were changed into simplification rules, i.e., replacing ::> by <:>, only one of sentence and sentence1 would be recognized.

Left and right contexts of a rule may include "disjunctions" denoted by semicolon of different alternatives, and this is considered syntactic sugar for the set of different rules, taking one alternative for the left and one for the right.

*Example 2* The rule

(a ; b) -\ c /- (d ; e) ::> f

is an abbreviation for the following four rules:

a -\ c /- d ::> f b -\ c /- d ::> f a -\ c /- e ::> f b -\ c /- e ::> f

The implemented version of CHRG allows control structures in the body (conditionals and Prolog-style disjunctions) and arbitrary Prolog goals inside  $\{\cdots\}$  as well as bodies with no grammar symbols; for the reason of simplicity, we ignore these options in this presentation.

# 3.3 Bottom-up derivations as semantics and the relation to top-down syntax derivations

To capture the whole CHRG formalism, a semantic definition needs to be based on bottom-up derivations and the simplest way to achieve this is by a translation of CHRG into CHR. For comparison with traditional grammar formalisms, we provide also a definition of top-down derivations that characterize a subclass of GHRGs.

For each grammar symbol N of arity n, we assume a corresponding constraint also denoted by N of arity n + 2 called an *indexed grammar symbol*, with the extra two arguments referred to as phrase (or word) *boundaries*.

For a grammar symbol  $S = N(\bar{a})$ , the notation  $S^{n_0,n_1}$  refers to the indexed grammar symbol  $N(n_0, n_1, \bar{a})$  with integers  $n_0 < n_1$ ; in case of a terminal,  $n_0+1 = n_1$ 

is assumed. For any sequence  $\sigma$  of grammar symbols  $S_1, \ldots, S_k$  and increasing integers  $n_0, n_1, \ldots, n_k$ , we let  $\sigma^{n_0, n_k}$  refer to the set  $\{S_1^{n_0, n_1}, \ldots, S_k^{n_{k-1}, n_k}\}$  with the existence of  $n_1, \ldots, n_{k-1}$  understood. For the parallel match operator, we define  $(\alpha \$\$ \beta)^{n,m} = \alpha^{n,m} \$\$ \beta^{n,m}$ . This notation is extended so that for a sequence of grammar symbols and constraints, we remove all constraints from the sequence, put indexes on the remaining grammar symbols, and add again the constraints to the sequence in their original position.

Gaps are removed from rule heads under this translation but give rise to inequations to be added to the guard of the resulting CHR rule; we do not formalize this here but illustrate the principle in Example 4 below.

The translation of rules from CHRG into CHR adds two extra variables to each grammar symbol and we use a notation analogous to the above to indicate this. So for a sequence  $\sigma$  of grammar symbols  $S_1, \ldots, S_k$  and variables  $x_0, x_1, \ldots, x_k$ , we let  $\sigma^{x_0, x_k}$  refer to the set  $\{S_1^{x_0, x_1}, \ldots, S_k^{x_{k-1}, x_k}\}$  with the existence of  $x_1, \ldots, x_{k-1}$  understood. The notation is extended to sequences of grammar symbols and constraints as above so that constraints are unaffected.

The translation of a CHRG G into CHR is denoted C(G) and consists of the translation C(R) of each rule  $R \in G$ . For propagation and simplification rules we have

$$C(\alpha - \langle \beta / -\gamma : :> G | \delta) = (\alpha^{x_0, x_1}, \beta^{x_1, x_2}, \gamma^{x_2, x_3} ==> G | \delta^{x_1, x_2}),$$
  
$$C(\alpha - \langle \beta / -\gamma < :> G | \delta) = (\alpha^{x_0, x_1}, \gamma^{x_2, x_3} \langle \beta^{x_1, x_2} <=> G | \delta^{x_1, x_2}).$$

Simpagation grammar rules are translated similarly to simplifications except that those elements of  $\beta^{x_1,x_2}$  that were preceded by "!" in the original grammar rule are moved to the left of the backslash. Notice that a grammar rule *R* is range-restricted if and only if the CHR rule C(R) is range-restricted.

Example 3

The rule in following source text:

constraints h/1. grammar\_symbols a/0, b/1, d/1, e/2. a -\ b(X), [c], {h(Y)} /- d(Y) ::> e(X,Y).

is translated into this CHR rule:

```
a(N0,N1), b(N1,N2,X), token(N2,N3,c), h(Y), d(N3,N4,Y)
==> e(N1,N3,X,Y).
```

#### Example 4

The translation of gaps and parallel matching into CHR is illustrated for the following CHRG rules.

a, ..., b /- ..., c(X) <:> d(X). a\$\$b ::> e.

They are translated into the following CHR rules:

 $c(N5,_,X) \setminus a(N1,N2),b(N3,N4) \iff N2 = <N3, N4 = <N5 | d(N1,N4,X) a(N1,N2),b(N1,N2) ==> e(N1,N2)$ 

The gap in the context part of the first rule is used in order to make a "long-distance reference" to c.

Notice that a gap in the head of core of a simplification rule does not imply the removal of any grammar symbols recognized in the substring spanned by the particular "instance" of the gap.

A (bottom-up) parsing derivation for a string  $\sigma$  with a CHRG G is a derivation with the CHR program C(P) for the query  $\sigma^{0,n}$  where n is the length of  $\sigma$ . An interesting class of parsing derivations are those that apply an LR computation rule as in the implemented CHRG system and for which we describe some optimizations below.

## Definition 1

A *single-production* is a grammar rule with singleton grammar symbols in head core and in body. A grammar is *loop-free* if there is no chain of single productions

 $\cdots g_1(\ldots) \cdots \gg \cdots g_2(\ldots) \cdots, \quad \ldots, \quad \cdots g_{n-1}(\ldots) \cdots \gg \cdots g_n(\ldots) \cdots,$ 

with  $g_1 = g_n$ ; here each occurrence of ">>>" may stand for any of "<:>" or "::>".

To get rid of termination problems once and for all, any CHRG is assumed to be loop-free.<sup>4</sup>

We notice without proof the following obvious properties.

## Proposition 7

- 1. Any parsing derivation is finite (as we assume all grammars to be loop-free).
- 2. Any state in a parsing derivation with a range-restricted grammar is ground.
- 3. The final state in an LR parsing derivation for a given string is unique (up to renaming of existentially quantified variables that may occur for non-range-restricted grammars).
- 4. The final state in a parsing derivation with a propagation rule grammar is unique (up to renaming ...); thus LR-derivations are complete for propagation rule grammars.
- 5. Completeness of LR-derivations does not necessarily hold for a grammar with simplification or simpagation rules.
- 6. Let G be a propagation rule grammar without context parts, and G' be derived from G by adding to some rules context parts and changing some rules into simplification or simpagation rules, and let S and S' be final states for a given string with the grammars G and G'. Then  $S' \subseteq S$ . This holds also when we restrict to LR-derivation for G' or for both G and G'.

To discuss ambiguity, we define syntax trees but we do not intend that an implementation should generate trees.

<sup>&</sup>lt;sup>4</sup> It is possible to weaken this definition slightly. Some chains of single-productions can be allowed provided their arguments plus non-grammatical hypotheses do not grow in an application of the rule. As we have assumed a set-based semantics for CHR (as opposed to multi-sets), we could allow even p(X)::>p(X) but not p(X)::>p(f(X)) or p(X), {h(Y)}::>p(X), {h(f(Y))}.

## Definition 2

Let CHRG G and input string  $\sigma$  be given. The set of *syntax trees* over  $\sigma$  is defined as follows:

- Any t = token(a, n, n + 1) in  $\sigma$  is a syntax tree with top node t.
- Whenever a rule instance α \β /- γ>>>G | δ, ">>>" being one of "::>" or "<:>", is applied in a derivation and T<sub>1</sub>, ..., T<sub>n</sub> are trees whose top nodes are the grammar symbols in β, then

is a syntax tree with top node  $\delta$ .

A syntax tree whose top node does not occur in the final state (i.e. it has been consumed by a propagation or simpagation rule) is called a *hidden syntax tree* and similarly for the node itself. The set of *LR syntax trees* is defined in a similar way, considering only instances applied in the LR-derivation from  $\sigma$  with *G*. The notions of subtree and proper subtree are defined in the usual way.

The relevant notion of unambiguity in the context of CHRG is called local unambiguity and is a stronger property than the usual notion of unambiguity for context-free grammars. CHRG works bottom-up with no sort of top-down guidance so even with an unambiguous grammar (in traditional sense), it may be the case that some subtree becomes part of two different, larger trees (but only one of these contribute to a tree for the entire string).

## Definition 3

Consider a CHRG G and a derivation for string  $\sigma$  and let **T** be a set of syntax trees with set of top nodes **N**. The set **T** (and **N**) is said to be *unambiguous* whenever, for any two grammar symbols  $p(i, j, \dots), q(k, \ell, \dots) \in \mathbf{N}$  it holds that

- if  $i \leq k < j \leq \ell$ , then i = k and  $j = \ell$ , and
- if i ≤ k ≤ l ≤ j, then q(k, l,...) is top node of a subtree of p(i, j,...) or the other way round [the last case requires single productions in the grammar and ⟨i,j⟩ = ⟨k, l⟩].

If, furthermore no new syntax tree of the derivation can be added to  $\mathbf{T}$  without destroying unambiguity, we say that  $\mathbf{T}$  and  $\mathbf{N}$  are *maximal*. A CHRG *G* is *locally unambiguous* if the set of syntax trees in the derivation from any input string is unambiguous, and *locally LR-unambiguous* if the set of syntax tree in the LR-derivation from any input string is unambiguous.

Maximal unambiguous sets for a given parsing derivation may overlap, and each such set corresponds to one possible way of parsing the string. As we will see later, when doing abduction with ambiguous grammars, it is possible to extend a grammar so that the different unambiguous sets are kept apart by means of indexes. Although CHRG provides an elegant handling of ambiguous grammars, it may be relevant to aim at unambiguity, e.g. for efficiency or to avoid mixing up extragrammatical constraints for different parses. One obvious way to achieve this is given by the following which is easy to prove.

Proposition 8

A simplification rule CHRG is locally LR-unambiguous.

Although we have no theoretical result, it seems reasonable to believe that the local unambiguity of CHRGs is undecidable as is unambiguity for context-free grammars. If unambiguity is required this can be guaranteed by Proposition 8 or perhaps using a combination of different sorts of rules, in which case the property needs to be verified.

It should be noticed, that the definition of unambiguous sets does not take into account left and right context parts of grammar rules. A rule that produces a node belonging to one unambiguous set may very likely do so by referring to contextual nodes belonging to other sets. This may be considered a bug or a feature but it seems to be the only solution that fits with our general implementation principle. To compare with traditional grammar formalisms having their meaning defined by top-down derivations we consider definite clause grammars; to simplify the comparison, we make a restriction on how variables can be used.

## Definition 4

A definite clause grammar (DCG) D consists of rules of the form

 $A \rightarrow B_1, \ldots, B_n, \{G\}$ 

where A is a nonterminal,  $B_1, \ldots, B_n$  are grammar symbols, and G a conjunction of built-in's so that any variable in A and G occurs in some  $B_i$ . A DCG is assumed to be loop-free and without single productions (defined in the usual way).

For any ground sequence of grammar symbols  $\alpha A\beta$  (*A* a single grammar symbol), define the relation  $\alpha A\beta \Rightarrow \alpha B_1 \dots B_2\beta$  whenever there is a rule in *D* with a ground instance  $A \rightarrow B_1, \dots, B_n, \{G\}$  with *G* satisfied. The reflexive, transitive closure of  $\Rightarrow$  is denoted  $\Rightarrow^*$ .

Proposition 9

Let D be a DCG and C the CHRG that for each rule in D of the form indicated above contains

 $B_1,\ldots,B_n::>G|A.$ 

For ground grammar symbol A and terminal string  $\alpha$ , the following statements are equivalent:

- $A \Rightarrow^* \alpha$  using the rules of *D*,
- A is contained in the final state in any parsing derivation for  $\alpha$  using rules of C.

The proof is easily made by induction over the length of the derivations. Combining this with Proposition 7, part 6, we see that a CHRG with context parts corresponds to a DCG with context-sensitive restrictions on the derivation relation (that are not easily formalized in the setting of DCG). Finally, notice that

CHRG do not provide empty productions. These, however, are easily mimicked by inserting for each DCG rule  $A \rightarrow []$  grammar symbols A(0,0), A(1,1), ... into the initial constraint store.

#### 3.4 A compile-on-consult implementation

We describe here very briefly the principles used for the implementation of CHRG in SICStus Prolog (Swedish Institute of Computer Science 2003) and describe some additional features of the implemented system not already covered; all facilities are described at the online Users Guide to CHRGs available at Christiansen (2002b).

Similar to DCG and CHR, CHRG is implemented by changing Prolog's reader so that the terms read are translated into another form before given to the Prolog compiler (or interpreter). SICStus Prolog includes a so-called hook predicate called term\_expansion that can be extended by the user and which is called automatically by the Prolog reader for each term read from a source file. The term\_expansion clauses defining the CHRG syntax must work together with those already defined by CHR. The general structure of the CHRG implementation is illustrated by the following fragment that treats the grammar\_symbols declaration:

```
term_expansion( (grammar_symbols G), T):-
   add 2 to arities of gr. sym. spec's G and add token/3 and a few more to form C,
   term_expansion((constraints C), T).
```

Similar rules catch terms formed by the operators <:> and ::>, translate them into CHR rules as described in Section 3.3, and let the CHR system translate them further into Prolog rules.<sup>5</sup> The CHRG notation includes counterparts to CHR's pragmas and rule names (in CHR using an @ operator), but since it is not possible for override the term\_expansion clauses given by CHR, it has been necessary to rename these operators in the CHRG syntax, gpragma and @@.

Notice that this sort of implementation makes it possible to mix freely the rule formats of Prolog, CHR and CHRG, and DCG for that matter. Finally, the CHRG notation includes a where notation which can be applied to rules of Prolog and CHR as well. We describe it by an example:

```
a(A) -\ B /- ..., q(X,Y) ::> {C}, funny_sentence(A,Z)
where A = ugly(st(r,u,c(t,u,r(e)))),
        B = (np, verb, np),
        C = (append(X,Y,Z), write(Z))
```

The meaning is that any occurrence in the rule of A, B, and C is replaced by the indicated term. The implementation is very simple and one might wonder why this syntax is not standard in Prolog systems:

<sup>&</sup>lt;sup>5</sup> It is not possible to compile CHR into ordinary Prolog clauses and the SICStus Prolog implementation of CHR is based on the low-level library of Attributes Variables.

```
term_expansion((Rule where Goal), Result):-
  (Goal -> term_expansion(Rule, Result)
  ; write('Error: where-clause failed: <rule> where '),
     write(Goal),nl,write('Compilation stopped'), abort).
```

The CHRG system includes a number of options of which the most important is an optimization in the compilation of grammar rules, so that all but leftmost symbols of core and possible right context are marked by passive pragmas; see the section on CHR at the SWICS web site (Swedish Institute of Computer Science 2003) for a detailed explanation of these concepts. For example, with this option the rule np, verb, np ::> sentence gets compiled into

```
np(X0,X1)#A, verb(X1,X2)#B, np(X2,X3) ==> sentence(X0,X3)
pragma passive(A), passive(B).
```

This has significant influence on the efficiency that we analyze in detail in Section 3.5. Operationally, the principle means that this rule is not checked for applicability at the moment when a new verb constraint is created as is the case if no pragma passive stuff were added. And, as the system performs LR-derivation, this check for applicability would anyhow fail. For the nps it means that when a new np is created, the system does not check if it might be followed (qua the word boundary arguments) by verb, np; it is only checked if the new np happens to follow some existing np, verb sequence. It can be shown that the semantics is not changed for propagation rule grammars with only right contexts. When left and right context or simplification or simpagation rules are used, there are subtle cases where a rule is not applied although it intuitively should be applied. When this optimization is used for a grammar of simplification rules only, the constraint store is used effectively as a parsing stack in quite the same way as in a traditional LR(k) parser.

For parsing a specific string, the system includes an auxiliary predicate parse that converts a list of constants to a sequence of calls to token constraints. This predicate may (as an option that can be switched on and off) display the word boundaries which makes it easy to compare input and result. Assuming the grammar of Example 1 above, we have the following dialogue.

```
?- parse([peter,likes,mary]).
<0> peter <1> likes <2> mary <3>
np(0,1),
verb(1,2),
np(2,3),
sentence(0,3),
token(0,1,peter),
token(1,2,likes),
token(2,3,mary) ?
```

This grammar consists of propagation rules; if all are changed into simplification rules, only sentence(0,3) appears as the answer.

#### 3.5 Time complexity

An apparent advantage of CHRG as compared with DCG is that we avoid the combinatorial explosions that may arise under backtracking in case a wrong choice of rule is made in beginning of the string to be analyzed.

Here we give theoretical measures for the running time of CHRGs, more precisely the CHR rules that are produced by their compilation, and discuss the behaviour of the implemented system. For simplicity, we do not consider context parts or the use of extra-grammatical constraints. Without loss of generality, we consider only rules with one or two grammar symbols in the head. The CHR rules to consider are, thus, of one of the following forms, possibly with <=> instead of ==>.

1. 
$$A(i,j,\bar{t}_1) => B(i,j,\bar{t}_2).$$

2. 
$$A(i, j, \bar{t}_1), B(j, k, \bar{t}_2) ==> C(i, k, \bar{t}_3).$$

We refer to the so-called meta-complexity theorems of McAllester (2001) and Ganzinger and Mcallester (2001; 2002) for bottom-up evaluation of logic programs including deletion. CHR rules, such as those we use, with one constraint in the body are covered by this scheme. The main theorem of Ganzinger and Mcallester (2001) gives that time complexity for reaching a final state is of order  $\mathcal{O}(n + p)$  where *n* is number of constraints in an initial state and *p* the number of prefix firings that have appeared in some state in the derivation. The number *n* is the length of the string in our case. Estimating *p* is more difficult. For each rule of type 1 (above), we count the number of occurrences of  $A(i, j, \bar{t}_1)$  that have occurred in a state; summing for all type 1 rules, we can limit the contribution by size of grammar times total number of grammar symbols that have occurred in the derivation. For each rule of type 2, the prefix firings are of two kinds:

- occurrences of  $A(i, j, \bar{t}_1)$  (that can be estimated as for type 1), and
- occurrences in any state of a pattern matching the entire head  $A(i, j, \bar{t}_1)$ ,  $B(j, k, \bar{t}_2)$ .

The dominant contribution is the last one for type 2 rules, i.e. for each rule of type 2 and each  $C(i, k, \bar{t}_3)$  occurring in a state, the possible ways the interval [i, k] can be split up into [i, j] and [j, k] so that some  $A(i, j, \bar{t}_1), B(j, k, \bar{t}_2)$  have appeared at the same time in the state during the derivation.

We continue the analysis for two special cases:

- Locally unambiguous grammars: each  $C(i, k, \bar{t}_3)$  in some state is created exactly once from a specific  $A(i, j, \bar{t}_1), B(j, k, \bar{t}_2)$  combination. Thus the overall time complexity is proportional to the total number of grammar symbols that have appeared in the derivation, and we argue that it is of order  $\mathcal{O}(n)$  for a locally unambiguous grammar: Worst case is a binary branching everywhere, so a syntax tree over a string of length *n* has *n* nodes in its deepest layer,  $\lfloor n/2 \rfloor$  in the second deepest layer,  $\lfloor n/4 \rfloor$  in the next one and so. Summing up, we get at most 2n - 1 tree nodes.
- Arbitrary grammars without attributes: first, let us estimate the maximum number of nodes. There are  $\mathcal{O}(n^2)$  different substrings of the input string, each

of which can represent up to g different nodes where g is the number of different grammar symbols in the vocabulary; this is constant, so number of different nodes is  $\mathcal{O}(n^2)$ . Each such node C(i,k) spans over an interval [i,k], and the maximum number of ways it can be split up into two subintervals by some j, i < j < k, possibly representing A(i,j), B(j,k), is k - i - 1. This adds another factor n, so we end up with a total time complexity of  $\mathcal{O}(n^3)$ .

The general cubic complexity for context-free grammars is similar to that of classical algorithms such as Early and Cocke-Younger-Kasami. Its interesting to notice that parsing is linear for locally unambiguous grammars despite the very naive parsing algorithm which simply applies rules over and over as long as possible.

It is straightforward to show that the results also hold for grammars with context parts. So if a grammar is made locally unambiguous by a combination of simplification rules and context parts, it runs in linear time; the presence of attributes does not affect this.

When attributes are added in the general case, we can have much worse than cubic complexity as it appears in the following example:

Example 5 Consider the grammar

[a]::>a(0) a(T1),a(T2)::>a(t(T1,T2))

For each pair of i, j marking a substring of the input string, there will be as many different nodes as there are binary trees with a frontier of j - i + 1 nodes. It appears that each node is constructed in a unique way, but the total number of nodes is given by a terrible combinatorial expression far beyond  $n^3$ .

How do these results compare with practice? First of all, the optimization in section 3.4 adding passive pragmas to all but rightmost symbols is necessary in order to achieve an execution as the one assumed in the theorem of Ganzinger and Mcallester (2001). Secondly, the method behind the implementation of CHR that we have used (based on attributed variables), as described by Holzbaur and Frühwirth (1999), indicates that word boundaries should be uninstantiated Prolog variables to achieve full efficiency and not integers as we have used.

Experiments with Prolog variables for boundaries confirm these results but even with integer indexes, CHRGs without too much local ambiguity execute equally fast for strings up to several hundreds of tokens.

Unfortunately, CHR does not construct explicit prefix-firings during execution, which means that only grammars with at most two grammar symbols show the expected running times. It is possible to have the CHRG compiler reduce the size of heads to at most two, but a general improvement of CHR so that it incrementally builds prefix firings would solve the problem. In practice, however, grammars with heads with up to three or four symbols may run almost linearly provided the passive pragma optimization is used and local ambiguity is limited.

## 4 Examples in plain CHRG

## 4.1 Disambiguation with simplification and context parts

It is often the case that an unambiguous grammar, e.g. a context-free grammar for a programming language, can be written in a much simpler form as an ambiguous grammar with additional "disambiguation principles" specified outside the grammar formalism; e.g. see Aho *et al.* (1986). As we have noticed already, simplification rule grammars are unambiguous and by means of context parts, we can direct the derivations as to respect the priorities we have in mind.

## Example 6

The following simplification rule CHRG is based on a simple and highly ambiguous grammar for arithmetic expressions with addition, multiplication, and exponentiation. Right contexts have been added which provides a conventional operator precedence.

```
e, [+], e /- (['+'];[')'];[eof]) <:> e.
e, [*], e /- ([*];[+];[')'];[eof]) <:> e.
e, [^], e /- [X] <:> X \= ^ | e.
['('], e, [')'] <:> e.
[N] <:> integer(N) | e.
```

In general, both left and right contexts are relevant, and for natural language application, it may be relevant to disambiguate some portions of the grammar in this way but keeping, say, possibilities of ambiguity at the sentence structure level.

Natural language processing often involves a phase called tagging in which the different words are classified before the "real" parsing process takes place. Tagging is often performed by means of context sensitive rules that take into account what is immediately to the left and to the right of the given word (Brill 1995). Such rules can be expressed in quite natural way in CHRG using context parts.

## Example 7

We consider a languages including sentences such as "Peter and Paul like Martha and Eve". The following rules classify the names as subject or object according to their position relative to the verb.

```
name(A) /- verb(_) <:> subject(A).
name(A), [and], subject(B) <:> subject(A+B).
verb(_) -\ name(A) <:> object(A).
object(A), [and], name(B) <:> object(A+B).
```

#### 4.2 Long-distance reference in natural language parsing

Context parts can also be used as a way to access attributes of grammar symbols at a certain distance. This is relevant in natural language when a part of a sentence is left out when this part is understood to be identical to the matching part of a neighbouring sentence. Example 8

Let us extend the language of Example 7 with coordination as in "Peter and Paul likes and Mary hates Martha and Eve"; the first sentence is incomplete but is understood to borrow its subject from the second sentence. This can be expressed as follows:

For the sample sentence above, the final constraint store contains sentence nonterminals with attributes s(peter+paul,like,martha+eve) and s(mary,hate, martha+eve). These rules work also in the case when three or more sentences share a common object. For analyzing texts consisting of a single sentence, a rule with a gap could have been used instead:

subject(A), verb(V) /- [and], ..., object(B)
 ::> sentence(s(A,V,B))

## 4.3 Post-parsing processing in CHRG

In an application program using CHRG for text analysis it may be relevant to make some formatting of the constraint store produced by the parser. As we have noticed, parsing with an ambiguous propagation rule grammar may result in a large number of nodes, most of them not relevant for the further processing (but necessary to guide parsing). It may be the case that we do not want to reduce ambiguity in the grammar, so some elaboration of the constraint store needs to take place following parsing. Part of such post-parsing processing can in fact be specified conveniently in CHRG.

Example 9

Assume we are scanning a text for noun phrases (nps) by means of a highly ambiguous grammar with a detailed description of sentence structure as a way to obtain a high degree of precision in the parser. When the parser has finished its job, we are only interested in noun phrases and let us suppose that only maximal noun phrases are of interest, maximality with respect to text inclusion. This can be achieved by using a constraint cleanup defined by the following rules:

```
vp(_), {!cleanup} <:> true.
pp(_), {!cleanup} <:> true.
sentence(_), {!cleanup} <:> true.
% etc.
(..., np(_), ... $$ !np(_)), {!cleanup} <:> true.
cleanup <=> true.
```

Recall that the exclamation mark combined with the double arrow indicates simpagation rules: All but those symbols marked by "!" are removed from the store.

Assume the following query is issued:

```
?- parse([string]), cleanup.
```

The cleanup rules does not affect parsing as there is no cleanup constraint in the store before all token constraints have been entered and no parsing rule can apply anymore. Now the call to cleanup will, via the first set of rules, remove all non-np nodes; these simpagation rules will apply over and over until all such nodes are removed but each application leaves cleanup in the store. Then the rule concerning nps will apply to each occurrence of one np textually included in a larger np; recall that \$\$ is the parallel match operator and the three dots are a gap. The final rule, conveniently written as a CHR rule, will apply when the other rules are exhausted and thus clean up the cleanup constraint. Left in the constraint store is the set of all maximal nps.

#### 5 Abductive language interpretation in CHRG

As shown by Abdennadher and Christiansen (2000), and developed further in Christiansen (2002a), abduction with integrity constraints can be implemented in a straightforward fashion in CHR, basically by declaring abducible predicates as constraints: When an abducible atom is called, it is added to the constraint store and possible integrity constraints will be triggered automatically. The approach is limited with respect to negation: explicit negation of abducibles is easily implemented by means of an integrity constraint but more general application of negation-as-failure in background clauses or CHR rules has no obvious representation.

We can illustrate the application to language interpretation in CHRG by means of an example. Consider the following grammar rule in which F refers to a fact about the semantical context for a given discourse:

a, b, 
$$\{F\}$$
 ::> ab (1)

If two subphrases referred to by a and b have been recognized and the context condition F holds, it is concluded that an ab phrase is feasible, grammatically as well as with respect to the context. Language analysis with such rules works quite well when context is completely known in advance, and a given discourse can be checked to be syntactically and semantically sound.

Here we provide a solution to the extended problem referred to as *language interpretation*, of finding proper context theory so that an analysis of an observed discourse is possible. This involves a transformation of grammar rules as above by moving contextual predicates to the other side of the implication:

a, b ::> 
$$\{F\}$$
, ab (2)

Intuitively it reads: if suitable a and b are found, it is feasible to assert F and (thus, under this assumption) to conclude ab.

Although (1) and (2) are not logically equivalent it is straightforward to formulate and prove correctness of this transformation, as we will see below.

A grammar as depicted by (1) can be thought of as part of a *speaker's* capabilities, embedding his knowledge about the context into language, whereas (2) is relevant for a *listener* who wants to gain new context knowledge by an interpretation of the spoken.

#### 5.1 Abduction as bottom-up deduction

The transformation indicated above can be formulated without detailed assumptions about the grammar formalism applied, it may in principle include any kind of transformations, multiple passes and be based on trees, graphs or something completely different. The input need not necessarily be strings or sequences but might also be a combination of sensor signals or multidimensional structures, e.g. described by means of Constrained Multiset Grammars (Marriott 1994).

The vocabulary for a language interpretation problem consists of disjoint sets of constraints referred to as *grammar symbols* and *context predicates*. Grammar symbols are separated into *token level* symbols and *phrase level* symbols.

The basic components in a language interpretation scenario are the following.

*Discourse*: a set of ground token level atoms giving the set of input tokens and their relative order (e.g., sequentially or in the shape of a graph for a visual language) and, if available, extra information such as prosody, colour, etc.

Context: a set of ground context atoms describing a part of the world.

- IC: a set of *integrity constraints* which must be satisfied by *Context*, each of the form  $H \rightarrow B$  where H is a conjunction of context atoms and B a conjunction of built-in's and context atoms; however, the total set of integrity constraints must not be recursive (or should satisfy some weaker criterion that guarantees termination).
- *Phrases*: a set of ground phrase level atoms giving the phrases contained in the *Discourse* that are grammatically correct and consistent with *Context*.

Grammar: a set of formulas for the form

 $\forall$ (*Constituents*  $\land$  *Facts*  $\rightarrow$  *Phrase*),

where *Constituents* and *Phrase* are nonempty conjunctions of grammar atoms, *Facts* a conjunction of context atoms. Each rule must be *range-restricted* in the sense that any variable in *Phrase* must occur in *Constituents* or *Facts* and the grammar must be *loop-free* defined analogously to definition 1 (for CHRG). Furthermore, each argument in the left-hand side must be a variable that do not occur elsewhere in that lefthand side.

We require the following fundamental relation referred to as *faithfulness* between the components:

 $\begin{cases} Grammar \land Discourse \land Context \to Phrases\\ IC \cup Context \text{ is consistent} \end{cases}$ (3)

This means that the *Discourse* and the *Phrases* in it are true to the *Context* and correctly formulated with respect to the *Grammar*.

In the case of an ambiguous grammar, we can expect different interpretations for different parses of the string. However, we do not require the grammar to be unambiguous, but assume a criterion of *unambiguity* of a set of *Phrases* which is particular to the grammar formalism applied; a criterion for CHRG is given by Definition 3.

Not every pair of unambiguous Phrases and Context is interesting.

## Definition 5

A pair of unambiguous *Phrases* and *Context* is a *competent interpretation* of given *Discourse* with respect to given *Grammar* whenever faithfulness and the following conditions hold:

- 1. (Minimality of *Context*) If any element is removed from *Context*, faithfulness fails to hold.
- 2. (Maximality of *Phrases*) If any new element is added to *Phrases*, unambiguity or faithfulness fails to hold.
- 3. (Analysis is exhaustive) No new elements can be added to *Context* which allow an extension of *Phrases* so that points 1 and 2, and faithfulness are preserved.

A *language interpretation problem* is a problem, given *Grammar* and *Discourse* of finding a competent interpretation.

The condition of exhaustive interpretation excludes  $Context = Phrases = \emptyset$  unless the *Discourse* is completely senseless.

Language interpretation is partly deductive and partly abductive. The *Context* is a premise in (3) and by standard usage, the finding of it is an abductive problem. Identifying phrases is a mainly deductive parsing process, applying grammar rules over and over, however, interacting with abduction in order to have the necessary contextual facts ready.

The translation of a grammar G into an version that can be executed in a purely deductive way is defined by a transformation T(G) in which each rule

$$\forall (C \land F \to P) \tag{4}$$

is replaced by the rule

$$\forall (C \to \exists \bar{z} (F \land P)) \tag{5}$$

where  $\bar{z}$  are the variables in F that do not occur in C. The fact that T(G) may not be range-restricted indicates some technical problems that we have to deal with, but it should be emphasized that T(G) being non-range-restricted does not necessarily indicate that G is too weakly specified: Although a variable in F does not receive a value by the matching of C, it may receive a value later from an integrity constraint – or it may remain unbound in case the discourse does not provide enough information. The presence of such variables indicates that we cannot expect derivations to produce ground *Context* and *Phrases*, and an arbitrary grounding (instantiation of variables) in such cases will produce a more specific solution than there is evidence for – even if it is minimal wrt. set-inclusion. This discussion should clarify the following correctness theorems.

## Theorem 1 (Completeness)

Let *Grammar*, T(Grammar) and ground *Discourse* be given as above. If there exist ground *Context* and *Phrases* so that faithfulness (3) holds with *Context* minimal wrt. this property, then there exist *Context'* and *Phrases'* so that

$$T(Grammar) \land Discourse \land IC \to \exists (Context' \land Phrases')$$
(6)

where (Context, Phrases) is an instance of (Context', Phrases').

Theorem 2 (Soundness)

Let *Grammar*, T(Grammar) and ground *Discourse* be given as above. If there exist *Context'* and *Phrases'* so that

$$T(Grammar) \land Discourse \land IC \to \exists (Context' \land Phrases'), \tag{7}$$

then there exists a ground instance (Context, Phrases) of (Context', Phrases') so that  $IC \cup Context'$  is consistent and

$$Grammar \land Discourse \land Context' \to Phrases'$$
(8)

Proof of Theorem 1

Let Grammar, T(Grammar), ground Discourse, Context and Phrases be as in the theorem so that (3) holds. Define G to be the set of all ground instances of rules in Grammar, and let

$$G_0 = \{ c \to p \mid (c \land f \to p) \in G \text{ and } f \in Context \}$$
  

$$G^T = \{ c \to f \land p \mid (c \land f \to p) \in G \text{ and } f \in Context \}$$

We have from (3) that

 $G \land Discourse \land Context \rightarrow Phrases$ 

and from this that

 $G_0 \wedge Discourse \rightarrow Phrases.$ 

That is, we have eliminated *Context* by using a specialized grammar. The rules of  $G^T$  differs from those of  $G_0$  by introducing on the right-hand side an element of *Context*. Referring to minimality of *Context*, we have that

 $G^T \wedge Discourse \rightarrow Context \wedge Phrases.$ 

Consider now a "proof" of *Context*  $\land$  *Phrases* applying a finite sequence of rules  $c_i \rightarrow f_i \land p_i, i = 1, ..., n$  to generate the following sets:

$$C_0 = Discourse, \quad F_0 = \emptyset$$
$$C_i = C_{i-1} \cup p_i, \quad c_i \subseteq C_{i-1}$$
$$F_i = F_{i-1} \cup f_i$$
$$C_n = Phrases, \quad F_n = Context$$

From this, we construct another parallel proof in which the rules applied are instances of clauses of T(Grammar),  $(c'_i \rightarrow f'_i \wedge p'_i)\sigma_i$  where  $\sigma_i$  is a substitution to the variables of  $c'_i$  so that

$$C'_{0} = Discourse, \quad F'_{0} = \emptyset$$

$$C'_{i} = C'_{i-1} \cup p'_{i}\sigma_{i}, \quad c'_{i}\sigma_{i} \subseteq C'_{i-1}$$

$$F'_{i} = F'_{i-1} \cup f'_{i}\sigma_{i}$$

$$C'_{n} = Phrases', \quad F'_{n} = Context'$$

By induction over i, it is straightforward to prove that

 $T(Grammar) \land Discourse \rightarrow \exists (Context' \land Phrases')$ 

and that (Context, Phrases) is an instance of (Context', Phrases'). From this, (6) follows immediately.  $\Box$ 

#### Example 10

The restriction that each argument in the head of a grammar rule must a variable that do not occur elsewhere in that head is necessary as indicated by the following example. Let a/0, b/1, and c/1 be grammar symbols, f/1 a context predicate and let *Grammar* consist of

(i)  $\forall x (a \land f(x) \to b(x))$ , (ii)  $b(7) \to c(7)$ .

Then T(Grammar) consists of (ii) and

(i')  $\forall x (a \rightarrow f(x) \land b(x)).$ 

Given  $Discourse = \{a\}$  and  $Context = \{f(7)\}$  we have that  $Phrases = \{a, b(7), c(7)\}$  satisfies the faithfulness condition 3. However, a proof using T(Grammar) will only give  $Phrases' = \{a, \exists x \ b(x)\}$ , and it not sound to set this x = 7 so that rule (ii) can be applied. If the head of (ii) had an unrestricted variable instead of a constant, it would be possible to relate it to the existentially quantified  $\exists x \ b(x)$ .

Proof of Theorem 2 Similar to the proof of Theorem 1.  $\Box$ 

#### 5.2 First version of abduction in CHRG: locally unambiguous grammars

The general model developed in Section 5.1 fits perfectly with locally unambiguous CHRGs. For simplicity, we formulate the approach for propagation rule grammars without left and right context parts, but it is obvious that it works also in the general case; especially interesting are CHRGs of simplification rules only that are guaranteed to be locally unambiguous. (Section 5.3 describes a generalization to ambiguous grammars.)

Let us define an *abductive CHRG* as a grammar with range-restricted rules of the form

```
constituents, {context-facts} :: > nonterminal
```

in which (cf. Section 5.1) each argument in *constituents* and *context-facts* is a unique variable. The grammar may be extended with a set of integrity constraints expressed as CHR propagation rules.

Combining Theorems 1 and 2 with the completeness and soundness properties for parsing derivations, shows that a locally unambiguous, abductive grammar, written in the format

```
constituents : :> {context-facts},nonterminal
```

produces competent interpretations of the given input string. The implemented CHRG system does not include this translation but assumes the user to write

abductive grammars directly in the "translated form" which is anyhow the intuitively simplest for someone with experience in CHR programming.<sup>6</sup>

Example 11 We consider language interpretation of discourses such as the following: Garfield eats Mickey, Tom eats Jerry, Jerry is mouse,

Tom is cat, Mickey is mouse.

(9)

What we intend to learn from (9) are the categories to which the mentioned proper names belong and which categories that are food items for others. An interesting question is to which category Garfield belongs as this is not mentioned explicitly. We define the following vocabulary; the abducibles declaration is synonymous with CHR's constraints except that it also introduces predicates for negated abducibles with integrity constraints that implement explicit negation.<sup>7</sup>

```
abducibles food_for/2, categ_of/2.
grammar_symbols name/1, verb/1, sentence/1, category/1.
```

The background theory is the following consisting of integrity constraints only.

```
categ_of(N,C1), categ_of(N,C2) ==> C1=C2.
food_for(C1,C), food_for(C2,C) ==> C1=C2.
```

That is, the category for a name is unique, and for the sake of this example it is assumed that a given category is the food item for at most one other category. The following part of the grammar classifies the different tokens:

```
[tom] ::> name(tom).
...
[is] ::> verb(is).
...
verb(is) -\ [X] <:> category(X).
```

The last rule applies a syntactic left context part to classify any symbol to the right of an occurrence of "is" as a category.

A sentence such as "Tom is cat" is only faithful to a context if categ\_of(tom, cat) holds in it. So the grammar in the original specification of the current language interpretation problem may contain the following rule:

```
name(i_1, i_2, N) \land verb(i_2, i_3, i_s) \land category(i_3, i_4, C) \land categ-of(N,C) 
\rightarrow sentence(i_s(N,C)) (10)
```

By moving the context condition from the premises to the conclusion we achieve a rule that can contribute to solve the problem deductively. In CHRG it becomes the following:

<sup>&</sup>lt;sup>6</sup> The user may, so to speak, use abduction for text interpretation in this deductive fashion without being aware that he or she is using a "nonstandard" reasoning technique; abduction works so to speak for free in CHRG.

<sup>&</sup>lt;sup>7</sup> The declaration of an abducible a/1 introduces also constraint a\_/1 (representing "not a") and integrity constraint a(X), a\_(X) ==> fail.

```
name(N), verb(is), category(C) ::>
{categ_of(N,C)},
sentence(is(N,C)).
```

A sentence such as "Tom eats Jerry" is only faithful to a context if the proper categ\_of and food\_for facts hold in it. A CHRG rule with this in its conclusion looks as follows:

```
name(N1), verb(eats), name(N2) ::>
    {categ_of(N1,C1), categ_of(N2,C2), food_for(C1,C2)},
    sentence(eats(N1,N2)).
```

Let us now trace the processing of the discourse (9) when entered into the constraint store; we record only the context facts. "Garfield eats Mickey" gives rise to

```
categ_of(garfield,X1), categ_of(mickey,X2), food_for(X1,X2).
```

The "X"s are uninstantiated variables. The next "Tom eats Jerry" gives

```
categ_of(tom,X3), categ_of(jerry,X4), food_for(X3,X4).
```

"Jerry is mouse" gives  $categ_of(jerry,mouse)$ , and the background theory immediately unifies X4 with mouse. In a similar way "Tom is cat" gives rise to a unification of X3 with cat and food\_for(X3,X4) has become

food\_for(cat,mouse).

Finally, "Mickey is mouse" produces  $categ_of(mickey,mouse)$  that triggers the first integrity constraint unifying X2 with mouse and thus the second integrity constraint sets X1=cat and there is no other possibility. So as part of the solution to this language interpretation problem, we have found that Garfield is a cat.

In addition to what we have shown, the user may also define background theories involving Prolog rules that include calls to abducibles. The only restriction is that a call to an abducible must not be embedded in an application of Prolog's negation by failure.

Interestingly, this form of abduction works also together with a definite clause grammar: Declare your abducibles as CHRG abducibles (or CHR constraints), add integrity constraints and apply them in the body of your DCG rules.

Example 12

The following DCG together with the declarations of abducibles and integrity constraints written as CHR rules will produce the same abducibles as the CHRG described above.

```
name(tom) --> [tom].
% etc.
category(mouse) --> [mouse].
% etc.
sentence(is(N,C)) -->
name(N), [is], category(C),
```

```
{categ_of(N,C)}.
sentence(eats(N1,N2)) -->
name(N1), [eats], name(N2),
{categ_of(N1,C1), categ_of(N2,C2), food_for(C1,C2)}.
```

The DCG+CHR approach to abductive language interpretation works also correctly for ambiguous grammars as backtracking keeps separated the different possible parses with their abducibles.

#### Compacting abductive answers

The final state may include abducible atoms with variables with the meaning that any ground assignment to such variables (not conflicting with integrity constraints) represents a solution to the abductive problem. Consider as an example the following set of abducible atoms returned as part of the answer  $\{abd(X), abd(Y)\}$ . It may subsume solutions with X=Y as well as X≠Y, e.g.  $\{abd(a)\}, \{abd(b), abd(c)\}$ ; both may be minimal but the application may impose reasons to prefer the one with fewest elements.

It is possible to extend our method so that it dynamically tries to compact solutions by equating new abducibles to existing ones as a first choice, and then generate the other possibilities under backtracking. In fact, such a step is included in many abduction algorithms (e.g. Kakas *et al.* 2000). To provide this, we may add for each abducible predicate, an integrity constraint here shown for a predicate abd of arity one:

$$abd(X)$$
,  $abd(Y) ==> (X=Y ; dif(X,Y))$  (11)

The semicolon is Prolog's disjunction realized by means of backtracking and dif/2 is a lazy test for syntactic nonidentity that behaves the way we specified for built-in " $\neq$ " constraints in Section 3.1. Whenever a new abducible fact, say h(a) or h(X), is created by the application of some rule, (11) is applied provided there is another fact p(t) in the constraint store. Notice that (11) is logically redundant and only affects the execution.

An optimization of (11) using facilities of the implemented version of CHR (see SWICS (Swedish Institute of Computer Science 2003) for details) is in place:

The pragma prevents the rule from being activated twice due to the symmetry in its head and the purpose of the guard is to suppress useless applications.

The implemented CHRG system (Christiansen 2002b) includes this compaction principle as an option. However, in many cases the problem does not exist as user-defined integrity constraints may instantiate and equate abducibles sufficiently during the computation; this is the case in the example with Garfield and friends above.

#### 5.3 Evaluation of all abductive answers in parallel

The implemented CHRG system incorporates a technique for keeping track of the different unambiguous sets of grammar symbols that are created with a locally ambiguous grammar.

Each syntax tree and the abducibles associated with it are identified by an index, actually a Prolog variable, hence referred to in the following as an *index variable*. Grammar symbols (apart from token/1) and abducibles are given an extra argument to hold the index.

Whenever a rule applies to syntax nodes with indices  $x_1, \ldots, x_n$ , a new index x is created for the new node. Fresh copies are made of any abducible with an index among  $x_1, \ldots, x_n$ , but now with x as index. These constraints are called together with any new abducibles from the body of the rule (also indexed by x). This activates possible integrity constraints (translated in a suitable way to cope with indexes; see below). This may result in a failure and to avoid the whole computation to stop (as does a failure in a committed choice language such as CHR), a suitable control structure is embedded in the body of the rule. If such a failure occurs, the rule simply succeeds but avoids the creation of a new syntax node (and cleanses the constraint store for the newly constructed constraints); this effectively stops this branch of computation but allows other successful syntax trees to continue growing.

The compilation of integrity constraints ensures that they only apply to abducibles with identical indices. The compilation of the sample father(F1,C)  $\$  father(F2,C) <=> F1=F2 shows the principle:

 $father(X,F1,C) \setminus father(X,F2,C) \iff F1=F2$ (13)

The final state in a derivation contains the collection of all constraints relating to the different parses; each parse, i.e. each competent interpretation can be printed out separately.

This implementation principle involves a quite heavy overhead due to the continual copying of constraints and repeated execution of integrity constraints that have been executed already. It is available as an option in the CHRG system.

Obviously this is not an ultimate method for evaluation of all different abductive interpretations in parallel, but it may give inspiration for more efficient methods; we discuss this topic in the final section.

#### 6 Assumption grammars in CHRG

As our implementation of abduction has shown, CHRG can work with different sort of hypotheses passed through the constraint store. Assumption Grammars (Dahl *et al.* 1997) (AGs) are similar to abductive grammars in many respect but differ in that hypotheses are explicitly produced and explicitly used, possible being consumed. Assumption grammars provide a collection of operators that makes it possible to control the scope of these hypotheses which is not possible with an abductive approach.

We describe here an extension of CHRGs with a version of AG which is included in the available implementation of the system (Christiansen 2002b). For simplicity, we describe it in a version that is only correct for locally unambiguous grammars but it is easily extended to ambiguous grammars with the technique described for abductive grammars in Section 5.3.

In an AG, the expression +h(a) means to assert a linear hypothesis which can be used once in the subsequent text by means of the expression -h(a) (or -h(X), binding X to a) called an *expectation*. Asserting the hypothesis by \*h(a) means that it can be used over and over again. We deviate slightly from the syntax of (Dahl *et al.* 1997) as to achieve a more symmetric notation and introduce three operators for so-called time-less hypotheses, =+, =-, and =\*, whose meaning are similar except that hypothesis can be used and consumed in any order. Compared with the initial proposal for AG, our version extends also with other features of CHRG, most notably integrity constraints and context parts.

These operators are defined as constraints in CHR and can be called from the body of grammar rules. We introduce the principle by a simplified and incorrect version of the time-less versions given by the following CHR rules:

By the first rule, a pair of assumption =+h(a) and expectation =-h(X) are removed from the constraint store producing the effect of binding X to a. If assumption =\*h(a)were used instead, the second rule can apply to several instances of  $=-h(\cdots)$ . The problems with this implementation are:

- The computation fails in case one of the rules is applied for incompatible hypotheses, e.g. =+h(a) and =-g(X).
- If two different hypotheses can apply for the same expectation =-h(X) things go wrong: Rule one will only apply one of them and forget all about the other one, and rule two applies both of them leading obviously to failure.

To repair this, we introduce backtracking and give back hypotheses to the store when a choice of an expectation-hypothesis pair is given up; the latter is necessary as CHR uses committed choice. In order to avoid loops, some book-keeping is added so that a choice already tested is not tried again. For =+ the following is sufficient; the rule for =\* is quite similar.

The predicate has\_tried\_rule1 uses CHR facilities to check whether the indicated instance of the auxiliary constraint tried\_rule1 is present in the store. The test for unifiability in the guard is an obvious optimization which in principle could have been left out. The operators denoted by prefix +, -, and \* are implemented in a quite similar way, with the CHRG compiler adding an extra argument corresponding to positions in the input string; a test that assumption is created textually before expectation is easily added to the guard.

## Example 13 (Adapted from Dahl et al. 1997)

We consider sentences with pronouns and coordination such as "Martha likes and Mary likes Paul, she hates her". We add gender to names and pronouns, and whenever a name appears as subject or object (in this grammar grouped as nps), an assumption is made that the given name is acting. A pronoun as subject or object gives rise to an expectation for someone acting of appropriate gender. The principles is shown by the following excerpt:

```
[mary] <:> name(mary, fem).
[she] <:> pronoun(fem).
name(X,Gender) <:> *acting(X,Gender), np(X,Gender).
pronoun(Gender) <:> -acting(X,Gender), np(X,Gender).
```

To handle the coordination problem, an incomplete sentence followed by and raises a time-less expectation for a subject which is met by the assumption produced by the full sentence at the end:

```
np(A,_), verb(V) /- [and] <:> =-ref_object(B), sentence(s(A,V,B)).
np(A,_), verb(V), np(B,_) <:> =*ref_object(B), sentence(s(A,V,B)).
```

One of the possible final states produced for the sample text above contains sentence symbols with the following attributes:

```
s(martha,like,paul),s(mary,like,paul), ands(mary,hate,martha).
```

The AG operators are included in the available CHRG package (Christiansen 2002b) together with other facilities of AGs described in Dahl *et al.* (1997).

As mentioned, the CHRG version of AG goes beyond the original proposal by adding integrity constraints. To see the use of this, consider again Example 13. Another final state for the given sentence gives s(mary,hate,mary). We can exclude this by an integrity constraint to prevent that people hate themselves:

```
sentence(s(A,hate,A)) ::> fail.
```

In general we can have such rules produce new hypotheses, e.g. =\*depressed(A) instead of failing in the rule above, and combinations of hypotheses can give rise other hypotheses.

## 7 Summary and future perspectives

CHR Grammars founded on current constraint logic technology have been introduced, and their application to aspects of natural language syntax has been illustrated by small examples. CHRG can bee seen as a technologically updated ancestor of Definite Clause Grammars: A relative transparent layer of syntactic sugar over a declarative programming language, providing both conceivable semantics and fairly efficient implementation. In CHRG we have replaced Prolog by Constraint Handling Rules. The result of this shift is a very powerful formalism in which several linguistic aspects, usually considered to be complicated or difficult, are included more or less for free:

- Ambiguity and grammatical errors are handled in a straightforward way as all different (partial) parses are evaluated in parallel.
- Context-sensitive rules, which are an inherent part of the paradigm, handle examples of coordination in an immediate way.
- Abduction, which is useful for identifying indirectly implied information, is expressed directly with no additional computational devices being involved.

Context-sensitive rules combined with the ability to handle left-recursion (as opposed to DCG) are a great help for producing grammars with relatively few, concise rules without artificial nonterminals; a drawback is the lack of empty production.

No real-world applications have been developed in CHRG yet, but we have good expectation for scalability as selected grammars can run in linear time. Furthermore, the full flexibility of the underlying CHR and Prolog machinery is available for optimizations. Independently, CHRG is available as powerful modeling and prototyping tool.

The approach of using Constraint Handling Rules for language possesses a potentiality for getting closer to a full integration of lexical, semantic, and pragmatic analysis. A lexical schism S, for example, in the beginning of a discourse may be delayed until a few sentences later when the semantic context is identified so that S can be resolved and, thus, that analysis can resume for the first sentence.

Although being a very powerful system in itself, CHRG and the examples we have tested appear only to touch upon the surface of what is possible. It is obvious that weights can be added and used to suppress all but the most likely interpretation, and arbitrary constraint solvers can be incorporated in this process. Although presented here as a strict bottom-up paradigm, it is possible to add top-down guidance to parsing in CHR and CHRG which is useful in order to prevent local ambiguity to result in the creation of a lot of useless constraints; top-down guidance is applied in the work of Christiansen and Dahl (2002; 2003) but for other purposes.

The basic principle may seem quite naïve, almost too naïve, just applying grammar rules bottom-up over and over until the process stops. However, we can rely now on the underlying, well-established computational paradigm of CHR for such rules-based computations. Furthermore, the approach can profit from any future improvements of CHR and similar deductive systems.

As noticed above, our implementation in CHR for parallel evaluation of different abductive interpretations of a discourse is far from ideal, but it may serve as an important source of inspiration for the development of better systems. Instead of simulating several constraint stores by means of extra index arguments, it seems obvious to apply a sort of shared representation for the different stores so that copying of constraints is avoided.

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