# VOC: A Methodology for the Translation Validation of Optimizing Compilers

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Abstract: There is a growing awareness, both in industry and academia, of the crucial role of formally verifying the translation from high-level source-code into low-level object code that is typically performed by an optimizing compiler. Formally verifying an optimizing compiler, as one would verify any other large program, is not feasible due to its size, ongoing evolution and modification, and, possibly, proprietary considerations. Translation validation is a novel approach that offers an alternative to the verification of translators in general and compilers in particular: Rather than verifying the compiler itself, one constructs a validation tool which, after *every* run of the compiler, formally confirms that the target code produced in the run is a correct translation of the source program. The paper presents VOC, a methodology for the translation validation of optimizing compilers. We distinguish between structure preserving optimizations, for which we establish a simulation relation between the source and target code based on computational induction, and structure modifying optimizations, for which we develop specialized "permutation rules". The paper also describes VOC-64—a prototype translation validator tool that automatically produces verification conditions for the global optimizations of the SGI Pro-64 compiler.

Key Words: translation validation, optimizing compilers, SGI Pro-64, voc-64, global optimizations, verification conditions, permutation rules Category: D2.4, D3.4, I6.4

## 1 Introduction

There is a growing awareness, both in industry and academia, of the crucial role of formally proving the correctness of safety-critical portions of systems. Most verification methods focus on verification of specification with respect to requirements, and high-level code with respect to specification. However, if one is to prove that the high-level specification is correctly implemented in lowlevel code, one needs to verify the compiler which performs the translations. Verifying the correctness of modern optimizing compilers is challenging because of the complexity and reconfigurability of the target architectures, as well as the sophisticated analysis and optimization algorithms used in the compilers.

Formally verifying a full-fledged optimizing compiler, as one would verify any other large program, is not feasible, due to its size, evolution over time, and, possibly, proprietary considerations. *Translation Validation* is a novel approach that offers an alternative to the verification of translators in general and of compilers in particular. Using the translation validation approach, rather than verify the compiler itself one constructs a *validating tool* which, after every run of the compiler, formally confirms that the target code produced is a correct translation of the source program.

The introduction of new families of microprocessor architectures, such as the EPIC family exemplified by the Intel IA-64 architecture, places an even heavier responsibility on optimizing compilers. Compile-time dependence analysis and instruction scheduling is required to exploit instruction-level parallelism in order to compete with other architectures, such as the super-scalar class of machines where the hardware determines dependences and reorders instructions at run-time. As a result, a new family of sophisticated optimizations have been developed and incorporated into compilers targeted at EPIC architectures.

Prior work ([PSS98a]) developed a tool for translation validation, CVT, that succeeded in automatically verifying translations involving approximately 10,000 lines of source code in about 10 minutes. The success of CVT critically depends on some simplifying assumptions that restrict the source and target to programs with a single external loop, and assume a very limited set of optimizations.

Other approaches [Nec00, RM00] considered translation validation for less restrictive languages allowing, for example, nested loops. They also considered a more extensive set of optimizations. However, the methods proposed there were restricted to *structure preserving* optimizations, and could not directly deal with more aggressive optimizations such as *loop distribution* and *loop tiling* that are often used in more advanced optimizing compilers.

Our ultimate goal is to develop a methodology for the translation validation of advanced optimizing compilers, with an emphasis on EPIC-targeted compilers and the aggressive optimizations characteristic to such compilers. Our methods will handle an extensive set of optimizations and can be used to implement fully automatic certifiers for a wide range of compilers, ensuring an extremely high level of confidence in the compiler in areas, such as safety-critical systems and compilation into silicon, where correctness is of paramount concern.

## 1.1 Overview

In this paper, we describe the initial steps towards our goal:

- the development of the theory of a *Correct translation*;
- a general proof rule for translation validation of *structure preserving* optimizations;
- voc-64, a tool that implements the proof rule for the IR (Intermediate Representation) to IR translation of an EPIC compiler (the SGI Pro-64);
- a proof rule for dealing with many *structure modifying* transformations;

Section 2 describes our formal model and theory of correct translation. In general terms, we first give common semantics to the source and target languages using the formalism of *Transition Systems* (TS's). The notion of a target code T being a correct implementation of a source code S is then defined in terms of *refinement*, stating that every computation of T corresponds to some computation of S with matching values of the corresponding variables. In Figure 1 we present the process of refinement as completion of a mapping diagram.



Figure 1: Refinement Completes the Picture

We distinguish between *structure preserving* optimizations, which admit a clear mapping of control points in the target program to corresponding control points in the source program, and *structure modifying* optimizations that admit no such mapping.

Structure Preserving optimizations, which cover most high-level optimizations, are the focus of Section 3. Our general approach for dealing with these optimizations is to establish a correspondence between the target and source code, based on *refinement*, and to prove it by *simulation*. According to this approach, we establish a *refinement mapping* indicating how the relevant source variables correspond to the target variables or expressions. The proof is then broken into a set of *verification conditions* (also called *proof obligations*), each claiming that a segment of target execution corresponds to a segment of source execution. In some of the cases, the proof obligations are not valid by themselves, and thus it is necessary to introduce *auxiliary invariants* which provably hold at selected points in the program. The proof obligations are then shown to be valid under the assumption of the auxiliary invariants.

For some optimizations the validating tool needs additional information that specifies which optimizing transformations have been applied in the current translation. This additional information can either be provided by the compiler or inferred by a set of heuristics and analysis techniques (some described in Section 4.) The refinement proof rule we present in Section 3 uses *invariant assertions*, which the validation tool generates at selected control points using a set of heuristics. The verification conditions are then be augmented by these invariants.

In Section 4 we describe VOC-64, our prototype tool that generates, *fully automatically*, the verification conditions for all global optimizations of the SGI Pro-64 compiler. VOC-64 builds on the theory developed in Section 3, while using heuristics to generate the correct program annotations that allow for the construction of the auxiliary invariants. The verification conditions produced by VOC-64 can be sent to CVT [PSS98a] to be verified.

A more challenging category of optimizations that is not covered in Section 3 is that of structure modifying optimizations and includes, e.g., *loop distribution* and *fusion*, *loop tiling*, and *loop interchange*. For this class, it is often impossible to apply the refinement-based rule since there are often no control points where the states of the source and target programs can be compared. We identify a large class of these optimizations, namely the *reordering transformations*, and present in Section 5 *permutation rules* that allow for their effective translation validation. We then show in Section 6 that, while loop unrolling falls naturally into the category of reordering transformation and can be dealt with by the permutation rule, it can also be dealt with by the structure preserving methodology of Section 3.

One of the side-products we anticipate from this work is the formulation of validation-oriented instrumentation, which will instruct writers of future compilers how to incorporate into the optimization modules appropriate additional outputs which will facilitate validation. This will lead to a theory of construction of *self-certifying* compilers.

## 1.2 Related Work

The work here is an extension of the work in [PSS98a]. The work in [Nec00] covers some important aspects of our work. For one, it extends the source programs considered from single-loop programs to programs with arbitrarily nested

loop structure. An additional important feature is that the method requires no compiler instrumentation at all, and applies various heuristics to recover and identify the optimizations performed and the associated refinement mappings. The main limitation apparent in [Nec00] is that, as is implied by the single proof method described in the report, it can only be applied to structure-preserving optimizations. In contrast, our work can also be applied to structure-modifying optimizations, such as the ones associated with aggressive loop optimizations, which are a major component of optimizations for modern architectures.

The notion of correct translation that appears in [GS99] is similar to ours; however, the work there does not deal with optimizations.

Another related work is [RM00] which proposes a comparable approach to translation validation, where an important contribution is the ability to handle pointers in the source program. However, the method proposed there assumes *full* instrumentation of the compiler, which is not assumed here or in [Nec00].

More weakly related are the works reported in [Nec97] and [NL98], which do not purport to establish full correctness of a translation but are only interested in certain "safety" properties. However, the techniques of program analysis described there are very relevant to the automatic generation of refinement mappings and auxiliary invariants. Rival [Riv03] presents a methodology based on abstract-interpretation for certification of assembly code that uses the analysis of the source code and the debugging information.

The work in [Fre02] presents a framework for describing global optimizations by rewrite rules with CTL formulae as side conditions, which allow for generation of correct optimizations, but not for verification of (possibly incorrect) optimizations. The work in [GGB02] proposes a method for deploying optimizing code generation while correct translation between input program and code. They focus on code selection and instruction scheduling for SIMD machines.

Somewhat similar to our approach, in the treatment of structure modifying transformation, is the work in [SBCJ02]. There, static analysis is used to extract geometric model, on which loop data reuse transformations are checked to preserve semantics. preserving equivalence conditions can be checked that . However, this work focuses on source-to-source transformations that are manually applied in embedded system design, while the focus of our work is optimizations that are automatically generated by compilers.

#### 2 The Model

The compiler receives a *source program* written in some high-level language, translates it into an *Intermediate Representation (IR)*, and then applies a series of optimizations to the program – starting with classical architecture-independent global optimizations, and then architecture-dependent ones such as register allocation and instruction scheduling. Typically, these optimizations are performed

in several passes (up to 15 in some compilers), where each pass applies a certain type of optimization. In this section we briefly describe the intermediate code, which we assume to be the input and output language of the optimization phase of the compiler, and the transition system model which is our formal model.

### 2.1 Intermediate Code

The intermediate code is a three-address code. It is described by a *flow graph*, which is a graph representation of the three-address code. Each node in the flow graph represents a *basic block*, that is, a sequence of statements that is executed in its entirety and contains no branches. The edges of the graph represent the flow of control.

**Example 1** Fig. 2 shows some C code, its translation by the SGI Pro-64 into intermediate code, and the corresponding flow graph. The code computes the integer square root of n.



Figure 2: Source Code, IR, and Flow Graph

#### 2.2 Transition Systems

In order to present the formal semantics of source and intermediate code we introduce transition systems, TS's, a variant of the transition systems of [PSS98b]. A Transition System  $S = \langle V, \mathcal{O}, \Theta, \rho \rangle$  is a state machine consisting of:

-V a set of state variables,

 $-\mathcal{O}\subseteq V$  a set of observable variables,

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- $-\Theta$  an *initial condition* characterizing the initial states of the system, and
- $-\rho$  a transition relation, relating a state to its possible successors.

The variables are typed, and a *state* of a TS is a type-consistent interpretation of the variables. For a state s and a variable  $x \in V$ , we denote by s[x] the value that s assigns to x. The transition relation refers to both unprimed and primed versions of the variables, where the primed versions refer to the values of the variables in the successor states, while unprimed versions of variables refer to their value in the pre-transition state. Thus, e.g., the transition relation may include "y' = y + 1" to denote that the value of the variable y in the successor state is greater by one than its value in the old (pre-transition) state.

The observable variables are the variables we care about, where we treat each I/O device as a variable, and each I/O operation removes/appends elements to the corresponding variable. If desired, we can also include among the observables the history of external procedure calls for a selected set of procedures. When comparing two systems, we will require that the observable variables in the two systems match.

A computation of a TS is a maximal finite or infinite sequence of states  $\sigma: s_0, s_1, \ldots$ , starting with a state that satisfies the initial condition such that every two consecutive states are related by the transition relation. I.e.,  $s_0 \models \Theta$  and  $\langle s_i, s_{i+1} \rangle \models \rho$  for every  $i, 0 \le i+1 < |\sigma|^1$ .

**Example 2** We translate the intermediate code in Fig. 2 into a TS. The set of state variables V includes the observables **n** and **y**, and the local variable **w**. We also include in V the control variable (program counter)  $\pi$  that points to the next statement to be executed. The range of  $\pi$  is {B0,B1,B2,B4}. The initial condition, given by  $\Theta: \pi = B0$ , states that the program starts at location (i.e. block) B0. As observables, we take  $\mathcal{O} = \{n, y\}$ .

The transition relation  $\rho$  can be presented as the disjunction of four disjuncts  $\rho = \rho_{01} \vee \rho_{12} \vee \rho_{21} \vee \rho_{14}$ , where  $\rho_{ij}$  describes all possible moves from Bi to Bj without passing through intermediate blocks.

For example,  $\rho_{21}$  is:

 $(\pi = 2) \land (\mathbf{w}' = \mathbf{w} + 2 * \mathbf{y} + 3) \land (\mathbf{y}' = \mathbf{y} + 1) \land (\pi' = 1)$ 

When describing a transition relation, we mention only variables whose values are changed. Thus, we omit from  $\rho_{21}$  the clause n' = n since n is not changed in the transition.

A computation of the program starts with B0, continues to B1, then cycles to B2 and back to B1 several times, and finally terminates at B4. The state reached at each block is described by the values assigned to the variables.

<sup>&</sup>lt;sup>1</sup>  $|\sigma|$ , the *length of*  $\sigma$ , is the number of states in  $\sigma$ . When  $\sigma$  is infinite, its length is  $\omega$ .

A transition system  $\mathcal{T}$  is called *deterministic* if the observable part of the initial condition uniquely determines the rest of the computation. That is, if  $\mathcal{T}$  has two computations  $s_0, s_1, \ldots$  and  $t_0, t_1, \ldots$  such that the observable part (values of the observable variables) of  $s_0$  agrees with the observable part of  $t_0$ , then the two computations are identical. We restrict our attention to deterministic transition systems and the programs which generate such systems. Thus, to simplify the presentation, we do not consider here programs whose behavior may depend on additional inputs which the program reads throughout the computation. It is straightforward to extend the theory and methods to such intermediate inputdriven programs.

The translation of an intermediate code into a TS is straightforward; we therefore assume that all code we are dealing with here is described by a TS.

#### 2.3 Comparison and Refinement between TSs

Let  $P_s = \langle V_s, \mathcal{O}_s, \mathcal{O}_s, \rho_s \rangle$  and  $P_T = \langle V_T, \mathcal{O}_T, \mathcal{O}_T, \rho_T \rangle$  be two TS's, to which we refer as the *source* and *target* TS's, respectively. Such two systems are called *comparable* if there exists a one-to-one correspondence between the observables of  $P_s$  and those of  $P_T$ . To simplify the notation, we denote by  $X \in \mathcal{O}_s$  and  $x \in \mathcal{O}_T$  the corresponding observables in the two systems. A source state s is defined to be *compatible* with the target state t, if s and t agree on their observable parts. That is, s[X] = t[x] for every  $x \in \mathcal{O}_T$ . We say that  $P_T$  is a *correct translation (refinement)* of  $P_s$  if they are comparable and, for every  $\sigma_T : t_0, t_1, \ldots$  a computation of  $P_T$  and every  $\sigma_s : s_0, s_1, \ldots$  a computation of  $P_s$  such that  $s_0$  is compatible with  $t_0, \sigma_T$  is terminating (finite) iff  $\sigma_s$  is and, in the case of termination, their final states are compatible.

Our goal is to provide an automated method that will establish (or refute) that a given target code correctly implements a given source code, where both are expressed as TSs.

## 3 VOC: Structure-Preserving Transformations

We use the term "structure preserving" transformation without giving it a rigorous definition. Roughly speaking, we use to the term to cover all transformations that can be dealt with by Floyd-like methodologies, i.e., structure preserving transformation allow the assignment of control points where the values of observable variables can be matched, such that each loop includes at least one control point. These transformation cover most of the global optimizations (including loop-invariant code motion) and do not cover loop transformation such as interchange, reversal, and tiling.

Let  $P_s = \langle V_s, \mathcal{O}_s, \mathcal{O}_s, \rho_s \rangle$  and  $P_T = \langle V_T, \mathcal{O}_T, \mathcal{O}_T, \rho_T \rangle$  be comparable TSs, where  $P_s$  is the *source* and  $P_T$  is the *target*. In order to establish that  $P_T$  is a

correct translation of  $P_s$  for the cases that  $P_r$  is derived from  $P_s$  by structure preserving transformations, we introduce a proof rule, VALIDATE. The rule is inspired by the computational induction approach ([Flo67]), originally introduced for proving properties of a single program. Rule VALIDATE provides a proof methodology by which one can prove that one program *refines* another. This is achieved by establishing a *control mapping* from target to source locations, a *data abstraction* mapping from source to target variables, and proving that these abstractions are maintained along basic execution paths of the target program.

The proof rule is presented in Fig. 3. There, each TS is assumed to have a *cut*point set CP. This is a set of blocks that includes the initial and terminal block, as well as at least one block from each of the cycles in the programs' control flow graph. A simple path is a path connecting two cut-points, and containing no other cut-point as an intermediate node. For each simple path leading from Bi and Bj,  $\rho_{ij}$  describes the transition relation between blocks Bi and Bj. Typically, such a transition relation contains the condition which enables this path to be traversed, and the data transformation effected by the path. Note that, when the path from Bi to Bj passes through blocks that are not in the cut-point set,  $\rho_{ij}$  is a compressed transition relation that can be computed by the composition of the intermediate transition relation on the path from Bi to Bj.

The invariants  $\varphi_i$  in part (2) are program annotations that are expected to hold whenever execution visits block Bi. They often can be derived from the data flow analysis carried out by an optimizing compiler. Intuitively, their role is to carry information in between basic blocks. Note that we allow the data abstraction  $\alpha$  in part (3) to be partial, and to include guards (the  $p_i$ s.) The motivation for allowing  $\alpha$  to be partial is to accommodate situations which occur, for example, in dead code elimination, where source variables have no corresponding target variables. The motivation for allowing  $\alpha$  to contain guards is to accommodate situations occurring, for example, in loop invariant code motion where, at some points of the execution, source variables have no correspondence in the target while at other points they do. The guards, thus, describe the conditions under which the source variables can be defined using target variables.

The verification conditions assert that at each (target) transition from Bi to Bj<sup>2</sup>, if the assertion  $\varphi_i$  and the data abstraction hold before the transition, and the transition takes place, then after the transition there exist new source variables that reflect the corresponding transition in the source, and the data abstraction and the assertion  $\varphi_j$  hold in the new state. Hence,  $\varphi_i$  is used as a hypothesis at the antecedent of the implication  $C_{ij}$ . In return, the validator also has to establish that  $\varphi_j$  holds after the transition. Thus, as part of the verification effort, we confirm that the proposed assertions are indeed inductive and hold whenever the corresponding block is visited. Since the assertion mentions only

 $<sup>^{2}</sup>$  Recall that we assume that a path described by the transition is simple.

- 1. Establish a control abstraction  $\kappa: \mathsf{CP}_T \to \mathsf{CP}_S$  that maps initial and terminal blocks of the target into the initial and terminal blocks of the source.
- 2. For each basic block Bi in  $\mathsf{CP}_T$ , form an *invariant*  $\varphi_i$  that may refer only to concrete (target) variables.

3. Establish a data abstraction

 $\alpha: (p_1 \to V_1 = e_1) \land \cdots \land (p_n \to V_n = e_n)$ 

assigning to some non-control source state variables  $V_i \in V_S$  an expression  $e_i$  over the target state variables, conditional on the (target) boolean expression  $p_i$ . Note that  $\alpha$  may contain more than one clause for the same variable. It is required that, for every *observable* source variable  $V \in \mathcal{O}_S$  (whose target counterpart is v) and every terminal target block B,  $\alpha$  implies that V = v at B.

4. For each pair of basic blocks Bi and Bj such that there is a simple path from Bi to Bj in the control graph of  $P_T$ , let  $Paths(\kappa(i), \kappa(j))$  be the set of simple source paths connecting block  $B\kappa(i)$  to  $B\kappa(j)$ . We form the verification condition

$$C_{ij}: \qquad \varphi_i \wedge \alpha \wedge \rho_{ij}^{^T} \quad \to \quad \exists V_S': (\bigvee_{\pi \in Paths(\kappa(i),\kappa(j))} \rho_\pi^S) \wedge \alpha' \wedge \varphi_j',$$

where  $\rho_{\pi}^{S}$  is the transition relation for the simple source path  $\pi$ . 5. Establish the validity of all the generated verification conditions.



target variables, their validity should depend solely on the target code.

In most cases, the primed source variables can be easily determined from the code, and the existential quantification in verification condition (4) can be eliminated. This is because, in the case that E contains no free occurrences of the variable x', the implication  $q \to \exists x' : (x' = E \land r)$  is validity-equivalent to the implication  $q \land (x' = E) \to r$ . However, this may not always be the case. In some transformations there is no bijection between the different paths connecting two control points in the source and the paths connecting the corresponding (via  $\kappa^{-1}$ ) control points in the target. Another case where the identification of the primed source variables is not easily determined from the code is when the data abstraction  $\alpha$  is partial. We present below an example for such cases. We are therefore forced to leave the existential quantifier in (4).

In Appendix A we prove the soundness of the rule. In Section 4 we describe VOC-64 – a tool, currently being developed at NYU, to automatically generate verification conditions (VCs) for programs being compiled by the SGI Pro-64 compiler. Verification of the VCs that are generated by VOC-64 can be performed by CVT, which was developed for the *Sacres* project [PRSS99]. The parts that

cannot be handled by CVT can be handled by other theorem provers. We have been using STeP [MAB<sup>+</sup>94] and are exploring other packages that can provide similar capabilities.

Before we describe VOC-64 and its capabilities, we give an example of an application of VALIDATE as generated by VOC. For readability, the output here is slightly edited, but is essentially as produced by the tool. In the next section, we describe the tool in more detail.

#### **Examples of the Application of VALIDATE**

Our first example is derived using VOC-64 which is described in Section 4. Here we sketch some of the relevant outputs. Consider the program of Fig. 2 after a series of optimizations: Constant folding, copy propagation, dead code elimination, control flow graph optimization (loop inversion), and strength reduction. A simplified version of the resulting code, where we renamed some variables, is in Fig. 4. The annotation ( $\varphi_1$ , denoted **phi1**) is supplied by the compiler (see Section 4).

BO N <- 500	B0.t264 <- 0		
Y <- 0	y <- 0		
W <- 1	w <- 1		
B1 WHILE (W <= N)	B1 {phi1: .t264 = 2 * y}		
B2 BLOCK	w <t264 +="" 3<="" td="" w=""></t264>		
W <- W + 2 * Y + 3	y <- y + 1		
Y <- Y + 1	.t264 <t264 +="" 2<="" td=""></t264>		
END_BLOCK	IF (w <= 500) GOTO B1		
B4	B2		
(a) Input Program	(b) Optimized Code		

Figure 4: Example 1: Source and Annotated Target Programs

To validate the program, we use the control mapping  $\kappa = \{0 \mapsto 0, 1 \mapsto 2, 2 \mapsto 4\}$ , and the data abstraction

$$\alpha : \begin{pmatrix} (\mathsf{PC} = \kappa(\mathsf{pc})) \land (\mathsf{pc} \neq 0 \to \mathsf{Y} = \mathsf{y}) \land \\ (\mathsf{pc} \neq 0 \to \mathsf{W} = \mathsf{w}) \land (\mathsf{pc} \neq 0 \to \mathsf{N} = \mathsf{500}) \end{pmatrix}$$

where variable names in upper case denote source (abstract) variables, and lower case letters denote their target (concrete) counterparts. Note that we always include in  $\alpha$  the control mapping PC =  $\kappa(pc)$ .

The verification condition  $C_{01}$  obtained for the simple path from B0 to B1, after simplification (including the removal of the existential quantifier), is:

$$C_{01}: \ \alpha \ \land \ \rho_{01}^{^{T}} \ \land \ \alpha' \ \rightarrow \ \rho_{02}^{^{S}} \ \land \ \varphi_{1}'$$

where  $\rho_{01}^{T}$  is defined by:

$$\left(\left(\texttt{pc}=0\right)\ \land\ (.t264'=0)\ \land\ (\texttt{y}'=\texttt{0})\ \land\ (\texttt{w}'=\texttt{1})\ \land\ (\texttt{pc}'=\texttt{1})\right)$$

and  $\rho_{02}^{s}$  is defined by:

$$\left(\left(\mathsf{PC}=0\right)\ \land\ \left(\mathsf{Y}'=0\right)\ \land\ \left(\mathsf{W}'=1\right)\ \land\ \left(\mathsf{N}'=500\right)\ \land\ \left(\mathsf{N}'\geq\mathsf{W}'\right)\ \land\ \left(\mathsf{PC}'=2\right)\right)\right.$$

We also have:

$$\alpha': \left( (\mathsf{PC}' = \kappa(\mathsf{pc}')) \land (\mathsf{Y}' = \mathsf{y}') \land (\mathsf{W}' = \mathsf{w}') \land (\mathsf{N}' = \mathsf{500}) \right)$$

and  $\varphi'_1$ : (.t264' = 2 \* y'). The other verification conditions are constructed similarly. They are all trivial to verify.

Our second example demonstrates the need for the existential quantifier in the VC. Consider the following source and target programs:

```
B0 I <- 0
                                         B0i <- 0
B1 X <- A + B
  IF !(I=0) GOTO B3
                                            x <- a + b
                                         B1 {phi: x = a + b}
B2 I <- X
  GOTO B4
                                            i <- i + x
B3 I <- I + X
                                            if (i < 100) goto B1
B4Y <- A + I
                                         B2 y <- a + i
  IF (I<100) GOTO B1
                                         B3
B5
                                             (b) Optimized Code
   (a) Input Program
```

Figure 5: Example 2: Source and Annotated Target Programs

To validate this transformation using VALIDATE, we use the control mapping  $\kappa = \{0 \mapsto 0, 1 \mapsto 1, 3 \mapsto 5\}$ , and the data abstraction

 $\alpha: (\mathsf{PC} = \kappa(\mathsf{pc})) \land \mathsf{I} = \mathsf{i} \land \mathsf{A} = \mathsf{a} \land \mathsf{B} = \mathsf{b} \land (\mathsf{pc} \neq \mathsf{1} \to \mathsf{X} = \mathsf{x} \land \mathsf{Y} = \mathsf{y})$ 

The verification condition  $C_{11}$  obtained for the simple path from B1 to B1 requires computing  $\rho_{11}^{s}$ , which is a disjunction of the transition relations of the

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path  $B1\to B3\to B4\to B1$  and the path  $B1\to B2\to B4\to B1.$  Consequently, we obtain

$$\begin{split} \rho_{11}^{\circ} &= \mathsf{PC} = 1 \ \land \ \mathsf{PC}' = 1 \ \land \\ & \left( \begin{matrix} (I = 0 \ \land \ A + B < 100 \ \land \ I' = A + B \ \land \ X' = A + B \ \land \\ Y' = 2A + B \ \land \ A' = A \ \land \ B' = B \end{matrix} \right) \lor \\ & (I \neq 0 \ \land \ I + A + B < 100 \ \land \ I' = I + A + B \ \land \ X' = A + B \ \land \\ & Y' = I + 2A + B \ \land \ A' = A \ \land \ B' = B ) \end{split} \right) \end{split}$$

While for  $\rho_{11}^{T}$  we have:

C

$$\rho_{11}^{T} = (i + x < 100 \land i' = i + x \land x' = x \land y' = y \land a' = a \land b' = b)$$

Thus, the verification condition  $C_{11}$  is  $\varphi_1 \wedge \alpha \wedge \rho_{11}^T \rightarrow \exists I', X', Y', A', B' : \varphi_1' \wedge \alpha' \wedge \rho_{11}^s$ . Here, the existential quantifier cannot be immediately removed, since there are two possible paths in the source, both implying different values for the primed source variables. (This, of course, assumes the validator cannot attempt to reconcile the two branches on its own without a theorem provers)

## 4 VOC-64: A translation Validator for the SGI Pro-64 Compiler

This section presents an overview of the components of VOC-64 : the parser and the generators of cut-point sets, simple paths, transition relations, invariants, data abstraction, control mapping, and verification conditions. Thus, VOC-64 performs its own control- and data-flow analyses, providing a cross-check of the analyses of the compiler. The description of the components includes examples of the tool's output using the source program of Fig. 2 and its target of Fig. 4. The documentation for VOC-64 and examples of complete runs are in *http://www.cs.nyu.edu/validation/tvoc*.

**Parser** (*wh.cxx* and *wh.h*). The intermediate language of the SGI Pro-64 compiler is WHIRL. After each round of optimization, the compiler outputs ASCII formatted WHIRL code, which can be read by a parser and translated back into a graphic representation.

Cut-Point Set(*ts\_more.cxx*). VOC-64 computes cut-point sets, CP\_SET, for both source and target as follows. The cut-point sets include initial and terminal blocks. For each loop, the first block loop's body will be chosen as cut-point.

For the example of the previous section, VOC-64 computes the cut-point set  $\{0, 2, 4\}$  for the source, and  $\{0, 1, 2\}$  for the target.

**Control Mapping** (*ts\_more.cxx*) VOC-64 maps each initial and terminal location of the target to initial and terminal locations of the source.

Since we are dealing with structure preserving optimization, it is not hard to establish one-to-one correspondence between loops in the target and loops in the source. Thus each cut-point of a target loop is mapped to the cut-point of the corresponding source loop.

For our example, VOC-64 produces {0 -> 0, 1 -> 2, 2 -> 4}.

**Paths** (*ts\_more.cxx*). VOC-64 computes sets CP\_PATHS of paths for each source and target. The set includes all *simple* paths (and cycles) between two points in the appropriate CP\_SET, i.e., paths that do not contain as intermediate points any other point in CP\_SET.

For our example, VOC-64 computes (for the source)  $CP\_PATHS = \{B0 \rightarrow B1 \rightarrow B2, B2 \rightarrow B1 \rightarrow B2, B0 \rightarrow B1 \rightarrow B4, B2 \rightarrow B1 \rightarrow B4\}$ 

**Transition Relation** For each path  $\text{Bi} \to \text{Bj}$  in CP\_PATHS, VOC-64 computes the  $\tau_{ij}$ , which is  $\rho_{ij}$  without the control information (which is implicit) The output is Ps(i,j) for source, and Pt(i,j) for target, which consists of a set of equalities over the appropriate variables and the branch conditions. Thus,  $\rho_{ij}^x$  is a conjunct of the terms in Px(i,j), together with  $\pi = i \land \pi' = j$ . For example, for Ps(0,2) vOC-64 produces

 $(N = 500) \& (Y = 0) \& (W = 1) \& (1 \le 500)$ 

**Invariants** (*ts.cxx*). VOC-64 computes two types of invariant assertions for each basic block. One type is derived from the reachable definitions (obtained by data flow analysis). These invariants help VOC-64 handle optimizations as copy propagation and code motion. The other type is derived from loop induction variables. These invariants help VOC-64 handle optimizations such as strength reduction.

In Appendix B we describe how VOC-64 computes invariants of the first type. However, we observed that the invariants so derived cannot handle strength reduction, which led us to generate invariants that build on the loop induction variables. This is accomplished by computing, for loop induction variables i and j whose initial values are  $i_0$  and  $j_0$  respectively, and that get incremented in each iteration by  $c_1$  and  $c_2$  respectively, the invariant  $j = c_2/c_1 * i + (j_0 - i_0 * c_2/c_1)$ .

**Data Abstraction** (*ts\_more.cxx*). The data abstraction that VOC-64 computes is a set (conjunction) of implications of the form  $pc = i \rightarrow (v = V)$ ). These implications are computed for each basic block Bi. That is, VOC-64 computes, for each target block B(*i*), equalities of the type v = V. Let alpha(i) denote the equalities for target block Bi. For each target block Bj that leads into Bi, VOC-64 computes the set of such equalities that are preserved in the path from Bj into Bi, so that alpha(i) is the intersection of all such sets from all incoming paths. The computation of alpha(i) is described in Fig. 6.

```
repeat for every path from Bj to Bi

beta(j,i) := {(v = V) s.t.

\varphi_i \land \alpha \land \rho_{ji}^T \land \rho_{\kappa(j)\kappa(i)}^S \rightarrow (v = V)}

alpha(i) := intersection beta(j,i)

for all paths from Bj to Bi

until sets stabilize
```

**Figure 6:** Computation of alpha(*i*)

The computation is successful when each target path has a unique source path that maps to it. Currently, VOC-64 does not handle data abstraction for cases when a single target path maps into multiple source paths.

In our example, we obtain in the data abstraction, both  $(pc = 1) \rightarrow (y = y)$ and  $(pc = 2) \rightarrow (y = y)$ .

**Generation of Verification Conditions** The construction of the VCs is usually straightforward. An interesting case is, however, when there are multiple paths connecting two cut-points in both source and target. Assume that the cut-point set includes Bi and Bj. Assume further that there are m different paths from Bi to Bj, each contributing a disjunct  $P_k$  to  $\rho_{i,j}^T$ , and that there are n different paths from B $\kappa(i)$  to  $B\kappa(j)$ , each contributing a disjunct  $Q_\ell$  to  $\rho_{\kappa(i),\kappa(j)}^S$ . Then voc-64 generates m VCs  $C_{ij}^k$ ,  $k = 1, \ldots, m$ , each of the form  $\varphi_i \wedge \alpha \wedge P_k \rightarrow \exists V_s' : \bigvee_{\ell=1}^n Q_\ell \wedge \alpha' \wedge \varphi'_j$ .

## 5 Validating Loop Reordering Transformations

A reordering transformation is any program transformation that merely changes the order of execution of the code, without adding or deleting any executions of any statement [AK02]. It preserves a dependence if it preserves the relative execution order of the source and target of that dependence, and thus preserves the meaning of the program. Reordering transformations cover many of the loop transformations, including fusion, distribution, interchange, tiling, unrolling, and reordering of statements within a loop body.

In this section we review the reordering loop transformations and propose "permutation rules" that the validator may use to deal with these transformations.

#### 5.1 Overview of Reordering Loop Transformations

Consider a loop of the form described in Fig. 7. Schematically, we can describe

for 
$$i_1 = L_1$$
 to  $H_1$  do  
...  
for  $i_m = L_m$  to  $H_m$  do  
 $B(i_1, \ldots, i_m)$   
end  
...  
end



such a loop in the form

for  $\mathbf{i} \in \mathcal{I}$  by  $\prec_{\tau}$  do  $B(\mathbf{i})$ 

where  $\mathbf{i} = (i_1, \ldots, i_m)$  is the list of nested loop indices, and  $\mathcal{I}$  is the set of the values assumed by  $\mathbf{i}$  through the different iterations of the loop. The set  $\mathcal{I}$  can be characterized by a set of linear inequalities. For example, for the loop of Fig. 7,  $\mathcal{I}$  is

$$\mathcal{I} = \{(i_1, \dots, i_m) \mid L_1 \le i_1 \le H_1 \land \dots \land L_m \le i_m \le H_m\}$$

The relation  $\prec_{\mathcal{I}}$  is the ordering by which the various points of  $\mathcal{I}$  are traversed. For example, for the loop of Fig. 7, this ordering is the lexicographic order on  $\mathcal{I}$ .

In general, a loop transformation has the following form:

for 
$$\mathbf{i} \in \mathcal{I}$$
 by  $\prec_{\tau}$  do  $B(\mathbf{i}) \implies$  for  $\mathbf{j} \in \mathcal{J}$  by  $\prec_{\tau}$  do  $B(F(\mathbf{j}))$  (1)

In such a transformation, we may possibly change the domain of the loop indices from  $\mathcal{I}$  to  $\mathcal{J}$ , the names of loop indices from **i** to **j**, and possibly introduce an additional linear transformation in the loop's body, changing it from the source  $B(\mathbf{i})$  to the target body  $B(F(\mathbf{j}))$ .

An example of such transformation is *loop reversal* which can be described as

for 
$$i = 1$$
 to N do  $B(i) \implies \text{for } j = N$  to 1 do  $B(j)$ 

For this example,  $\mathcal{I} = \mathcal{J} = [1..N]$ , the transformation F is the identity, and the two orders are given by  $i_1 \prec_{\mathcal{I}} i_2 \iff i_1 < i_2$  and  $j_1 \prec_{\mathcal{J}} j_2 \iff j_1 > j_2$ , respectively.

Since we expect the source and target programs to execute the same instances of the loop's body (possibly in a different order), we should guarantee that the mapping  $F : \mathcal{J} \mapsto \mathcal{I}$  is a bijection from  $\mathcal{J}$  to  $\mathcal{I}$ , i.e. a 1-1 onto mapping. Often, this guarantee can be ensured by displaying the inverse mapping  $F^{-1}: \mathcal{I} \mapsto \mathcal{J}$ , which for every value of  $\mathbf{i} \in \mathcal{I}$  provides a unique value of  $F^{-1}(i) \in \mathcal{J}$ .

Some common examples of transformations which fall into the class considered here are presented in Fig. 8 and Fig. 9. For each transformation, we describe the source loop, target loop, set of loop control variables for source ( $\mathcal{I}$ ) and target ( $\mathcal{J}$ ), their ordering ( $\prec_{\mathcal{I}}$  and  $\prec_{\mathcal{J}}$ ), and the bijection  $F: \mathcal{J} \mapsto \mathcal{I}$ . For tiling we assume that c divides n and d divides m.

	Interchange	skewing		
Source	for $i_1 = 1, n$ do for $i_2 = 1, m$ do $B(i_1, i_2)$	for $i_1 = 1, n$ do for $i_2 = 1, n$ do $B(i_1, i_2)$		
Target	for $j_1 = 1, m$ do for $j_2 = 1, n$ do $B(j_2, j_1)$	for $j_1 = 1, n$ do for $j_2 = j_1 + 1, j_1 + n$ do $B(j_2, j_2 - j1)$		
I	$\{1, \dots, n\} \times \{1, \dots, m\} \qquad \{1, \dots, n\} \times \{1, \dots, n\}$			
$\mathcal{J}$	$\{1, \dots, m\} \times \{1, \dots, n\} \ \{(j_1, j_2) : 1 \le j_1 \le n \land j_1 + 1 \le j_2 \le j_1 \}$			
i < i'	$i <_{lex} i'$ $i <_{lex} i'$			
j > j'	$\mathbf{j} <_{\text{lex}} \mathbf{j'}$	$\mathbf{j} <_{ ext{lex}} \mathbf{j'}$		
$F(\mathbf{j})$	$(j_2, j_1)$ $(j_1, j_2 - j_1)$			
$F^{-1}(i)$	$(i_2, i_1)$	$(i_1, i_1 + i_2)$		

Figure 8: Some Loop Transformations

	Reversal	Tiling		
Source	$\begin{array}{c} \text{for } \mathbf{i} = 1, \mathbf{n} \ \mathbf{do} \\ \mathbf{B}(i) \end{array}$	for $i_1 = 1, n$ do for $i_2 = 1, m$ do $B(i_1, i_2)$		
Target	for $j = n, 1$ do B(j)	for $j_1 = 1, n$ by c for $j_2 = 1, m$ by d for $j_3 = j_1, j_1 + c - 1$ for $j_4 = j_2, j_2 + d - 1$ $B(j_3, j_4)$		
$\mathcal{I}$	$\{1,\ldots,n\}$	$\{1,\ldots,n\} imes\{1,\ldots,m\}$		
$\mathcal{J}$	$\{1,\ldots,n\}$	$ \{ (j_1, j_2, j_3, j_3) : 1 \le j_1 \le n \ j_1 \equiv 1 \ \text{mod} \ c \ \land \ j_1 \le j_3 < j_1 + c \land \\ 1 \le j_2 \le m \ j_2 \equiv 1 \ \text{mod} \ d \ \land \ j_2 \le j_4 < j_2 + d \} $		
$\mathbf{i}\prec_{\mathcal{I}}\mathbf{i'}$	i < i'	$i <_{lex} i'$		
$\mathbf{j}\prec_\mathcal{J}\mathbf{j'}$	j > j'	$\mathbf{j} <_{\mathrm{lex}} \mathbf{j'}$		
$F(\mathbf{j})$	j	$(j_3,j_4)$		
$F^{-1}(\mathbf{i})$	i	$\left(c\lfloor \frac{i_1-1}{c}\rfloor+1,d\lfloor \frac{i_2-1}{d}\rfloor+1,i_1,i_2\right)$		

Figure 9: Some Loop Transformations

#### 5.2 Permutation Rules

The simulation-based proof method discussed in previous sections assumes that the source and target have similar structures and that the order between computation segments is essentially preserved in the translation. Since the transformations considered here may radically reorder the order between computations, we can no longer use rule VALIDATE for their validation. Therefore, we develop in this section a rule called the "permutation rule" for validating reordering transformations. The soundness of the permutation rule is established separately. Usually, structure-modifying optimizations are applied to small localized sections of the source program, while the rest of the program is only optimized by structure-preserving transformations. Therefore, the general validation of a translation will combine these two techniques.

There are two requirements we wish to establish in order to justify the transformation described in (1).

- 1. The mapping F is a bijection from  $\mathcal{J}$  onto  $\mathcal{I}$ . That is, F establishes a 1-1 correspondence between elements of  $\mathcal{J}$  and the elements of  $\mathcal{I}$ .
- For every i<sub>1</sub> ≺<sub>x</sub> i<sub>2</sub> such that F<sup>-1</sup>(i<sub>1</sub>) ≻<sub>y</sub> F<sup>-1</sup>(i<sub>2</sub>), B(i<sub>1</sub>); B(i<sub>2</sub>) ~ B(i<sub>2</sub>); B(i<sub>1</sub>). This requirement is based on the observation that in the source computation, B(i<sub>1</sub>) is executed before B(i<sub>2</sub>) while the corresponding B(i<sub>1</sub>) is executed after B(i<sub>2</sub>) in the target computation. The overall results will be the same if all of these permutation relations hold between pairs of iterations whose order of execution is reversed between source and target.

These requirements are summarized in rule PERMUTE, presented in Fig. 10.

Figure 10: Permutation Rule PERMUTE for reordering transformations

In order to apply rule PERMUTE to a given case, it is necessary to identify the function F (and  $F^{-1}$ ) and validate premises R1-R3. The identification of F can be provided to us by the compiler, once it determines which of the relevant loop optimizations it chooses to apply. Of course, the validator will need to verify that

F is a bijection and that the source and target bodies relate to each other as prescribed by the rule. Alternately, we can develop heuristics which can attempt to identify these functions based on a comparison of the source and target codes.

In most of the applications, the functions F and  $F^{-1}$  are based on linear expressions. For these cases, premises R1-R3 can be automatically validated using any implementation of linear integer arithmetic decision procedures, such as the ones contained in ICS, CVC or PVS.

The techniques presented here only dealt with transformations which reorder the execution of the entire loop's body. They can be easily generalized to deal with cases where the loop's body is partitioned into several segments, and each of the segments is moved to a different iteration. Such transformations occur in the case of loop fusion and distribution as well as loop pipelining.

## 6 A Note on Loop Unrolling

A schematic loop unrolling is in Fig. 11 (where we assume c > 1.) There are

```
L1: B(1); ...; B(n mod c)

L1: i = 1

L2: B(i); i=i+1;

if (i<=n) goto L2

L3:

(1) Source Program

L1: B(1); ...; B(n mod c)

if (n < c) goto L5

L3: i = (n mod c) + 1;

L4: B(i); B(i+1); ...; B(i+c-1);

i=i+c; if (i < n) goto L4

L5:

(b) Target Program
```

Figure 11: Loop Unrolling

several strategies for dealing with loop unrolling. One is to design a premutaionlike rule that deals with it directly. Another is to consider loop unrolling as a special case of tiling an  $n \times 1$  array with tiles of size c, and then unrolling the innermost loop. A third approach, which we pursue here, is to consider loop unrolling as a structure-preserving transformation and apply VALIDATE to it.

The formal treatment of the loop unrolling optimization was considered first by Raya Leviathan, who has suggested the application of rule VALIDATE to the problem. As reported in [PZL01], she used the verification system STEP in order to conduct a deductive verification of the example we bring below. The reason we repeat this example here is in order to show how VOC can complete this validation task in a fully automatic manner.

For a simple path between two cut-points in the target, VOC finds its corresponding execution in the source and checks whether the branch conditions of the two paths are logically equivalent. To this end, we allow that the source paths used in VALIDATE include non-simple paths, bounding the number of simple paths composed to derive each non-simple path to c, where c is the unrolling constant. We demonstrate the approach on the C-code and its translation described in Fig. 12.

C Code	Target	B5	t10 <- t1
<pre>long a[100]; void unroll(int n) { int i:</pre>	B0 IF !(0 < n) GOTO B6 B1 i <- 0 t1 <- &a t2 <- n MOD 3		t11 <- t1 + 8 t12 <- t1 + 16 t20 <- i t21 <- i + 1 t22 <- i + 2
<pre>for(i=0; i<n; i++)<="" td=""><td>IF (t2 = 0) GOTO B4 B2 [t1] &lt;- i t1 &lt;- t1 + 8 i &lt;- i + 1</td><td></td><td>[t10] &lt;- t20 [t11] &lt;- t21 [t12] &lt;- t22 t1 &lt;- t1 + 24</td></n;></pre>	IF (t2 = 0) GOTO B4 B2 [t1] <- i t1 <- t1 + 8 i <- i + 1		[t10] <- t20 [t11] <- t21 [t12] <- t22 t1 <- t1 + 24
Source Code (IR)	IF (t2 = 1) GOTO B4 B3 [t1] <- i		i <- i + 3 IF (i < n)
B0 i <- 0 B1 WHILE (i < n) B2 [&a + i * 8] <- i i <- i + 1	t1 <- t1 + 8 i <- i + 1 B4 IF !(i < n) GOTO B6	B6	GUIU B5 RETURN
B3 RETURN			

Figure 12: A Loop Unrolling Example

VOC-64 generated the control mapping  $\{0 \mapsto 0, 5 \mapsto 2, 6 \mapsto 3\}$ , the data abstraction  $N = n \land (\pi > 1 \rightarrow (I = i))$  and the invariants

$$\begin{array}{l} \varphi_0 \colon \mathrm{T} \\ \varphi_5 \colon (t1 = 8 \cdot i + \&a) \land (i < n) \land ((n - i) \bmod 3 = 0) \\ \varphi_6 \colon (t1 = 8 \cdot i + \&a) \land ((n - i) \bmod 3 = 0) \end{array}$$

For example, for  $C_{56} = \varphi_5 \land \alpha \land \rho_{56}^T \to \exists V_S' : \rho_{23}^S \land \alpha' \land \varphi_6'$ , where  $\rho_{23}^S$  is the non-simple path  $B2 \to B2 \to B2 \to B3$  which visits four cut-points (two of which are intermediate). VOC-64 generated for  $\rho_{56}^T$ :

$$\begin{pmatrix} (\pi = 5) \land (\pi' = 6) \land i' = i + 3) \land (t1' = t1 + 24) \land ([t1]' = i) \\ \land ([t1 + 8]' = i + 1) \land ([t1 + 16]' = i + 2) \land (i + 3 \ge n) \end{pmatrix}$$

and for (non-simple)  $\rho_{23}^{s}$ :

$$\begin{pmatrix} [8 \cdot I + \&A]' = I) \land ([8 \cdot (I+2) + \&A]' = I+2) \land \\ ([8 \cdot (I+1) + \&A]' = I+1) \land (\Pi = 2) \land (I' = I+3) \land \\ (I+1 < N) \land (I+2 < N) \land (I+3 \ge N) \land (\Pi' = 3) \end{pmatrix}$$

The paper [PZL01] presents a compilation of the Trimaran compiler that involves this example of loop unrolling, and verifies it using rule VALIDATE. In fact, in one case the validation failed, showing that Trimaran generated target code that could possibly cause a segmentation fault, although the source code would not have.

## 7 Summary and Future Work

This paper presented VOC, the theoretical framework for translation validation of optimizing compilers. We described VOC-64, a tool we are developing to perform automatic translation validation for the SGI Pro-64 compiler, and gave examples of the VCs it generates. VOC-64 currently generates verification conditions for all the classical global optimizations of the SGI Pro-64, as well as for loop unrolling.

We also presented permutation rules for dealing with reordering loop transformations. We are currently working on extending VOC to accommodate the permutation rules.

We have recently connected VOC-64 to the theorem prover ICS [FORS01], that verifies the verification condition generated by VOC-64. We are working on extensions to the theorem prover CVC [SBD02] so that it can provide automatic proofs to the permutation rules used for loop optimizations.

Our approach has a few weaknesses. It does not check for exceptions (overand under-flow, zero-divide, out of bound array references, etc.) These may cause both false negative and false positive validation results. Similarly, the approach does not check for exceptions that are introduced, or eliminated, during the compilation. These may only cause false negatives. Finally, the ability of our approach to check correctness of algebraic simplifications is limited by the power of the decision procedure employed by the theorem prover we use.

The work presented here does not deal with pointers, aliasing, and procedure calls. We intend to remedy this soon. We have also embarked on developing the theory for dealing with instruction scheduling and other machine-dependent optimizations, as well as on developing techniques for run-time validation of aggressive optimizations that cannot be validated by static tools.

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#### **A** Soundness of VALIDATE

Let  $P_s = \langle V_s, \mathcal{O}_s, \mathcal{O}_s, \rho_s \rangle$  and  $P_T = \langle V_T, \mathcal{O}_T, \mathcal{O}_T, \rho_T \rangle$  be two comparable deterministic TSs. Let  $\mathsf{CP}_s$  and  $\mathsf{CP}_T$  be the sets of cut-points of  $P_s$  and  $P_T$  respectively. Assume that the control mapping  $\kappa$ , the data abstraction  $\alpha$ , and the invariants  $\varphi_i$ s are all defined. Assume further that all verification conditions  $C_{ij}$  (for every i and j such that there is a simple path in  $P_T$  leading from Bi to Bj) have been established. We proceed to show that  $P_T$  is a correct translation of  $P_s$ .

Let

$$\sigma^{T}: s_1, s_2, \dots$$

be a finite or infinite computation of  $P_T$ , which visits blocks  $Bi_1, Bi_2, \ldots$ , respectively. Obviously  $Bi_1$  is in  $CP_T$  and if the computation is finite (terminating) then its last block is also in  $CP_T$ . According to an observation made in [Flo67],

 $\boldsymbol{\sigma}^{^{\scriptscriptstyle T}}$  can be decomposed into a fusion  $^3$  of simple paths

$$\beta': \underbrace{(Bj_1, \dots, Bj_2)}_{\pi_1^T} \circ \underbrace{(Bj_2, \dots, Bj_3)}_{\pi_2^T} \circ \cdots$$

such that  $Bj_1 = Bi_1$ , every  $Bj_k$  is in the cut-point set  $CP^T$ , and the path  $\pi_m^T = Bj_m, \ldots, Bj_{m+1}$  is simple. Since all VCs are assumed to hold, we have that

$$C_{j_k j_{k+1}} : \varphi_{j_k} \wedge \alpha \wedge \rho_{j_k j_{k+1}}^{^T} \to \exists V_{s}' : (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}^{^s}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}^{^s}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}^{^s}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}^{^s}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}^{^s}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \rho_{\Pi}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \cap (\bigcap_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \cap (\bigcap_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1})}) \wedge \alpha' \wedge \varphi_{j_{k+1}}' = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \cap (\bigcap_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \cap (\bigcap_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} \cap (\bigcap_{\Pi \in Paths(\kappa(j_k), \kappa(j_{k+1}))} = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_k), \kappa(j_k))} = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_k), \kappa(j_k))} = (\bigvee_{\Pi \in Paths(\kappa(j_k), \kappa(j_$$

holds for every  $k = 1, 2, \ldots$ 

We can show that there exists a computation of  $P_s$ :

$$\sigma : S_1, \ldots, S_2, \ldots,$$

such that  $S_1$  visits cut-point  $B\kappa(j_1)$ ,  $S_2$  visits cut-point  $B\kappa(j_2)$ , and so on, and such that the source state visiting cut-point  $B\kappa(j_r)$  is compatible with the target state visiting cut-point  $Bj_r$ , for every r = 0, 1, ...

Consider now the case that the target computation is terminating. In this case, the last state  $s_r$  of  $\sigma^T$  visits some terminal cut-point  $\mathtt{Bj}_r$ . It follows that the computation  $\sigma^S$  is also finite, and its last state  $S_m$  ( $\sigma^T$  and  $\sigma^S$  are often of different lengths) visits cut-point  $\mathtt{B}(\kappa(j_r))$  and is compatible with  $s_r$ . Thus, every terminating target computation corresponds to a terminating source computation with compatible final states.

In the other direction, let  $\sigma^{s}: S_{0}, \ldots, S_{n}$  be a terminating source computation. Let  $\sigma^{T}: s_{0}, s_{1}, \ldots$  be the unique (due to determinism) target computation evolving from the initial state  $s_{0}$  which is compatible with  $S_{0}$ . If  $\sigma^{T}$  is terminating then, by the previous line of arguments, its final state must be compatible with the last state of  $\sigma^{s}$ . If  $\sigma^{T}$  is infinite, we can follow the previously sketched construction and obtain another source computation  $\tilde{\sigma}^{s}: \tilde{S}_{0}, \tilde{S}_{1}, \ldots$  which is infinite and compatible with  $\sigma^{s}$ . Since both  $S_{0}$  and  $\tilde{S}_{0}$  are compatible with  $s_{0}$  they have an identical observable part. This contradicts the assumption that  $P^{s}$  is deterministic and can have at most a single computation with a given observable part of its initial state.

It follows that every terminating source computation has a compatible terminating target computation.

### **B** Generating Invariants from Data Flow Analysis

Invariants that are generated by data flow analysis are of definitions that are carried out into a basic blocks by all its predecessors. We outline here the procedure that generates these invariants.

 $<sup>^3</sup>$  concatenation which does not duplicate the node which appears at the end of the first path and the beginning of the second path

For a basic block B, define:

kill(B) : set of B's assignments  $y = e(\bar{x})$ some of whose terms are redefined later in B gen(B) : set of B's assignments  $y = e(\bar{x})$ none of whose terms are redefined later in B

Both kill(B) and gen(B) are easy to construct. VOC-64 constructs two other sets, in(B), that is the set of invariants upon entry to B, and out(B), that is the set of invariants upon exit from B. These two sets are computed by the procedure described in Fig. 13, where *pred*(B) is the set of all blocks leading into B.

```
For every block B

in(B) init {if BB is initial

then set of u = u_0 for every variable u

else emptyset}

out(B) init emptyset

repeat for every block B

out(B) := (in(B) \ kill(B)) \cup gen(B)

in(B) := \bigcap_{p \in predB} out(p)

until all sets stabilize
```

Figure 13: Procedure to Compute Invariants

Set operations and comparisons are performed syntactically. An obvious enhancement to our tool is perform those operations semantically. Another possible enhancement is to add inequalities to the computed invariants, which are readily available from the data flow analysis.

VOC-64 computed invariants for both source and target. In optimizations such as code sinking, or even for constant folding together combined with dead code elimination, these invariants are used, though theoretically not necessary.