## Generalized Generalization Generalizers

#### Extended Abstract

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### 1 Introduction

Schema-guided program construction was studied in logic programming, especially for Prolog programs [4, 5, 10, 14]. Using schemas for logic program transformation was first studied in [9] and extended in [15]. Schema-guided program transformation was also studied in [7, 11]. If the transformation schema embodies some generalization technique, then it is called *generalization schema* (or: generalization generalizer, as in the title of this paper). This paper results from the research that began by investigating the suggestions in [7]. The contributions of this research are:

- pre-compilation of more generalized generalization schemas (tupling and descending), since the schemas in [7] were restricted to special families of divide-and-conquer programs;
- pre-compilation of new generalization schemas that we call simultaneous-tupling-and-descending generalization schemas;
- validation of the generalization schemas, based on the notions of correctness of a program, stead-fastness of a program in a set of specifications, and equivalence of two programs;
- performance tests for evaluation of the generalization schemas.

Throughout the paper, the word program (resp. procedure) is used to mean typed definite program (resp. procedure). The definitions for correctness of a program, steadfastness of a program in a set of specifications, and equivalence of two programs, which is used in proving the transformation schemas, are given in Appendix A. The *specification* of a predicate R is written in the format:

$$\forall X : \mathcal{T}_X, \forall Y : \mathcal{T}_Y. \ \mathcal{I}_R(X) \Rightarrow [R(X,Y) \Leftrightarrow \mathcal{O}_R(X,Y)]$$

where  $\mathcal{I}_R(X)$  denotes the *input condition* that must be fulfilled before the execution of the procedure, and  $\mathcal{O}_R(X,Y)$  denotes the *output condition* that will be fulfilled after the execution.

#### 1.1 Program Schemas

The notion of program schema was also used in [4, 5, 9, 10, 11, 15], but here we have an additional component, which makes our definition [6, 7, 8] of program schemas different from their definitions.

**Definition 1** A program schema contains a template program with a fixed data flow, but without specific indications about the actual computations, except that they must satisfy certain (steadfastness) constraints, which are the second component of a schema.

A program schema thus abstracts a whole family of particular programs that can be obtained by instantiating the place-holders of its template to particular computations, using the specification and the program synthesized so far, so that the constraints of the schema are satisfied [6].

To illustrate our purpose, the example below is used as the initial problem throughout the paper.

**Example 1** Let flat(B, F) hold iff list F is the infix representation of binary tree B, where infix representation means the list representation of the infix traversal of the tree. The constant void is used to represent the empty binary tree, and the compound term bt(L, E, R) is used to represent a binary tree of root E, left subtree L, and right subtree R.

For the problem above, two different programs and the two program schemas that these programs belong to are explained in the remainder of this section. These program schemas abstract sub-families of divide-and-conquer programs. The divide-and-conquer (DC) program schemas explained in this section

are restricted, for pedagogical reasons only, to binary predicates with X as the induction parameter and Y as the result parameter. Another restriction in the schemas is that when X is non-minimal, then X is decomposed into one head HX and two tails  $TX_1$  and  $TX_2$ , so that Y is composed from one head HY (which is the result of processing HX) and two tails  $TY_1$  and  $TY_2$  (which are the results of recursively calling the predicate R with  $TX_1$  and  $TX_2$ , respectively) by infix composition (i.e. Y is composed by putting HY between  $TY_1$  and  $TY_2$ ). For the sake of better understandability, the program template and the program that is an instantiation of that template are given side by side in the figures.

```
flat(B, F) \leftarrow
R(X,Y) \leftarrow
         Minimal(X),
                                                                            B = void,
                                                                            F = []
        Solve(X,Y)
R(X,Y) \leftarrow
                                                                    flat(B, F) \leftarrow
                                                                            B = bt(\underline{\ },\underline{\ },\underline{\ }),
         NonMinimal(X),
                                                                            B = bt(L, E, R).
         Decompose(X, HX, TX_1, TX_2),
         R(TX_1, TY_1), R(TX_2, TY_2),
                                                                            flat(L, FL), flat(R, FR),
        I_0 = e, Compose(I_0, TY_1, I_1),
                                                                            I_0 = [], append(I_0, FL, I_1),
        Process(HX, HY), Compose(I_1, HY, I_2),
                                                                            HF = [E], append(I_1, HF, I_2),
        Compose(I_2, TY_2, I_3), Y = I_3
                                                                            append(I_2, FR, I_3), F = I_3
```

Figure 1: Template DCLR and Program 1

```
flat(B, F) \leftarrow
R(X,Y) \leftarrow
        Minimal(X),
                                                                      B = void,
                                                                      F = []
        Solve(X,Y)
R(X,Y) \leftarrow
                                                               flat(B, F) \leftarrow
                                                                      B = bt(\_, \_, \_),
        NonMinimal(X),
        Decompose(X, HX, TX_1, TX_2),
                                                                      B = bt(L, E, R),
        R(TX_1, TY_1), R(TX_2, TY_2),
                                                                       flat(L, FL), flat(R, FR),
        I_3 = e, Compose(TY_2, I_3, I_2),
                                                                      I_3 = [], append(FR, I_3, I_2),
                                                                      HF = [E], append(HF, I_2, I_1),
        Process(HX, HY), Compose(HY, I_2, I_1),
        Compose(TY_1, I_1, I_0), Y = I_0
                                                                      append(FL, I_1, I_0), F = I_0
```

Figure 2: Template DCRL and Program 2

The constraints on these schemas (i.e. their semantics) are shown in a companion paper [8]. If we denote the functional version of the *Compose* predicate with  $\oplus$ , then the composition of Y in template DCLR by left-to-right (LR) composition ordering can be written as  $Y = ((e \oplus TY_1) \oplus HY) \oplus TY_2$ . The composition of Y in DCRL by right-to-left (RL) composition ordering can be written as  $Y = TY_1 \oplus (HY \oplus (TY_2 \oplus e))$ .

Since append, which is Compose in our flat example, is associative and has [] as the identity element, Programs 1 and 2 are equivalent. This shows that the problem families that the two program schemas abstract have an intersection family (resulting in equivalent programs for the problem), if Compose satisfies the constraints above.

More generalized schemas for any number of heads and tails, and any composition place of the head in the result parameter (infix composition above is only one possibility) are listed elsewhere [3].

#### 1.2 Schema-Guided Program Transformation

In schema-guided transformation, transformation techniques are pre-compiled at the schema-level.

**Definition 2** A transformation schema encoding a transformation technique is a triple  $\langle S_1, S_2, C \rangle$ , where  $S_1$  and  $S_2$  are program schemas and C is a set of (applicability) conditions. Schema  $S_2$  is expressed using all the predicates of  $S_1$ , and the steadfastness constraints on  $S_2$  are thus a superset of those of  $S_1$ .

Thus, a schema-guided program transformation system will have a collection of transformation schemas and the transformation of a program  $P_1$  to a program  $P_2$  reduces to: first selecting a transformation schema  $\langle S_1, S_2, C \rangle$ , such that  $P_1$  is an instance of  $S_1$  under some form of higher-order substitution  $\sigma$ , then the conditions  $C\sigma$  must be verified, and finally  $P_2$  is computed by applying  $\sigma$  to the schema  $S_2$ . If  $P_1$  is synthesized in a schema-guided fashion (i.e. if  $\sigma$  is known), then transformation can be automated.

Generalization is used to transform a possibly inefficient program into a more efficient one, because the generalization process may provoke a complexity reduction by loop merging and because the output program may be (semi-)tail-recursive (which can be further transformed into an iterative program by an optimizing interpreter). The problem generalization techniques that are used in this paper are explained in detail in [4], but using these techniques for synthesizing and/or transforming a program in a schemaguided fashion was first proposed in [4, 5], and then extended in [7].

Given a program, the generalization process works as follows: first the specification of the initial program is generalized, then a recursive program for the generalized specification is synthesized, and finally a non-recursive program for the initial problem can be written, since the initial problem is a particular case of the generalized one. The two generalization approaches used here are:

- 1. Structural generalization: The intended relation is generalized by generalizing the structure (or: type) of a parameter. If a problem dealing with a term is generalized to a problem dealing with a list of terms, then this generalization is called tupling generalization.
- 2. Computational generalization: The intended relation is generalized so as to express the general state of a computation in terms of what has been done and what remains to be done. Ascending and descending generalizations are two particular cases of computational generalization, where in ascending generalization, information about what has already been done is also needed, but in descending generalization the information about what remains to be done is enough.

If schema  $S_2$  is obtained by any method of generalization described above, the transformation schema is called a *generalization schema*.

In the remainder of this paper, we explain in detail how automation of program transformation is achieved by tupling, descending, and simultaneous-tupling-and-descending generalization, with the help of the *flat* example, in Sections 2, 3, and 4, respectively. In Section 5, we discuss, by using the results of performance tests, how a prototype transformation system choose one of the transformation schemas, if the applicability conditions of more than one transformation schema are satisfied by the input program. Finally, in Section 6, we conclude.

## 2 Program Transformation by Tupling Generalization

Let us generalize the initial specification of our example by using tupling generalization:

 $flat_{-}t(Bs, F)$  iff F is the concatenation of the infix representations of the elements in binary tree list Bs.

The specification above can be constructed by instantiating the following specification  $S_{R\_tupling}$ :

$$\forall Xs: list\ of\ \mathcal{T}_X, \forall Y: \mathcal{T}_Y.\ (\forall X: \mathcal{T}_X.\ X \in Xs \Rightarrow \mathcal{I}_R(X)) \Rightarrow [R.tupling(Xs,Y) \Leftrightarrow (Xs = [] \land Y = e) \\ \lor (Xs = [X_1, X_2, \dots, X_n] \land \bigwedge_{i=1}^n \mathcal{O}_R(X_i, Y_i) \land I_1 = Y_1 \land \bigwedge_{i=2}^n \mathcal{O}_C(I_{i-1}, Y_i, I_i) \land Y = I_n)]$$

where  $\mathcal{O}_C$  is the output condition of *Compose*, and  $\mathcal{O}_R$  is the output condition of R, and  $n \geq 1$ .

The tupling generalization schemas (one for each input divide-and-conquer program schema given in Section 1.1) (the proof of  $TG_1$  is given in Appendix B) are:

```
TG_1: \langle DCLR, TG, C_{t1} \rangle where C_{t1}: -Compose is associative
```

- Compose has e as the left and right identity element, where e appears in DCLR

 $-\forall X: \mathcal{I}_X. \ \mathcal{I}_R(X) \wedge Minimal(X) \Rightarrow \mathcal{O}_R(X,e)$ 

 $- \forall X : \mathcal{T}_X. \ \mathcal{I}_R(X) \Rightarrow [\neg Minimal(X) \Leftrightarrow NonMinimal(X)]$ 

```
TG_2: \langle DCRL, TG, C_{t2} \rangle where C_{t2}: - Compose is associative
```

- Compose has e as the left and right identity element, where e appears in DCRL

 $-\forall X: \mathcal{T}_X. \ \mathcal{I}_R(X) \wedge Minimal(X) \Rightarrow \mathcal{O}_R(X,e)$ 

 $- \forall X : \mathcal{T}_X. \ \mathcal{I}_R(X) \Rightarrow [\neg Minimal(X) \Leftrightarrow NonMinimal(X)]$ 

where the shared template TG and the corresponding program for flat are in Figure 3.

Note that the predicates in TG include all of those of DCLR (resp. DCRL), plus R\_tupling. The steadfastness constraints of TG are thus those of DCLR (resp. DCRL), plus  $S_{R\_tupling}$ . The tupling generalization schemas above give rise to full automation of the transformation process. However, this is not the end of an effective transformation, since the transformed program can be simplified by further detection of properties of Solve, Process, and Compose. If Solve(X,Y) converts X into a constant 'size' Y, and Process(HX, HY) converts HX into a constant 'size' HY, and partial evaluation

```
flat(B, F) \leftarrow
R(X,Y) \leftarrow
                                                                    flat_{-}t([B], F)
        R\_tupling([X], Y)
R_-tupling(Xs,Y) \leftarrow
                                                           flat_t(Bs, F) \leftarrow
       Xs = [], Y = e
                                                                    Bs = [], F = []
R_-tupling(Xs,Y) \leftarrow
                                                           flat_{-}t(Bs, F) \leftarrow
       Xs = [X|TXs]
                                                                    Bs = [B|TBs],
       Minimal(X),
                                                                    B = void,
       R 	ext{-tupling}(TXs, TY),
                                                                    flat_{-}t(TBs, TF),
       Solve(X, HY), Compose(HY, TY, Y)
                                                                    HF = [], append(HF, TF, F)
                                                           flat_{-}t(Bs, F) \leftarrow
R_-tupling(Xs,Y) \leftarrow
        Xs = [X|TXs],
                                                                    Bs = [B|TBs],
                                                                    B = bt(\_, \_, \_),
       NonMinimal(X),
        Decompose(X, HX, TX_1, TX_2),
                                                                    B = bt(L, E, R),
        Minimal(TX_1),
                                                                    L = void,
        R\_tupling([T_2|TXs],TY),
                                                                    flat_{-}t([R|TBs], TF),
       Solve(TX_1, TY_1),
                                                                    FL = [],
       I_0 = e, Compose(I_0, TY_1, I_1),
                                                                    I_0 = [], append(I_0, FL, I_1),
        Process(HX, HHY), Compose(I_1, HHY, I_2),
                                                                    HHF = [E], append(I_1, HHF, I_2),
       HY = I_2, Compose(HY, TY, Y)
                                                                    HF = I_2, append(HF, TF, F)
R_{-}tupling(Xs, Y) \leftarrow
                                                           flat_{\perp}t(Bs, F) \leftarrow
       Xs = [X|TXs]
                                                                    Bs = [B|TBs],
                                                                    B = bt(\_,\_,\_),
       NonMinimal(X).
        Decompose(X, HX, TX_1, TX_2),
                                                                    B = bt(L, E, R),
       NonMinimal(TX_1), Minimal(U),
                                                                    L \neq void, U = void,
                                                                    N = bt(U, E, R),
        Decompose(N, HX, U, TX_2),
        R\_tupling([TX_1, N|TXs], Y)
                                                                    flat_{-}t([L, N|TBs], F)
```

Figure 3: Template TG and Program 3

of Compose(HX, TY, Y) is possible when the 'size' of HX is constant, then Program 3 can be further simplified. The conjunction HF = [], append(HF, TF, F) in the second clause of  $flat\_t$  can be transformed into F = TF, which can be further unfolded into the head of that clause. The conjunction FL = [],  $I_0 = []$ ,  $I_0 = []$ ,

```
\begin{array}{ccc} flat(B,F) \leftarrow & flat\_t([B],F) \\ & flat\_t([],[]) \leftarrow \\ & flat\_t([void|TBs],F) \leftarrow & flat\_t(TBs,F) \\ flat\_t([bt(void,E,R)|TBs],[E|TF]) \leftarrow & flat\_t([R|TBs],TF) \\ & flat\_t([bt(L,E,R)|TBs],F) \leftarrow & L \neq void,flat\_t([L,bt(void,E,R)|TBs],F) \end{array}
```

# 3 Program Transformation by Descending Generalization

In [7], schema-guided program transformation by descending generalization is explained in detail and a specific generalization schema is given for an example. In this section, descending generalization schemas are given and we explain how we eliminate the eureka finding step by using the schemas only. Eureka finding [7] is actually finding the specification of the descendingly generalized problem. Descending generalization can also be called *accumulation strategy* (in functional programming [2], also used in logic programming [13]), since it introduces an accumulator parameter, which is progressively extended to the final result. This can also be seen as transformation towards difference-structure manipulation.

Since the conditions of each descending generalization schema are different, the process of choosing the appropriate generalization schema for the input divide-and-conquer program is done only by checking the conditions, then the eureka comes for free. Four descending generalization schemas (two for each divide-and-conquer program schema) are given. The first two descending generalization schemas are:

```
DG_1: \langle DCLR, DGLR, C_{d1} \rangle where
```

```
R(X,Y) \leftarrow
                                                            flat(B, F) \leftarrow
        R\_descending_1(X,Y,e)
                                                                        flat_d(B, F, [])
R_{-}descending_{1}(X,Y,A) \leftarrow
                                                            flat\_d_1(B, F, A) \leftarrow
                                                                        B = void,
        Minimal(X),
        Solve(X, S), Compose(A, S, Y)
                                                                        S = [], append(A, S, F)
                                                            flat\_d_1(B, F, A) \leftarrow
R_{-}descending_{1}(X,Y,A) \leftarrow
        NonMinimal(X),
                                                                        B = bt(\_,\_,\_),
        Decompose(X, HX, TX_1, TX_2),
                                                                        B = bt(L, E, R),
        Compose(A, e, A_0),
                                                                        append(A, [], A_0),
        R\_descending_1(TX_1, A_1, A_0),
                                                                        flat_{-}d_{1}(L, A_{1}, A_{0}),
        Process(HX, HY), Compose(A_1, HY, A_2),
                                                                        HF = [E], append(A_1, HF, A_2),
        R\_descending_1(TX_2, A_3, A_2), Y = A_3
                                                                        flat_{-}d_{1}(R, A_{3}, A_{2}), F = A_{3}
```

Figure 4: Template DGLR and Program 4

 $C_{d1}$ : - Compose is associative

- Compose has e as the left identity element, where e appears in DCLR

```
DG_4: \langle DCRL, DGLR, C_{d4} \rangle where C_{d4}: - Compose is associative
```

- Compose has e as the left identity element, where e appears in DCRL

They have the same formal specification (i.e. eureka) for the output program DGLR:

```
\forall X: \mathcal{T}_X, \forall Y, A: \mathcal{T}_Y. \ \mathcal{I}_R(X) \Rightarrow [R\_descending_1(X,Y,A) \Leftrightarrow \exists S: \mathcal{T}_Y. \ \mathcal{O}_R(X,S) \land \mathcal{O}_C(A,S,Y)]
```

where  $\mathcal{O}_C$  is the output condition of Compose, and  $\mathcal{O}_R$  is the output condition of R.

If we apply  $DG_1$  or  $DG_4$  to our flat example (since the conditions of both schemas are satisfied by Programs 1 and 2), then the descending generalization of the initial specification is:

 $flat\_d_1(B, F, A)$  iff list F is the concatenation of list A and the infix representation of binary tree B.

The transformed program and the template it belongs to (i.e. DGLR) are in Figure 4.

The other two descending generalization schemas (the proof of  $DG_2$  is given in Appendix C) are:

```
DG_2: \langle DCLR, DGRL, C_{d2} \rangle where C_{d2}: - Compose is associative
```

- Compose has e as the right identity element, where e appears in DCLR

```
DG_3: \langle DCRL, DGRL, C_{d3} \rangle where C_{d3}: - Compose is associative
```

- Compose has e as the right identity element, where e appears in DCRL

They have the same formal specification (i.e. eureka) for the output program DGRL:

```
\forall X: \mathcal{T}_X, \forall Y, A: \mathcal{T}_Y. \ \mathcal{I}_R(X) \Rightarrow [R\_descending_2(X,Y,A) \Leftrightarrow \exists S: \mathcal{T}_Y. \ \mathcal{O}_R(X,S) \land \mathcal{O}_C(S,A,Y)]
```

where  $\mathcal{O}_C$  is the output condition of *Compose*, and  $\mathcal{O}_R$  is the output condition of R.

If we apply  $DG_2$  or  $DG_3$  to our flat example (since the conditions of both schemas are satisfied by Programs 1 and 2), then the descending generalization of the initial specification is:

 $flat_{-}d_{2}(B, F, A)$  iff list F is the concatenation of the infix representation of binary tree B and list A.

The transformed program and the template it belongs to (i.e. DGRL) are in Figure 5.

The reason why we call the descendingly generalized program schemas 'DGLR' and 'DGRL' is similar to the reason why we call the divide-and-conquer program schemas DCLR and DCRL, respectively. In descending generalization, the composition ordering for extending the accumulator parameter in template DGLR is from left-to-right and the composition ordering for extending the accumulator parameter in template DGRL is from right-to-left.

Since append, which is Compose of Program 1, has [] as left and right identity element, both conditions of descending generalization schemas  $DG_1$  and  $DG_2$  are satisfied by Program 1. Similarly, both conditions of descending generalization schemas  $DG_3$  and  $DG_4$  are satisfied by Program 2. Syntactic simplifications may be done on Programs 4 and 5, but it can be observed that Program 5 is more efficient than Program 4,

```
R(X,Y) \leftarrow
                                                            flat(B, F) \leftarrow
        R\_descending_2(X,Y,e)
                                                                       flat_{-}d_2(B, F, [])
R_{-}descending_{2}(X,Y,A) \leftarrow
                                                            flat\_d_2(B, F, A) \leftarrow
        Minimal(X),
                                                                       B = void,
        Solve(X, S), Compose(S, A, Y)
                                                                       S = [], append(S, A, F)
R_{-}descending_{2}(X,Y,A) \leftarrow
                                                            flat_{-}d_2(B, F, A) \leftarrow
                                                                       B = bt(\_,\_,\_),
        NonMinimal(X),
        Decompose(X, HX, TX_1, TX_2),
                                                                       B = bt(L, E, R),
                                                                       A = A_3, flat_{-}d_2(R, A_2, A_3),
        A = A_3, R\_descending_2(TX_2, A_2, A_3),
                                                                       HF = [E], append(HF, A_2, A_1),
        Process(HX, HY), Compose(HY, A_2, A_1),
        R\_descending_2(TX_1, A_0, A_1),
                                                                       flat_{-}d_{2}(L, A_{0}, A_{1}),
        Compose(e, A_0, Y)
                                                                       append([], A_0, F)
```

Figure 5: Template DGRL and Program 5

since we can also eliminate append by partial evaluation during simplification. For example, Program 5 may be simplified into:

```
\begin{array}{ccc} flat(B,F) \leftarrow & flat\_d_2(B,F,[]) \\ flat\_d_2(void,A,A) \leftarrow & \\ flat\_d_2(bt(L,E,R),F,A) \leftarrow & flat\_d_2(R,NA,A), flat\_d_2(L,F,[E|NA]) \end{array}
```

Our next plan is to extend the descending generalization schemas by adding the "simplifiability" conditions to the schemas, since we want to achieve the objective that the system chooses in one step the transformation that yields the most efficient output program for input problems like *flat*, where the conditions of each schema for the same input program are satisfied.

# 4 Program Transformation by Simultaneous-Tupling-and-Descending Generalization

While working on constructing possible generalized generalization schemas for different input program schemas, we also tried to apply descending generalization to a tupling generalized problem, and vice versa. The generalization schemas that we explain in this section are the results of this work. We call them simultaneous-tupling-and-descending generalization schemas, although the reader may notice by looking at the specification of the generalized problem that the process may also be thought of as applying descending generalization to a tupling generalized problem.

Like we did in Section 3 for descending generalization, four simultaneous-tupling-and-descending generalization schemas are given. The first two are:

```
TDG_1: \langle \ DCLR, TDGLR, C_{tdlr} \ \rangle \ \text{where}
C_{tdlr}: -Compose \ \text{is associative}
-Compose \ \text{has } e \ \text{as the left and right identity element, where } e \ \text{appears in } DCLR
-\forall X: T_X. \ T_R(X) \wedge Minimal(X) \Rightarrow \mathcal{O}_R(X,e)
-\forall X: T_X. \ T_R(X) \Rightarrow [\neg Minimal(X) \Leftrightarrow NonMinimal(X)]
TDG_4: \langle \ DCRL, TDGLR, C_{tdrl} \ \rangle \ \text{where}
C_{tdrl}: -Compose \ \text{is associative}
-Compose \ \text{has } e \ \text{as the left and right identity element, where } e \ \text{appears in } DCRL
-\forall X: T_X. \ T_R(X) \wedge Minimal(X) \Rightarrow \mathcal{O}_R(X,e)
-\forall X: T_X. \ T_R(X) \Rightarrow [\neg Minimal(X) \Leftrightarrow NonMinimal(X)]
```

If we apply  $TDG_1$  or  $TDG_4$  to our flat example (since the conditions of both schemas are satisfied by Programs 1 and 2), then the simultaneous-tupling-and-descending generalization of the initial specification is:

 $flat\_td_1(Bs, F, A)$  iff list F is the concatenation of list A and the infix representations of the elements in binary tree list Bs.

The transformed program and the template it belongs to (i.e. TDGLR) are in Figure 6.

The other two simultaneous-tupling-and-descending generalization schemas are:  $TDG_2$ :  $\langle DCLR, TDGRL, C_{tdlr} \rangle$  and  $TDG_3$ :  $\langle DCRL, TDGRL, C_{tdrl} \rangle$ , where  $C_{tdlr}$  and  $C_{tdrl}$  are as above.

```
flat(B, F) \leftarrow
R(X,Y) \leftarrow
        R \perp td_1([X], Y, e)
                                                                    flat_{-}td_1([B], F, [])
R_-td_1(Xs,Y,A) \leftarrow
                                                          flat_-td_1(Bs, F, A) \leftarrow
        Xs = [], Y = A
                                                                    Bs = [], F = A
R_-td_1(Xs,Y,A) \leftarrow
                                                          flat_-td_1(Bs, F, A) \leftarrow
        Xs = [X|TXs],
                                                                    Bs = [B|TBs],
        Minimal(X), Solve(X, HY),
                                                                    B = void, HF = [],
        A = A_0, Compose(A_0, HY, A_1),
                                                                    A = A_0, append(A_0, HF, A_1),
        R \pm d_1(TXs, A_2, A_1), Y = A_2
                                                                    flat\_td_1(TBs, A_2, A_1), F = A_2
                                                          flat_-td_1(Bs, F, A) \leftarrow
R_-td_1(Xs,Y,A) \leftarrow
        Xs = [X|TXs],
                                                                    Bs = [B|TBs],
        NonMinimal(X),
                                                                    B = bt(-, -, -),
        Decompose(X, HX, TX_1, TX_2),
                                                                    B = bt(L, E, R).
        Minimal(TX_1), Solve(TX_1, TY_1),
                                                                    L = void, FL = [],
        A = A_0, Compose(A_0, TY_1, A_1),
                                                                    A = A_0, append(A_0, FL, A_1),
        Process(HX, HY), Compose(A_1, HY, A_2),
                                                                    HF = [E], append(A_1, HF, A_2),
        R td_1([TX_2|TX_S], A_3, A_2), Y = A_3
                                                                    flat_{-}td_{1}([R|TBs], A_{3}, A_{2}), F = A_{3}
R_-td_1(Xs,Y,A) \leftarrow
                                                         flat_-td_1(Bs, F, A) \leftarrow
        Xs = [X|TXs],
                                                                    Bs = [B|TBs],
                                                                    B = bt(\_, \_, \_),
        NonMinimal(X)
                                                                    B = bt(L, E, R),
        Decompose(X, HX, TX_1, TX_2),
                                                                    L \neq void, U = void,
        NonMinimal(TX_1), Minimal(U),
        Decompose(N, HX, U, TX_2),
                                                                    N = bt(U, E, R),
        R \pm d_1([TX_1, N|TXs], Y, A)
                                                                    flat\_td_1([L, N|TBs], F, A)
```

Figure 6: Template TDGLR and Program 6

If we apply  $TDG_2$  or  $TDG_3$  to our *flat* example (since the conditions of both schemas are satisfied by Programs 1 and 2), then the simultaneous-tupling-and-descending generalization of the initial specification is:

 $flat\_td_2(Bs, F, A)$  iff list F is the concatenation of the infix representations of the elements in binary tree list Bs and list A.

The transformed program and the template it belongs to (i.e TDGRL) are in Figure 7.

We call the two simultaneous-tupling-and-descending generalization program schemas 'TDGLR' and 'TDGRL' by using the same reasoning we made for calling the descending generalization program schemas DGLR and DGRL, respectively.

If we use properties of append, the generalized programs can be further simplified.

#### 5 Evaluation of Generalization Schemas

We now evaluate the generalization schemas using performance tests done on the input and output programs of each generalization schema. The programs are executed and tested using Mercury 0.6 on a SPARCstation 4. Since the programs are really short, the predicates were called 1,000 times to achieve meaningful timing results. In Table 1, the results of the performance tests for five selected problems are shown, where each column heading represents the schema to which the program written for the problem of that row belongs. The timing results are normalized wrt the DCLR column.

problems	DCLR	DCRL	TG	DGLR	DGRL	TDGLR	TDGRL
Prefix $flat$	1.00	0.88	0.50	3.38	0.25	3.38	0.50
Infix flat	1.00	0.76	0.65	3.06	0.18	3.35	0.59
Postfix flat	1.00	0.80	0.45	2.70	0.15	2.64	0.50
reverse	1.00	1.00	0.15	0.99	0.02	1.02	0.15
quicksort	1.00	0.93	1.03	2.33	0.76	2.60	1.07

 Table 1: Performance Tests Results

By looking at Table 1, we can say that the most time efficient programs for our example test problems are the ones that belong to the DGRL program schema. It is so because the examples we chose are such that

```
flat(B, F) \leftarrow
R(X,Y) \leftarrow
        R \perp td_2([X], Y, e)
                                                                    flat\_td_2([B], F, [])
R_-td_2(Xs,Y,A) \leftarrow
                                                         flat_-td_2(Bs, F, A) \leftarrow
        Xs = [], Y = A
                                                                    Bs = [], F = A
R_-td_2(Xs,Y,A) \leftarrow
                                                         flat_-td_2(Bs, F, A) \leftarrow
        Xs = [X|TXs],
                                                                    Bs = [B|TBs],
        Minimal(X), Solve(X, HY),
                                                                    B = void, HF = [],
        A = A_2, R t d_2(TXs, A_1, A_2),
                                                                    A = A_2, flat\_td_2(TBs, A_2, A_3),
                                                                    append(HF, A_1, A_0), F = A_0
       Compose(HY, A_1, A_0), Y = A_0
R_-td_2(Xs,Y,A) \leftarrow
                                                         flat_-td_2(Bs, F, A) \leftarrow
        Xs = [X|TXs],
                                                                    Bs = [B|TBs],
        NonMinimal(X),
                                                                    B = bt(\_, \_, \_),
        Decompose(X, HX, TX_1, TX_2),
                                                                    B = bt(L, E, R)
                                                                    L = void, FL = [],
        Minimal(TX_1), Solve(TX_1, TY_1),
        A = A_3, R \pm d_2([TX_2|TX_s], A_2, A_3),
                                                                    A = A_3, flat td_2([R|TBs], A_2, A_3),
        Process(HX, HY), Compose(HY, A_2, A_1),
                                                                    HF = [E], append(HF, A_2, A_1),
        Compose(TY_1, A_1, A_0), Y = A_0
                                                                    append(FL, A_1, A_0), F = A_0
R_-td_2(Xs,Y,A) \leftarrow
                                                         flat_-td_2(Bs, F, A) \leftarrow
        Xs = [X|TXs],
                                                                    Bs = [B|TBs],
        NonMinimal(X),
                                                                    B = bt(\_, \_, \_),
                                                                    B = bt(L, E, R),
        Decompose(X, HX, TX_1, TX_2),
        NonMinimal(TX_1), Minimal(U),
                                                                    L \neq void, U = void,
        Decompose(N, HX, U, TX_2),
                                                                    N = bt(U, E, R),
                                                                    flat\_td_2([L, N|TBs], F, A)
        R \perp td_2([TX_1, N|TXs], Y, A)
```

Figure 7: Template TDGRL and Program 7

the best transformation schemas (which also give rise to the best simplifications) are  $DG_2$  and  $DG_3$  for the DCLR and DCRL input programs, respectively, since Compose is append for all the programs. The reason above is also the reason why the DCRL programs are more efficient than the DCLR programs. For all programs with left-to-right composition ordering or accumulator extension, we lose efficiency, because the programs can't be further simplified and we can't eliminate append. In the descending and simultaneous-tupling-and-descending generalization schemas, this was difficult, since the percentage of the total running time of the program used by Compose is very high, because of the increase in the 'size' of the input parameter. Except for quicksort, for all the examples, the TG and TDGRL programs are more efficient than the initial DCLR and DCRL programs, which supports our claim that we can also gain efficiency by tupling and simultaneous-tupling-and-descending generalizations. The reason why we lose efficiency in tupling generalization of quicksort is that we increase the calls to Decompose, which is partition in quicksort and is a very costly operation, although we eliminate Compose. If we try to compare simultaneous-tupling-and-descending generalization schemas with the other generalization schemas, we may think that we do not gain anything. The reader has to remember that this generalization can also be thought of as applying a descending generalization to a tupling generalized problem, and for infix flat, we gain some efficiency over tupling generalization. The results also show that, except for quicksort, the TDGRL programs are more efficient than the input divide-and-conquer programs.

## 6 Conclusion and Future Work

Program generalization can be automated by using generic generalization schemas, since we fully automate the eureka discovery (i.e. finding the specification of the generalized problem). Further detection of properties of the operators in the input template helps us to simplify the program resulting from transformation, which can be done by constructing global plans for each generalization schema. Our next aim is to develop a prototype transformation system supporting this approach.

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## A Correctness and Equivalence Criteria

We will give the correctness and equivalence criteria that we use to prove our generalization schemas. The definitions for correctness of a program and steadfastness of a program in a set of specifications are similar to the definitions in [8, 12]. Our definitions are all model-theoretic.

We give again the format of the specification  $S_R$  of a predicate R:

$$\forall X : \mathcal{T}_X, \forall Y : \mathcal{T}_Y. \ \mathcal{I}_R(X) \Rightarrow [R(X,Y) \Leftrightarrow \mathcal{O}_R(X,Y)]$$

where  $\mathcal{I}_R(X)$  denotes the *input condition* that must be fulfilled before the execution of the procedure, and  $\mathcal{O}_R(X,Y)$  denotes the *output condition* that will be fulfilled after the execution.

An open program is a program where some of the predicates appearing in the clause bodies are not appearing in any heads of clauses, and these predicates are called *undefined* predicates. If all the predicates appearing in the program are *defined*, then the program is called a *closed program*. We do not consider mutually recursive programs.

#### Definition 3 (Correctness of a Closed Program)

Let P be a closed program for relation R. We say that P is (totally) correct wrt its specification  $S_R$  iff, for any ground term t of  $\mathcal{T}_X$  such that  $\mathcal{I}_R(t)$  holds, the following condition holds:  $P \models R(t, u)$  iff  $\mathcal{O}_R(t, u)$ , for every ground term u of  $\mathcal{T}_Y$ .

If we replace 'iff' by 'implies' in the condition above, then P is said to be partially correct wrt  $S_R$ , and if we replace 'iff' by 'if', then P is said to be complete wrt  $S_R$ .

This kind of correctness is not entirely satisfactory, for two reasons. First, it defines the correctness of P in terms of the procedures for the predicates in its clause bodies, rather than in terms of their specifications. Second, P must be a closed program, even though it might be desirable to discuss the correctness of P without having to fully implement it. So, the abstraction achieved through the introduction (and specification) of the predicates in its clause bodies is wasted. This leads us to the notion of steadfastness, which we only define here for the most interesting case, namely where all predicates occurring in the clause bodies are also known by their specifications.

# Definition 4 (Steadfastness of an Open Program in a Set of Specifications) Let:

- P be an open program for relation R
- $q_1, \ldots, q_m$  be all the undefined predicate names appearing in P
- $S_1, \ldots, S_m$  be the specifications of  $q_1, \ldots, q_m$ .

We say that P is steadfast wrt its specification  $S_R$  in  $\{S_1, \ldots, S_m\}$  iff, for any closed program  $P_S$  such that

- $P_S$  is correct wrt each specification  $S_j$   $(1 \le j \le m)$
- $P_S$  contains no occurrences of the predicates defined in P,

it is the case that  $P \cup P_S$  is correct wrt  $S_R$ .

Steadfastness has the following interesting property:

#### Property:

Let:

- $\bullet$  P be an open program for a relation R
- $p_1, \ldots, p_t$  be all the defined predicate names appearing in P (including R thus)
- $q_1, \ldots, q_m$  be all the undefined predicate names appearing in P
- $S_1, \ldots, S_m$  be the specifications of  $q_1, \ldots, q_m$ .

We have that, for  $t \geq 2$ , P is steadfast wrt  $S_R$  in  $\{S_1, \ldots, S_m\}$  if every  $P_i$   $(1 \leq i \leq t)$  is steadfast wrt the specification of  $p_i$  in the set of the specifications of all undefined predicates in  $P_i$ , where  $P_i$  is a program for  $p_i$ , such that  $P = \bigcup_{i=1}^t P_i$ .

For program equivalence, we do not require the two programs to have the same models, because this would not make much sense in a program generalization setting, where the transformed program features predicates that were not in the initially given program. That is why our program equivalence criterion establishes equivalence wrt the specification of a common predicate (usually the root of their call-hierarchies).

#### Definition 5 (Equivalence of Two Open Programs)

Let P and Q be two open programs for a predicate R. We say that P is equivalent to Q wrt the specification  $S_R$  iff the following two conditions hold:

- (a) P is steadfast wrt  $S_R$  in  $\{S_1, \ldots, S_m\}$ , where  $S_1, \ldots, S_m$  are the specifications of  $p_1, \ldots, p_m$ , which are all the undefined predicate names appearing in P
- (b) Q is steadfast wrt  $S_R$  in  $\{S'_1, \ldots, S'_t\}$ , where  $S'_1, \ldots, S'_t$  are the specifications of  $q_1, \ldots, q_t$ , which are all the undefined predicate names appearing in Q.

Since the 'is equivalent to' relation is symmetric, we also say that P and Q are equivalent wrt  $S_R$ .

## **B** Proof of $TG_1$

As a reminder, we give again the generalization schema  $TG_1$ .

```
TG_1: \langle DCLR, TG, C_{t_1} \rangle where C_{t_1}: (1) Compose is associative (2) Compose has e as the left and right identity element, where e appears in DCLR (3) \ \forall X: \mathcal{T}_X. \ \mathcal{I}_R(X) \wedge Minimal(X) \Rightarrow \mathcal{O}_R(X, e) (4) \ \forall X: \mathcal{T}_X. \ \mathcal{I}_R(X) \Rightarrow [\neg Minimal(X) \Leftrightarrow NonMinimal(X)]
```

and templates DCLR and TG are in Figure 8.

```
R(X,Y) \leftarrow
                                                   R(X,Y) \leftarrow
       Minimal(X),
                                                           R\_tupling([X], Y)
       Solve(X,Y)
                                                   R\_tupling(Xs, Y) \leftarrow
                                                           Xs = [], Y = e
R(X, Y) \leftarrow
                                                   R\_tupling(Xs, Y) \leftarrow
       NonMinimal(X),
       Decompose(X, HX, TX_1, TX_2),
                                                           Xs = [X|TXs],
       R(TX_1, TY_1), R(TX_2, TY_2),
                                                           Minimal(X),
       I_0 = e, Compose(I_0, TY_1, I_1),
                                                           R\_tupling(TXs, TY),
       Process(HX, HY), Compose(I_1, HY, I_2),
                                                           Solve(X, HY), Compose(HY, TY, Y)
       Compose(I_2, TY_2, I_3), Y = I_3
                                                   R\_tupling(Xs, Y) \leftarrow
                                                           Xs = [X|TXs]
                                                           NonMinimal(X),
                                                           Decompose(X, HX, TX_1, TX_2),
                                                           Minimal(TX_1),
                                                           R\_tupling([TX_2|TXs],TY),
                                                           Solve(TX_1, TY_1),
                                                           I_0 = e, Compose(I_0, TY_1, I_1),
                                                           Process(HX, HHY), Compose(I_1, HHY, I_2),
                                                           HY = I_2, Compose(HY, TY, Y)
                                                   R\_tupling(Xs, Y) \leftarrow
                                                           Xs = [X|TXs],
                                                           NonMinimal(X),
                                                           Decompose(X, HX, TX_1, TX_2),
                                                           NonMinimal(TX_1),
                                                           Minimal(U).
                                                           Decompose(N, HX, U, TX_2),
                                                           R\_tupling([TX_1, N|TXs], Y)
```

Figure 8: Templates DCLR and TG

The specification  $S_R$  of predicate R is:

$$\forall X: \mathcal{T}_X, \forall Y: \mathcal{T}_Y. \ \mathcal{I}_R(X) \Rightarrow [R(X,Y) \Leftrightarrow \mathcal{O}_R(X,Y)]$$

The specification  $S_{R\_tupling}$  of predicate  $R\_tupling$  is:

$$\forall Xs : list \ of \ \mathcal{T}_X, \forall Y : \mathcal{T}_Y. \ \ (\forall X : \mathcal{T}_X. \ X \in Xs \Rightarrow \mathcal{I}_R(X)) \Rightarrow [R \ tupling(Xs, Y) \Leftrightarrow (Xs = [] \land Y = e)$$

$$\lor (Xs = [X_1, \dots, X_q] \land \quad \bigwedge_{i=1}^q \mathcal{O}_R(X_i, Y_i) \quad \land I_1 = Y_1 \land \quad \bigwedge_{i=2}^q \mathcal{O}_C(I_{i-1}, Y_i, I_i) \quad \land Y = I_q)]$$

where  $\mathcal{O}_C$  is the output condition of Compose,  $\mathcal{O}_R$  is the output condition of R, and  $q \geq 1$ .

To prove the generalization schema  $TG_1$ , we have to prove that templates DCLR and TG are equivalent wrt  $S_R$ . By Definition 5, this holds iff the following two conditions hold:

- (a) DCLR is steadfast wrt  $S_R$  in  $S = \{S_{Minimal}, S_{NonMinimal}, S_{Solve}, S_{Decompose}, S_{Compose}\}$ , where  $S_{Minimal}, S_{NonMinimal}, S_{Solve}, S_{Decompose}, S_{Compose}$  are the specifications of Minimal, NonMinimal, Solve, Decompose, which are all the undefined predicate names appearing in DCLR.
- (b) TG is also steadfast wrt  $S_R$  in S.

Note that the sets  $\{S_1, \ldots, S_m\}$  and  $\{S'_1, \ldots, S'_t\}$  in Definition 5 are equal when Q is obtained by generalization of P.

In program transformation, we assume that the input program, here template DCLR, is steadfast wrt  $S_R$  in  $\mathcal{S}$ , so condition (a) always holds.

To prove equivalence, we have to prove condition (b). We will use the property of steadfastness: TG is steadfast wrt  $S_R$  in S if  $P_{R\_tupling}$  is steadfast wrt  $S_{R\_tupling}$  in S, where  $P_{R\_tupling}$  is the procedure for  $R\_tupling$ , and  $P_R$  is steadfast wrt  $S_R$  in  $\{S_{R\_tupling}\}$ , where  $P_R$  is the procedure for R.

To prove that  $P_{R\_tupling}$  is steadfast wrt  $S_{R\_tupling}$  in  $\mathcal{S}$ , we do a constructive forward proof that we begin with  $S_{R\_tupling}$  and from which we try to obtain  $P_{R\_tupling}$ .

If we separate the cases of  $q \ge 1$  by  $q = 1 \lor q \ge 2$ , then  $S_{R\_tupling}$  becomes:

```
 \forall Xs: list \ of \ \mathcal{T}_X, \forall Y: \mathcal{T}_Y. \ \ (\forall X: \mathcal{T}_X. \ X \in Xs \Rightarrow \mathcal{I}_R(X)) \Rightarrow [R.tupling(Xs,Y) \Leftrightarrow \\ (Xs = [] \land Y = e) \\ \lor (Xs = [X_1] \land \mathcal{O}_R(X_1,Y_1) \land Y_1 = I_1 \land Y = I_1) \\ \lor (Xs = [X_1,X_2,\ldots,X_q] \land \ \ \bigwedge_{i=1}^q \mathcal{O}_R(X_i,Y_i) \ \ \land \ I_1 = Y_1 \land \ \ \bigwedge_{i=2}^q \mathcal{O}_C(I_{i-1},Y_i,I_i) \ \ \land Y = I_q)]
```

where  $q \geq 2$ .

By using applicability conditions (1) and (2):

```
 \forall Xs: list \ of \ T_X, \forall Y: T_Y. \ \ (\forall X: T_X. \ X \in Xs \Rightarrow \mathcal{I}_R(X)) \Rightarrow [R.tupling(Xs,Y) \Leftrightarrow (Xs = [] \land Y = e)   \lor (Xs = [X_1 | TXs] \land TXs = [] \land \mathcal{O}_R(X_1,Y_1) \land Y_1 = I_1 \land TY = e \land \mathcal{O}_C(I_1,TY,Y))   \lor (Xs = [X_1 | TXs] \land TXs = [X_2, \dots, X_q] \land \ \ \bigwedge_{i=1}^q \mathcal{O}_R(X_i,Y_i) \ \ \land Y_1 = I_1 \land Y_2 = I_2 \land \ \bigwedge_{i=3}^q \mathcal{O}_C(I_{i-1},Y_i,I_i) \ \ \land TY = I_q \land \mathcal{O}_C(I_1,TY,Y)) ]
```

where q > 2.

By folding using  $S_{R\_tupling}$ , and renaming:

$$\forall Xs : list \ of \ T_X, \forall Y : T_Y. \ (\forall X : T_X. \ X \in Xs \Rightarrow \mathcal{I}_R(X)) \Rightarrow [R \ tupling(Xs, Y) \Leftrightarrow (Xs = [] \land Y = e) \\ \lor (Xs = [X|TXs] \land \mathcal{O}_R(X, HY) \land R \ tupling(TXs, TY) \land \mathcal{O}_C(HY, TY, Y))]$$

By taking the 'decompletion':

```
clause 1: R 	ext{-}	ext{supling}(Xs,Y) \leftarrow Xs = [], Y = e
clause 2: R 	ext{-}	ext{supling}(Xs,Y) \leftarrow Xs = [X|TXs], R(X,HY),
R 	ext{-}	ext{tupling}(TXs,TY), Compose(HY,TY,Y)
```

By unfolding clause 2 wrt R(X, HY) using DCLR, and using the assumption that DCLR is steadfast wrt  $S_R$  in  $\mathcal{S}$ :

```
clause 3: Rtupling(Xs, Y) \leftarrow
                 Xs = [X|TXs],
                 Minimal(X),
                 R\_tupling(TXs, TY),
                 Solve(X, HY), Compose(HY, TY, Y)
 clause 4: R 	ext{ tupling}(Xs, Y) \leftarrow
                 Xs = [X|TXs],
                 NonMinimal(X), Decompose(X, HX, TX_1, TX_2),
                 R(TX_1, TY_1), R(TX_2, TY_2),
                 I_0 = e, Compose(I_0, TY_1, I_1),
                 Process(HX, HHY), Compose(I_1, HHY, I_2),
                 Compose(I_2, TY_2, I_3), HY = I_3,
                 R\_tupling(TXs, TY), Compose(HY, TY, Y)
By introducing Minimal(TX_1) \vee NonMinimal(TX_1) in clause 4, using applicability condition (4):
 clause 5: Rtupling(Xs, Y) \leftarrow
                 Xs = [X|TXs],
                 NonMinimal(X), Decompose(X, HX, TX_1, TX_2),
                 Minimal(TX_1), R(TX_1, TY_1), R(TX_2, TY_2),
                 I_0 = e, Compose(I_0, TY_1, I_1),
                 Process(HX, HHY), Compose(I_1, HHY, I_2),
                 Compose(I_2, TY_2, I_3), HY = I_3,
                 R\_tupling(TXs, TY), Compose(HY, TY, Y)
 clause 6: Rtupling(Xs, Y) \leftarrow
                 Xs = [X|TXs],
                 NonMinimal(X), Decompose(X, HX, TX_1, TX_2),
                 NonMinimal(TX_1), R(TX_1, TY_1), R(TX_2, TY_2),
                 I_0 = e, Compose(I_0, TY_1, I_1),
                 Process(HX, HHY), Compose(I_1, HHY, I_2),
                 Compose(I_2, TY_2, I_3), HY = I_3,
                 R\_tupling(TXs, TY), Compose(HY, TY, Y)
By unfolding clause 5 wrt R(TX_1, TY_1) using DCLR, and simplifying using condition (4):
 clause 7: Rtupling(Xs, Y) \leftarrow
                 Xs = [X|TXs],
                 NonMinimal(X), Decompose(X, HX, TX_1, TX_2),
                 Minimal(TX_1), Minimal(TX_1), Solve(TX_1, TY_1),
                 R(TX_2, TY_2),
                 I_0 = e, Compose(I_0, TY_1, I_1),
                 Process(HX, HHY), Compose(I_1, HHY, I_2),
                 Compose(I_2, TY_2, I_3), HY = I_3,
                 R\_tupling(TXs, TY), Compose(HY, TY, Y)
By deleting one of the Minimal(TX_1) atoms in clause 7:
 clause 8: Rtupling(Xs, Y) \leftarrow
                 Xs = [X|TXs],
                 NonMinimal(X), Decompose(X, HX, TX_1, TX_2),
                 Minimal(TX_1), Solve(TX_1, TY_1),
                 R(TX_2, TY_2),
                 I_0 = e, Compose(I_0, TY_1, I_1),
                 Process(HX, HHY), Compose(I_1, HHY, I_2),
                 Compose(I_2, TY_2, I_3), HY = I_3,
                 R\_tupling(TXs, TY), Compose(HY, TY, Y)
By rewriting clause 8 using applicability condition (1):
```

```
clause 9: Rtupling(Xs, Y) \leftarrow
                 Xs = [X|TXs],
                 NonMinimal(X), Decompose(X, HX, TX_1, TX_2),
                 Minimal(TX_1), Solve(TX_1, TY_1),
                 R(TX_2, TY_2),
                 I_0 = e, Compose(I_0, TY_1, I_1),
                 Process(HX, HHY), Compose(I_1, HHY, I_2), HY = I_2,
                 R\_tupling(TXs, TTY), Compose(TY_2, TTY, TY),
                 Compose(HY, TY, Y)
By folding clause 9 using clauses 1 and 2:
 clause 10: R tupling(Xs, Y) \leftarrow
                   Xs = [X|TXs],
                   NonMinimal(X), Decompose(X, HX, TX_1, TX_2),
                   Minimal(TX_1), Solve(TX_1, TY_1),
                   R\_tupling([TX_2|TXs],TY),
                  I_0 = e, Compose(I_0, TY_1, I_1),
                   Process(HX, HHY), Compose(I_1, HHY, I_2), HY = I_2,
                  Compose(HY, TY, Y)
By introducing atom Minimal(U) (with new, i.e. existentially quantified, variable U) in clause 6:
 clause 11: Rtupling(Xs, Y) \leftarrow
                   Xs = [X|TXs],
                   NonMinimal(X), Decompose(X, HX, TX_1, TX_2),
                   NonMinimal(TX_1), Minimal(U),
                  R(TX_1, TY_1), R(TX_2, TY_2),
                  I_0 = e, Compose(I_0, TY_1, I_1),
                  Process(HX, HHY), Compose(I_1, HHY, I_2),
                  Compose(I_2, TY_2, I_3), HY = I_3,
                  R\_tupling(TXs, TY), Compose(HY, TY, Y)
By using applicability condition (3):
 clause 12: Rtupling(Xs, Y) \leftarrow
                   Xs = [X|TXs],
                   NonMinimal(X), Decompose(X, HX, TX_1, TX_2),
                   NonMinimal(TX_1), Minimal(U), R(U, e),
                   R(TX_1, TY_1), R(TX_2, TY_2),
                  I_0 = e, Compose(I_0, TY_1, I_1),
                  Process(HX, HHY), Compose(I_1, HHY, I_2),
                  Compose(I_2, TY_2, I_3), HY = I_3,
                  R \perp tupling(TXs, TY), Compose(HY, TY, Y)
By using applicability condition (2):
 clause 13: Rtupling(Xs, Y) \leftarrow
                   Xs = [X|TXs],
                   NonMinimal(X), Decompose(X, HX, TX_1, TX_2),
                   NonMinimal(TX_1), Minimal(U), R(U, e),
                   R(TX_1, TY_1), R(TX_2, TY_2),
                  I_0 = e, Compose(I_0, TY_1, I_1),
                  Compose(I_1, e, I_4),
                   Process(HX, HHY), Compose(I_4, HHY, I_2),
                  Compose(I_2, TY_2, I_3), HY = I_3,
                  R\_tupling(TXs, TY), Compose(HY, TY, Y)
By using applicability conditions (1) and (2):
```

```
clause 14: R 	ext{ tupling}(Xs, Y) \leftarrow
                      Xs = [X|TXs],
                      NonMinimal(X), Decompose(X, HX, TX_1, TX_2),
                      NonMinimal(TX_1),
                      Minimal(U), R(U, e),
                      R(TX_1, TY_1), R(TX_2, TY_2),
                      I_0 = e, Compose(I_0, e, I_1),
                      Process(HX, HHY), Compose(I_1, HHY, I_2),
                      Compose(I_2, TY_2, I_3), HY = I_3,
                      R\_tupling(TXs, TY), Compose(HY, TY, TI).
                      Compose(TY_1, TI, Y)
   By introducing a new, i.e. existentially quantified, variable YU in place of some occurrences of e:
    clause 15: R 	ext{ tupling}(Xs, Y) \leftarrow
                      Xs = [X|TXs],
                      NonMinimal(X), Decompose(X, HX, TX_1, TX_2),
                      NonMinimal(TX_1),
                      Minimal(U), R(U, YU),
                      R(TX_1, TY_1), R(TX_2, TY_2),
                      I_0 = e, Compose(I_0, YU, I_1),
                      Process(HX, HHY), Compose(I_1, HHY, I_2),
                      Compose(I_2, TY_2, I_3), HY = I_3,
                      R\_tupling(TXs, TY), Compose(HY, TY, TI),
                      Compose(TY_1, TI, Y)
   By introducing NonMinimal(N) and Decompose(N, HX, U, TX_2), since \exists N: \mathcal{T}_X.NonMinimal(N) \land
Decompose(N, HX, U, TX_2) always holds (because N is existentially quantified):
    clause 16: R 	ext{ tupling}(Xs, Y) \leftarrow
                      Xs = [X|TXs],
                      NonMinimal(X), Decompose(X, HX, TX_1, TX_2),
                      NonMinimal(TX_1),
                      Minimal(U), R(U, YU),
                      NonMinimal(N), Decompose(N, HX, U, TX_2),
                      R(TX_1, TY_1), R(TX_2, TY_2),
                      I_0 = e, Compose(I_0, YU, I_1),
                      Process(HX, HHY), Compose(I_1, HHY, I_2),
                      Compose(I_2, TY_2, I_3), HY = I_3,
                      R\_tupling(TXs, TY), Compose(HY, TY, TI),
                      Compose(TY_1, TI, Y)
   By duplicating goal Decompose(N, HX, U, TX_2):
    clause 17: R tupling(Xs, Y) \leftarrow
                      Xs = [X|TXs],
                      NonMinimal(X), Decompose(X, HX, TX_1, TX_2),
                      NonMinimal(TX_1),
                      Minimal(U), R(U, YU),
                      NonMinimal(N), Decompose(N, HX, U, TX_2),
                      Decompose(N, HX, U, TX_2),
                      R(TX_1, TY_1), R(TX_2, TY_2),
                      I_0 = e, Compose(I_0, YU, I_1),
                      Process(HX, HHY), Compose(I_1, HHY, I_2),
                      Compose(I_2, TY_2, I_3), HY = I_3,
                      R\_tupling(TXs, TY), Compose(HY, TY, TI),
                      Compose(TY_1, TI, Y)
```

By folding clause 17 using DCLR:

```
 \begin{aligned} clause \ 18: & \ Rtupling(Xs,Y) \leftarrow \\ & Xs = [X|TXs], \\ & \ NonMinimal(X), Decompose(X,HX,TX_1,TX_2), \\ & \ NonMinimal(TX_1), \\ & \ Minimal(U), \\ & \ Decompose(N,HX,U,TX_2), \\ & \ R(TX_1,TY_1), R(N,HY), \\ & \ Rtupling(TXs,TY), Compose(HY,TY,TI), \\ & \ Compose(TY_1,TI,Y) \end{aligned}
```

By folding clause 18 using clauses 1 and 2:

```
 clause \ 19: \ Rtupling(Xs,Y) \leftarrow \\ Xs = [X|TXs], \\ NonMinimal(X), Decompose(X,HX,TX_1,TX_2), \\ NonMinimal(TX_1), \\ Minimal(U), \\ Decompose(N,HX,U,TX_2), \\ R(TX_1,TY_1), \\ Rtupling([N|TXs],TI), \\ Compose(TY_1,TI,Y)
```

By folding clause 19 using clauses 1 and 2:

```
 clause \ 20: \ Rtupling(Xs,Y) \leftarrow \\ Xs = [X|TXs], \\ NonMinimal(X), Decompose(X,HX,TX_1,TX_2), \\ NonMinimal(TX_1), \\ Minimal(U), \\ Decompose(N,HX,U,TX_2), \\ Rtupling([TX_1,N|TXs],Y)
```

Clauses 1, 3, 10, and 20 are the clauses of  $P_{R\_tupling}$ . Therefore  $P_{R\_tupling}$  is steadfast wrt  $S_{R\_tupling}$  in S.

To prove that  $P_R$  is steadfast wrt  $S_R$  in  $\{S_{R\_tupling}\}$ , we do a backward proof that we begin with  $P_R$  in TG and from which we try to obtain  $S_R$ .

The procedure  $P_R$  for R in TG is:

$$R(X,Y) \leftarrow R\_tupling([X],Y)$$

By taking the 'completion':

$$\forall X: \mathcal{T}_X, \forall Y: \mathcal{T}_Y. \ \mathcal{I}_R(X) \Rightarrow [R(X,Y) \Leftrightarrow R\_tupling([X],Y)]$$

By unfolding the 'completion' above wrt  $R\_tupling([X], Y)$  using  $S_{R\_tupling}$ :

$$\forall X: \mathcal{T}_X, \forall Y: \mathcal{T}_Y. \ \mathcal{I}_R(X) \Rightarrow [R(X,Y) \Leftrightarrow \exists Y_1, I_1: \mathcal{T}_Y. \ \mathcal{O}_R(X,Y_1) \land I_1 = Y_1 \land Y = I_1]$$

By simplification:

$$\forall X : \mathcal{T}_X, \forall Y : \mathcal{T}_Y. \ \mathcal{I}_R(X)) \Rightarrow [R(X,Y) \Leftrightarrow \mathcal{O}_R(X,Y)]$$

We obtain  $S_R$ , so  $P_R$  is steadfast wrt  $S_R$  in  $\{S_{R\_tupling}\}$ .

Therefore, TG is also steadfast wrt  $S_R$  in S.

## C Proof of $DG_2$

As a reminder, we give again the generalization schema  $DG_2$ .

```
DG_2: \langle DCLR, DGRL, C_{d2} \rangle where C_{d2}: (1) Compose is associative (2) Compose has e as the right identity element, where e appears in DCLR
```

and templates DCLR and DGRL are in Figure 9.

```
R(X,Y) \leftarrow
                                                      R(X,Y) \leftarrow
                                                              R\_descending_2(X,Y,e)
        Minimal(X),
                                                      R_- descending_2(X, Y, A) \leftarrow
       Solve(X,Y)
R(X, Y) \leftarrow
                                                              Minimal(X),
                                                              Solve(X, S), Compose(S, A, Y)
       NonMinimal(X),
        Decompose(X, HX, TX_1, TX_2),
                                                     R_- descending_2(X, Y, A) \leftarrow
        R(TX_1, TY_1), R(TX_2, TY_2),
                                                              NonMinimal(X),
       I_0 = e, Compose(I_0, TY_1, I_1),
                                                              Decompose(X, HX, TX_1, TX_2),
        Process(HX, HY), Compose(I_1, HY, I_2),
                                                              A = A_3, R\_descending_2(TX_2, A_2, A_3),
       Compose(I_2, TY_2, I_3), Y = I_3
                                                              Process(HX, HY), Compose(HY, A_2, A_1),
                                                              R\_descending_2(TX_1, A_0, A_1),
                                                              Compose(e, A_0, Y)
```

Figure 9: Templates DCLR and DGRL

The specification  $S_R$  of predicate R is:

$$\forall X: \mathcal{T}_X, \forall Y: \mathcal{T}_Y. \ \mathcal{I}_R(X) \Rightarrow [R(X,Y) \Leftrightarrow \mathcal{O}_R(X,Y)]$$

The specification  $S_{R\_descending_2}$  of predicate  $R\_descending_2$  is:

```
\forall X: \mathcal{T}_X, \forall Y, A: \mathcal{T}_Y. \ \mathcal{I}_R(X) \Rightarrow [R\_descending_2(X,Y,A) \Leftrightarrow \exists S: \mathcal{T}_Y. \ \mathcal{O}_R(X,S) \land \mathcal{O}_C(S,A,Y)]
```

where  $\mathcal{O}_C$  is the output condition of Compose and  $\mathcal{O}_R$  is the output condition of R.

To prove the generalization schema  $DG_2$ , we have to prove that templates DCLR and DGRL are equivalent wrt  $S_R$ . By Definition 5, this holds iff the following two conditions hold:

- (a) DCLR is steadfast wrt  $S_R$  in  $S = \{S_{Minimal}, S_{NonMinimal}, S_{Solve}, S_{Decompose}, S_{Compose}\}$ , where  $S_{Minimal}, S_{NonMinimal}, S_{Solve}, S_{Decompose}, S_{Compose}$  are the specifications of Minimal, NonMinimal, Solve, Decompose, which are all the undefined predicate names appearing in DCLR.
- (b) DGRL is also steadfast wrt  $S_R$  in S.

In program transformation, we assume that the input program, here template DCLR, is steadfast wrt  $S_R$  in  $\mathcal{S}$ , so condition (a) always holds.

To prove equivalence, we have to prove condition (b). We will use the property of steadfastness: DGRL is steadfast wrt  $S_R$  in S if  $P_{R\_descending_2}$  is steadfast wrt  $S_{R\_descending_2}$  in S, where  $P_{R\_descending_2}$  is the procedure for  $R\_descending_2$ , and  $P_R$  is steadfast wrt  $S_R$  in  $\{S_{R\_descending_2}\}$ , where  $P_R$  is the procedure for R.

To prove that  $P_{R\_descending_2}$  is steadfast wrt  $S_{R\_descending_2}$  in S, we do a constructive forward proof that we begin with  $S_{R\_descending_2}$  and from which we try to obtain  $P_{R\_descending_2}$ .

By taking the 'decompletion' of  $S_{R\_descending_2}$ :

```
clause 1: R\_descending_2(X, Y, A) \leftarrow R(X, S), Compose(S, A, Y)
```

By unfolding clause 1 wrt R(X,S) using DCLR, and using the assumption that DCLR is steadfast wrt  $S_R$  in S:

```
\begin{array}{ll} clause \ 2: & R\_descending_2(X,Y,A) \leftarrow \\ & Minimal(X), \\ & Solve(X,S), Compose(S,A,Y) \\ clause \ 3: & R\_descending_2(X,Y,A) \leftarrow \\ & NonMinimal(X), Decompose(X,HX,TX_1,TX_2), \\ & R(TX_1,TS_1), R(TX_2,TS_2), \\ & I_0 = e, Compose(I_0,TS_1,I_1), \\ & Process(HX,HS), Compose(I_1,HS,I_2), \\ & Compose(I_2,TS_2,I_3), S = I_3, \\ & Compose(S,A,Y) \end{array}
```

By using applicability condition (1) on clause 3:

$$\begin{array}{ll} clause \ 4: & R.descending_2(X,Y,A) \leftarrow \\ & NonMinimal(X), Decompose(X,HX,TX_1,TX_2), \\ & R(TX_1,TS_1), R(TX_2,TS_2), \\ & Compose(TS_2,A,A_2), \\ & Process(HX,HY), Compose(HY,A_2,A_1), \\ & Compose(TS_1,A_1,A_0), \\ & Compose(e,A_0,Y) \end{array}$$

By twice folding clause 4 using clause 1:

$$\begin{array}{ll} clause \ 5: & R.descending_2(X,Y,A) \leftarrow \\ & NonMinimal(X), Decompose(X,HX,TX_1,TX_2), \\ & R_{-}descending_2(TX_2,A_2,A), \\ & Process(HX,HY), Compose(HY,A_2,A_1), \\ & R_{-}descending_2(TX_1,A_0,A_1), \\ & Compose(e,A_0,Y) \end{array}$$

By introducing a new, i.e. existentially quantified, variable  $A_3$ :

$$\begin{array}{ll} clause \ 6: & R.descending_2(X,Y,A) \leftarrow \\ & NonMinimal(X), Decompose(X,HX,TX_1,TX_2), \\ & A = A_3, R.descending_2(TX_2,A_2,A_3), \\ & Process(HX,HY), Compose(HY,A_2,A_1), \\ & R.descending_2(TX_1,A_0,A_1), \\ & Compose(e,A_0,Y) \end{array}$$

Clauses 2 and 6 are the clauses of  $P_{R\_descending_2}$ . Therefore  $P_{R\_descending_2}$  is steadfast wrt  $S_{R\_descending_2}$  in S.

To prove that  $P_R$  is steadfast wrt  $S_R$  in  $\{S_{R\_descending_2}\}$ , we do a backward proof that we begin with  $P_R$  in DGRL and from which we try to obtain  $S_R$ .

The procedure  $P_R$  for R in DGRL is:

$$R(X,Y) \leftarrow R\_descending_2(X,Y,e)$$

By taking the 'completion':

$$\forall X: \mathcal{T}_X, \forall Y: \mathcal{T}_Y. \ \mathcal{I}_R(X) \Rightarrow [R(X,Y) \Leftrightarrow R\_descending_2(X,Y,e)]$$

By unfolding the 'completion' above wrt R-descending<sub>2</sub>(X,Y,e) using  $S_{R$ -descending<sub>2</sub>:

$$\forall X: \mathcal{T}_X, \forall Y: \mathcal{T}_Y. \ \mathcal{I}_R(X) \Rightarrow [R(X,Y) \Leftrightarrow \exists S: \mathcal{T}_Y. \ \mathcal{O}_R(X,S) \land \mathcal{O}_C(S,e,Y)]$$

By using applicability condition (2):

$$\forall X : \mathcal{T}_X, \forall Y : \mathcal{T}_Y. \quad \mathcal{I}_R(X) \Rightarrow [R(X,Y) \Leftrightarrow \exists S : \mathcal{T}_Y. \quad \mathcal{O}_R(X,S) \land S = Y]$$

By simplification:

$$\forall X: \mathcal{T}_X, \forall Y: \mathcal{T}_Y. \ \mathcal{I}_R(X) \Rightarrow [R(X,Y) \Leftrightarrow \mathcal{O}_R(X,Y)]$$

We obtain  $S_R$ , so  $P_R$  is steadfast wrt  $S_R$  in  $\{S_{R\_descending_2}\}$ .

Therefore, DGRL is also steadfast wrt  $S_R$  in S.