

A FORMAL APPROACH TO CONTRACT VERIFICATION FOR
HIGH-INTEGRITY APPLICATIONS

by

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B.A., Nanjing University of Posts and Telecommunications, China, 2007

M.S., Nanjing University, China, 2010

AN ABSTRACT OF A DISSERTATION

submitted in partial fulfillment of the
requirements for the degree

DOCTOR OF PHILOSOPHY

Department of Computing and Information Sciences
College of Engineering

KANSAS STATE UNIVERSITY
Manhattan, Kansas

2016

Abstract

High-integrity applications are safety- and security-critical applications developed for a variety of critical tasks. The correctness of these applications must be thoroughly tested or formally verified to ensure their reliability and robustness. The major properties to be verified for the correctness of applications include: (1) functional properties, capturing the expected behaviors of a software, (2) dataflow property, tracking data dependency and preventing secret data from leaking to the public, and (3) robustness property, the ability of a program to deal with errors during execution.

This dissertation presents and explores formal verification and proof technique, a promising technique using rigorous mathematical methods, to verify critical applications from the above three aspects. Our research is carried out in the context of SPARK, a programming language designed for development of safety- and security-critical applications.

First, we have formalized in the Coq proof assistant the dynamic semantics for a significant subset of the SPARK 2014 language, which includes run-time checks as an integral part of the language, as any formal methods for program specification and verification depend on the unambiguous semantics of the language.

Second, we have formally defined and proved the correctness of run-time checks generation and optimization based on SPARK reference semantics, and have built the certifying tools within the mechanized proof infrastructure to certify the run-time checks inserted by the GNAT compiler frontend to guarantee the absence of run-time errors.

Third, we have proposed a language-based information security policy framework and the associated enforcement algorithm, which is proved to be sound with respect to the formalized program semantics. We have shown how the policy framework can be integrated into SPARK 2014 for more advanced information security analysis.

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Acknowledgments

First, I really want to thank my advisor Dr. John Hatcliff for his time and patience for advising my research work and his support for my internships at different industrial companies and research institutes worldwide, opening the door to my future career path. As a distinguished professor, he will always be my role model in my future career, to be confident, diligent, perseverant and excellent.

Second, thanks to Dr. Torben Amtoft, a nice and well-respected teacher, for the regular meeting and discussion every week to make progress for my research topic, and Dr. Robby, a pursuit of perfection in research and a great software engineer, for giving me a lot of help and advice during my PhD research.

Thanks to all my committee members: Dr. Xinming Ou, Dr. Andrew G. Bennett, and Dr. Margaret Rys for your review and feedback for my PhD work.

Thanks to Dr. Yannick Moy from AdaCore, Dr. Pierre Courtieu, Dr. Maria Virginia Aponte and Dr. Tristan Crolard from CNAM for the cooperation work on SPARK.

Thanks to all the friends at K-State.

Finally, I want to express my sincere gratitude to my family. Wish you health and happiness !

Chapter 1

Introduction

Challenges Today, more and more software-dependent applications are being developed and they are widely used to better our life. At the same time, they may also cause disaster, especially for those safety critical and security critical softwares used in the area of finance, healthcare, transportation, defence and so on. Examples include password checking systems, online shopping and banking systems, medical device coordinating systems, railway and aircraft control systems, military system and control systems of nuclear power plants. Any errors in these critical systems will endanger personal life safety, company financial security, national security and environment safety. How can we prevent such catastrophic events and trust that these critical softwares will always perform correctly? To solve this problem, stringent software certification standards have been defined for several different critical domains (e.g., DO-178C/DO-333 for avionics, ISO 2626 for automotive, and EN50128 for railways). In the case of avionics, DO-333, a supplement of DO-178C on formal methods, allows testing to be partly replaced by formal verification, which has been successfully applied in some projects at Dassault-Aviation and Airbus¹. These standards only provide a guidance for software verification procedure, but concrete verification techniques completely satisfying these standards are still a long way to go.

Correctness Properties Critical softwares are usually developed for a variety of critical tasks , so their correctness must be thoroughly tested or formally verified to ensure their reliability and robustness. The major properties to be verified for the correctness of software include: functional property, dataflow property, and robustness property.

Functional Property. It is a property about a program's intended behaviors, which are usually expressed with pre and post conditions. The precondition describes the condition that must always be true for the input variables when the program is called, and the postcondition is a condition that will always hold when the program returns. Therefore, pre and postconditions specify a contract between a program and its users, whenever the precondition is satisfied by the users, the program will promise to always return a result satisfying its postcondition.

Dataflow Property. It's a property about data dependency between program input and output variables. It can be used for code optimization (e.g. dead code detection), ensure the property of noninterference (e.g. prevention of leaking secret information) and so on.

Robustness Property. It is a property about the ability of a program to deal with errors during execution. One major robustness property is to ensure the absence of runtime errors, such as divide by zero, overflow, out of range and so on. They should be handled correctly, otherwise the program may get into abnormal state and return unexpected result.

Verification Methods Automatic methods to ensure software correctness include static analysis, performed during compilation phase, dynamic analysis, performed during program execution, and their combination. Static analysis techniques range from simple type checks to sophisticated formal methods, such as data-flow analysis, Hoare logic, model checking and symbolic execution. Contrast to dynamic analysis, such as testing which is driven by test cases and is unlikely to cover and test all possible program behaviors, formal methods apply rigorous mathematical approach to prove the correctness of software by building some mathematic models for the software and using mathematic reasoning logic to reason about its possible behaviors against some correctness constraints. Therefore, verification techniques

based on formal methods are able to explore all possible program states and conclusively prove the absence of certain errors.

1.1 Motivation

Formal Language Semantics Formal verification techniques applies formal methods of mathematics to prove the correctness of programs, and all assumptions related to each formal analysis method should be described and justified in order to make it sound. As any formal static analysis must rely on the behavior of the language being analyzed to explore all possible behaviors of a program, a precise and unambiguous definition of the semantics of the language becomes clearly a requirement in the certification process. Furthermore, the correctness of program static analysis itself and program translations can be also proved with respect to the language semantics.

The semantics of language is so important, for both correct program execution and sound program analysis, that all programming languages come with a reference manual defining semantics for each language structure. However, the semantics in this form (written in natural language descriptions) is quite informal and it may lead to semantic ambiguity (different implementor has different interpretation). To solve this problem, it's required to precisely define the formal semantics for a language in a rigorous mathematical way. Approaches to defining formal semantics of programming language include denotational semantics, operational semantics and axiomatic semantics.

Certification of Static Analysis There are various program static analysis and verification techniques that have been proposed to automatically check the correctness of the program with respect to the user supplied contracts. Usually, the reasoning logic and the implementation algorithms behind these static analysis methods are assumed to be correct and their claimed arguments for the analyzed program are trusted to be true. For critical applications with demand of high level reliability and robustness, these assumptions should

be justified to convince the correctness of the analysis methods themselves. More and more researchers have realized this problem, and a promising approach is to have their correctness formally proved within some mathematical proof tool, or even generate convincing evidence for their claimed verification results.

Enforceable and Sound Information Security Checking Framework Information security is concerned with confidentiality, integrity, and availability of information². Unlike functionality requirements defining what a software is supposed to accomplish, the requirements of information security is implicit. Current methodologies for software development provide little assurance that information security requirements are satisfied. A policy specification language for information security at the source code level is needed to explicitly and precisely specify the expected information security requirements. A security policy framework, with both expressive policy specification language and enforceable policy checking algorithm proved to be sound based on the interpretation of the programming language, can provide a high assurance that an implementation of a program satisfies the program's security requirements.

Formal Verification of Robustness Critical softwares are required to be robust to perform well not only under ordinary conditions but also under unusual conditions. The robustness of a software is almost as important as its functionality to achieve high levels of reliability. Sometimes, it can cause serious, even catastrophic, results. A well-known example is the explosion of the Ariane 5 launcher on its maiden flight in 1996 because of a software runtime error (out of range, overflow), which caused a loss of approximately DM 1200 million³. As the number and complexity of critical softwares are growing, the common testing based verification techniques will no longer be sufficient to ensure the robustness. While formal verification is a promising technique to enable proving the absence of errors for softwares executing in unusual conditions.

1.2 Related Work

In this section, we provide a survey of the work related to this dissertation, including the efforts made towards the formalization of language semantics, state-of-the-art work on formal verification methods, recent work on language-based information flow security policies, and the work on assurance of absence of run-time errors.

1.2.1 Formalization of Programming Language Semantics

Much work has been done on the formalization of programming language semantics, but most are for toy languages for academic purposes, and it's rare to see the formal semantics for real programming languages. The following are the only examples that we know coming with formal semantics.

Clight⁴, a large subset of the C programming language that have been formalized in the Coq proof assistant in CompCert project⁵ in INRIA. CompCert⁶ is a formally verified C compiler with proof of semantic preservation in program translation from source to target language. To achieve the correctness proof of the CompCert C compiler, the formal semantics of Clight and a series of intermediate languages during its translation to machine code have been formally defined in inductive small-step relations in Coq.

Tahina Ramananandro has formalized the semantics of a small subset of C++ using Coq, focusing on the C++ object model, including object construction and destruction^{7,8}. This is a work towards a formalization of a verified compiler for the object-oriented subset of C++ within the framework of the CompCert.

The Standard ML⁹ is a general-purpose functional language that comes with formal semantics in mathematical notation, where the rules of evaluation for each phrase of the language are formally specified.

C, C++ and Standard ML are all general-purpose programming language, none of them are designed for development of critical softwares. As far as we know, SPARK is the only

commercially supported programming language with a set of associated verification tool set targeted specially to the development of critical softwares. SPARK formal semantics were previously defined for SPARK 83^{10,11}. This definition includes both the static and the dynamic semantics of the language based on a precise notation inspired by the Z notation. But these semantics are manually defined on paper, no tool was used to check the soundness of these definition. What’s more, SPARK has evolved a lot since then, so a new and more rigorous semantic formalization for SPARK becomes imperative for machine-checkable proof of program correctness.

1.2.2 Certified Static Analysis

We have previously developed an information flow verification framework for machine-checked proofs of programs compliance to its information flow contract¹². The relational Hoare logic (called SIFL¹³) for reasoning about conditional information flow is formalized in Coq and have been proved sound with respect to the operational semantics of programming language. In addition, SIFL is extended to emit formal certificate of correctness claims about information flow contracts that are checkable in Coq proof assistant.

Deng Xianghua and others have manually formalized the operational semantics of Kiasan, a framework for reasoning and checking program properties based on symbolic execution, and proved the relative soundness and completeness for the basic symbolic executions by hand^{14,15}. Besides, they have also manually formalized the test input generation algorithms of KUnit¹⁶, an analysis feedback extension to Kiasan, and proved the path coverage of KUnit algorithms.

To assure the assertions claimed at the source-language program to be held in the machine-language program, a verified software toolchain VST¹⁷ has been developed in Andrew Appel’s research group. The software toolchain is a set of verification and translation tools for C programs built based on the framework of CompCert, which consists of a formally verified static analyzer to check assertions about programs, a formally verified compiler to

translate to machine language, and a runtime system to support context for programs.

All of the above work are carried out as an academic research and none of these prototype tools are actually used by the industry for the program development. A still challenging open problem is how to integrate these certification techniques into commercially available static analysis tools and enable them have the ability for industrial scale development and verification.

1.2.3 Verification of Run-Time Checks

Instead of merely detecting errors, formal methods can automatically verify the presence or absence of run-time errors. Model checking, abstract interpretation, and deductive verification techniques are the most well-known formal methods for the verification of run-time errors.

Model checking¹⁸ builds a model for a system and then exhaustively check whether a given property holds in this model. Verification of run-time errors can be performed by an exhaustive analysis of the program states to check whether there exists a state leading to a violation of any of the run-time properties. But it suffers from state explosion problems. Some well-known existing model checkers includes SPIN¹⁹, Bandera²⁰, Java Path Finder (JPF)²¹, Bogor²² and so on.

Abstract interpretation²³ is a technique of sound abstraction of the semantics of programs, which is mainly used for formal static analysis of program behaviors. It will never yield false negatives, but may produce false alarms (or false positives). Astree²⁴ is one of static analysis tools designed based on the theory of abstract interpretation, aiming at formally proving the absence of run-time errors. It consists of two phases, the analysis phase is to formally construct the set of execution traces of the program, and the verification phase is to check that none of the program's execution traces can reach a state triggering a run-time error.

Deductive program verification²⁵ consists of generating a set of mathematical proof obli-

gations (also called verification conditions), and then discharging these obligations using either automatic or interactive theorem provers. GNATProve for SPARK programs is one of such tools based on deductive verification technique. For each possible run-time error, a verification condition will be generated and then discharged by either automatic theorem prover, e.g. Alt-Ergo²⁶, Z3²⁷, CVC4²⁸ and others, or interactive theorem prover, e.g. Coq.

All of the above methods and tools are assuming the existence of certain frontend tool that can tell them what kinds of run-time checks and where are they needed to be checked under what conditions. This dependence on the frontend and the assumption of its correctness may break the verification of run-time errors. As any errors in the frontend, either misguiding the place of run-time checks or missing some checks, will make a sound verification into an unsound one. So a sound method is to verify the correctness of the frontend as well.

1.2.4 Declassification Policy

In contrast to the noninterference mechanism, which is too restrictive to describe the information security requirements of real applications, declassification mechanism provides a more flexible way for specifying, reasoning about, and enforcing information security for practically useful information flow control systems. It allows secret information to be declassified to some extent by weakening noninterference mechanism, but, at the same time, it also ensures that the system cannot leak more secret information than intended. There has been a lot of work on language-based security policies for enforcing declassification mechanism, which are usually classified into four different categories by the following four dimensions: *what* can be declassified, *where* declassification can occur, *who* is able to declassify information and *when* its allowed to be declassified. In this section, we don't plan to discuss them in four different dimensions as the declassification policies usually touch multiple dimensions and it's hard to categorize them into exact one dimension.

*Flow locks*²⁹ introduce a very simple mechanism for specifying conditional declassifica-

tion policies, which can specify conditions under which data may be read by certain system principals (or security levels). In this approach, each variable is associated with a set of system principals that can read it, and each principal can be guarded with conditions under which the principal has the right to access to the variable’s value. The conditions for declassification are represented as locks, which can be manipulated by means of special program instructions to either open or close locks according to the changes of program state.

*Nondisclosure policy*³⁰ is a block-structured approach to dynamically manipulate flow policies. It is a generalisation of non-interference that supports locally induced flow policies through the use of the special construct “*flow F in M*”, where F is a flow policy and M is an expression or subprogram, meaning that M is executed in the context of current flow policy extended with F , and the current policy is restored when the execution of M terminates. The flow policy F is in the form of $\ell_1 \prec \ell_2$, meaning declassification from security level ℓ_1 to ℓ_2 , for example, for the security levels H and L , with $H > L$, “*flow (H \prec L) in (y_l = x_h + 2)*” is legal because the flow policy $H \prec L$ allows the declassification from H to L in this assignment.

*Delimited nondisclosure policy (DND)*³¹ uses commands of the form “*declassify (exp) in {c}*” to specify what (through the value of expression exp) may be declassified in the program c . Security domains are not explicitly mentioned in declassification commands because implicitly a flow policy with only two domains, public and secret, is assumed.

*Delimited release*³² uses so called escape hatches to indicate what may be declassified by a program. An escape hatch has the syntax *declassify(exp, d)*, where exp is an expression and d is a security domain in the given flow policy. Semantically, the escape hatch specifies that the value of exp in the initial state (i.e. before program execution begins) may be revealed to the security domain d .

*Localized delimited release*³³ strengthens the demands of the *delimited release* by location sensitivity. It defines the security based on low-bisimulation relations for each pair of states in two execution traces. It collects the declassified expressions along the trace, and at

each declassification point, check whether current two states are low equivalent when they agree on the values of collected declassified expression up to this point.

*Conditioned gradual release*³⁴ use *revealed knowledge* to bound the *observed knowledge* by the attacker. It defines security as what a low observer knows about the initial state by observing the visible part of the trace should be bounded by the declassification policy. A declassification policy ($P \& \psi \text{ mod } x$) is checked at each declassification point to see whether condition P is always true in current state, and what the attacker observes from current declassification operation is bound by what are allowed to be leaked by observing the current value of ψ .

*Declassification with explicit reference points*³⁵ uses declassification guard $dguard(r, exp, d)$ to specify the values that may be declassified by an expression exp and by a reference point r . The reference point determines a set of states with the intention that the value of exp in any of these states may be declassified to domain d . Their framework allows one to make explicit in which states exp is evaluated to be declassified.

More others' work on declassification policy are still going on, but few of them have ever tried to integrate their proposed policy framework into some real programming languages and be used for the checking of the information security for the real programs.

1.3 Contributions

This dissertation presents and explores formal methods to ensure the software correctness properties from different aspects, and makes the following contributions towards the development of highly reliable and robust softwares used in critical domains to increase our confidence in their correctness.

Formalization of the Language Semantics for SPARK SPARK is a subset of Ada programming language designed for development of safety- and security-critical applications. Our first contribution is the formalization work towards a formal semantics for SPARK 2014,

the latest version of SPARK with new executable specification features. In this work, we have formalized the dynamic semantics for a core subset of the SPARK 2014 language in the Coq proof assistant (Section 3.3). The core language subset includes scalar subtypes and derived types, array types, record types, procedure calls, and locally defined subprograms; a large class of programs can be desugared to this core subset, thus, enabling evaluations on realistic SPARK systems to some extent. The formal semantics specification represents our trust-base (along with Coq, which itself has been highly-regarded as a proof system that has a smaller trust-base compared to others); the specification is trustable because, for example, it has been manually inspected by leading experts in SPARK/Ada both in industry and academia. Hence, it can be considered as *the* reference SPARK 2014 formal semantics. The main novelty in our semantics formalization is the modeling of on-the-fly run-time checks within the language semantics, which lays the foundation for our (future) work on mechanical reasoning about the correctness of SPARK translation and analysis.

Formalization, Proof and Certification for Run-time Check Generation and Optimization In SPARK, the compiler (called GNAT compiler) and verification tool set (GNATProve) are integrated seamlessly and GNAT compiler plays an important role in the GNATProve verification architecture. For example, to prove the absence of run-time errors, GNATProve relies on the correctness of run-time checks placement by the GNAT compiler frontend. Our second contribution is to build a mechanized proof infrastructure to formally certify the run-time checks within program AST produced by GNAT compiler frontend, which includes :

- An implementation of a certified run-time check generator for the core language (Section 4.2); that is, the implementation is proved to be *consistent* with the reference semantics with respect to the class of errors that can arise in the language subset (such as overflow checks, range checks, array index checks and division by zero checks). The consistency guarantees that if language-defined run-time checks generated by the

certified implementation do not fail, a program cannot “go wrong” according to the SPARK formal semantics. The generated checks by the implementation represents the baseline as the most conservative run-time check set (i.e., a larger set is unnecessary and could even be problematic).

- An implementation of a certified run-time check optimizer (Section 4.3). The optimization is needed because the GNAT frontend employs various optimizations to reduce the set of run-time checks that it generates for run-time efficiency sake. The certified optimizer uses an abstract interpretation-based²³ interval analysis; it generates a smaller set of run-time checks compared to the ones produced by the GNAT frontend, while still being consistent.
- An implementation of a conformance checker as a back-end of the GNAT front-end (including, e.g., a SPARK program translator to fully resolved SPARK ASTs in Coq) that automates evaluations of the GNAT frontend against the certified run-time check generators (Section 4.4). This essentially turns the industrial GNAT frontend into a certifying¹ tool with respect to introduction of run-time error check decorations. This increases the confidence in the GNAT compiler back-end that embeds run-time assertion checking when it emits machine code for testing, as well as in the GNAT-prove verifier that uses the run-time check decorations to determine what verification conditions to generate.

A Sound Information Security Policy Framework The third contribution of this dissertation is to propose a sound information security policy framework to enforce the safety of information flow within a system that manipulates data of different security levels, including:

- A design of a language-based information security policy specification framework (Sec-

¹ Certifying here means that the tool generates evidence testifying that it is in fact consistent with its specification for a particular use of the tool.

tion 5.1) to capture the desired information flow from one domain to another on the event of certain actions, and show how the framework can be specified and integrated into SPARK using Ada 2012 aspects decorations. It enhances SPARK current information flow analysis with ability to declare domains and specify declassification policy between those domains.

- A design of a static enforcement algorithm (Section 5.2) that can automatically check whether the program conforms to the specified information security policy, it’s a type checking system that based on type constraint generation followed by constraint solving procedure. The checking algorithm is compositional, and the verification of information security can be achieved modularly, at the level of individual subprograms, such that a called procedure can be checked with its inferred type constraint specification.
- Formalization of the operational semantics for programs with declassification procedures and proof of the correctness of the policy enforcement algorithm with respect to the formalized program semantics (Section 5.4).

Toolset and Evaluation We have provided a software certification and verification infrastructure for static analysis of SPARK programs. This infrastructure includes a toolset for program translation and analysis, such as translator (Jago) of SPARK 2014 ASTs into Coq ASTs, conformance checker for run-time check decorations of ASTs and the automatic checker for information security policies. Various evaluation of our proposed formal methods have been carried out on our toolset to demonstrate their effectiveness to assure the software certification process to build highly reliable and robust softwares.

1.4 Outline

The rest of this dissertation is organized as follows.

Chapter 2 is a background introduction, which contains a brief tutorial on SPARK 2014, a simple introduction about program run-time errors, a simple introduction to the information flow control techniques to ensure secure information flow of a system, and a summary about the formalization and proof techniques with Coq.

Chapter 3 presents the formal semantics of a core subset of SPARK 2014 programming language, including the run-time checks that are enforced by the SPARK language.

Chapter 4 provides the correctness proof for both the run-time check generation and run-time check optimizations, and their application to certify the correctness of run-time check decorations produced by GNAT compiler frontend.

Chapter 5 presents the proposed information security policy to be integrated into SPARK 2014 and an efficient and sound static analysis algorithm for automatic and modular enforcement of the proposed security policy.

Chapter 6 summarizes and discusses about future work.

Chapter 2

Background

2.1 SPARK 2014 Language

SPARK 2014 is a programming language designed for development of high integrity softwares with a set of associated verification tool set. It is a subset of Ada 2012 by removing some Ada features that defy analysis and proof and at the same time adding some new Ada aspects to support modular, constructive and formal verification. SPARK advocates the “correctness by construction” approach, which encourages the development of programs that are guaranteed to be correct by virtue of the techniques used in its construction. By now, SPARK has been used by various organizations, including Rockwell Collins and the US National Security Agency (NSA)³⁶, to develop safety critical and security critical systems used in the area of finance, military and aviation, such as Lockheed C130J and EuroFighter projects³⁷.

Some promising features of the SPARK 2014 language:

- It’s a language with unambiguous semantics, which is required to achieve sound analysis. This also makes it possible for us to develop formal semantics for SPARK and do formal proof and verification for SPARK techniques.

- SPARK 2014 introduced executable contract based on Ada 2012, which enables SPARK 2014 to perform both contract-based static deductive verification and contract-based, dynamic verification of interesting properties of a program. In SPARK 2014, contract specification language is an essential part of SPARK programming language rather than a different annotation language separate from SPARK programming language. This makes it natural to have program development and contract specification in the same programming language, reflecting the philosophy of “correctness by construction”.
- SPARK 2014 supplies various aspects (e.g., Global, Depends, Pre and Post), attributes (e.g., 'Old, 'Update) and pragmas (e.g., Assert, Assume) to specify contracts of programs.
- The associated verification tool chain for SPARK support for a mixture of proof and other verification methods such as testing. This enables a range of static analysis, including information-flow analysis (e.g., dependence between input and output variables), formal verification of robustness properties (e.g., overflow check), formal verification of functional properties (e.g., Pre and Post conditions) and others. That’s one of major reasons why SPARK is suitable for development of high integrity (either safety critical or security critical) softwares.

Syntax of Aspects (introduced in SPARK 2014)

```
aspect_specification ::= with aspect_mark [ $\Rightarrow$  aspect_definition ]
                    {, aspect_mark [ $\Rightarrow$  aspect_definition ] }
```

The following are some simple SPARK examples to demonstrate how the SPARK 2014 language looks like:

Example 2.1.1 (Global Aspect)

```
procedure Increase_By_One
with Global  $\Rightarrow$  (In_Out  $\Rightarrow$  X);
```

```

is
begin
  X := X + 1;
end Increase_By_One;

```

The *Global* aspect specifies all the global variables that are accessible by the specified procedures to read and/or write.

Example 2.1.2 (Depends Aspect)

```

procedure Swap (X, Y : in out Integer)
  with Depends  $\Rightarrow$  (X  $\Rightarrow$  Y,
                    Y  $\Rightarrow$  X);
is
  T : Integer;
begin
  T := X;
  X := Y;
  Y := T;
end Swap;

```

The *Depends* aspect specifies a dependency relation between inputs and outputs of the program, and the SPARK associated verification tool sets will automatically check whether all information flow within the program implementation complies with the user specified dependency relations.

Example 2.1.3 (Pre and Post Conditions Aspects)

```

function Divide (X, Y : Integer) return Integer
  with Pre  $\Rightarrow$  Y  $\neq$  0 and X > Integer 'First ,
      Post  $\Rightarrow$  Divide 'Result = X / Y;
is
begin
  return (X / Y);
end Divide;

```

The *Pre* aspect specifies the preconditions that should be always satisfied when the sub-program (procedure or function) is called, and the *Post* aspect specifies the postconditions

that are promised to hold by the subprogram on its call return. In the above example, the preconditions ensure that the subprogram will never get into division error guarded by condition $(Y \neq 0)$, divisor y being not equal to zero, and overflow error guarded by condition $(X > \text{Integer}'\text{First})$ as $(\text{Integer}'\text{First} / (-1))$ will cause overflow. The postcondition specifies that the subprogram *Divide* will always return result (X / Y) if X and Y satisfies its preconditions.

Example 2.1.4 (Contract Cases Aspect)

```

function Max (X, Y : Integer) return Integer
  with Contract_Cases  $\Rightarrow$  ( X  $\geq$  Y  $\Rightarrow$  Max' Result = X,
                           X < Y  $\Rightarrow$  Max' Result = Y);
is
  Z : Integer := X;
begin
  if X < Y then
    Z := Y;
  end if;
  return Z;
end Max;

```

The *Contract_Cases* aspect provides a structured way of defining a subprogram contract using mutually exclusive subcontract cases. In other words, the subprogram satisfies different contract case under different conditions and each time only one of the conditions of the contract case list is satisfied. In the above example, the *Contract_Cases* specifies that if X is greater than or equal to Y in the initial state of the program, then subprogram *Max* should return the value of X , otherwise, it returns the value of Y .

A *Contract_Cases* aspect can be used together with the *Pre* and *Post* aspects for the same subprogram. When the subprogram is called, it must be checked that the precondition specified by the *Pre* aspect is satisfied and only one of the conditions of the contract case list holds. When the subprogram returns, the postcondition specified by the *Post* aspect and the contract case under true condition should be satisfied. *Contract_Cases* is a little like the refinement of the *Post* aspect but not exactly.

In the following example, we will show an example specified by various aspects.

Example 2.1.5 (Combination of Various Aspect)

```
procedure Abs (X : in Integer; Y : out Integer)
  with Global  $\Rightarrow$  null,
        Depends  $\Rightarrow$  (Y  $\Rightarrow$  X),
        Pre  $\Rightarrow$  (X > Integer'First),
        Post  $\Rightarrow$  (Y  $\geq$  0),
        Contract_Cases  $\Rightarrow$  ( X  $\geq$  0  $\Rightarrow$  Y = X,
                             X < 0  $\Rightarrow$  Y = -X);
is
begin
  if X  $\geq$  0 then
    Y := X;
  else
    Y := -X;
  end if;
end Abs;
```

In the above example, subprogram *Abs* computes the absolute value of X and stores the result in the output variable Y. The precondition (X > Integer'First) specified in *Pre* aspect is to guard against the possible overflow.

2.2 Run-Time Errors

Run-time error is an error occurs during the execution of a program that prevents a program from working correctly. Unlike stop errors, which typically cause program to stop working, a program can continue to work after a run-time error, but in an unspecified way and the execution result is unexpected. Therefore, many programming languages provide some run-time check mechanism to raise run-time error exception as the executing program gets into a run-time error state. This is sufficient in some applications, but in the domain of safety- and security- critical applications, any of such run-time exception is undesirable and may cause disaster, such as applications in medical device systems. It can be achieved by testing of all

different usage scenarios before the deployment of the applications. The method of testing can detect some run-time errors but it cannot guarantee the absence of all run-time errors, while formal verification methods can formally verify a program to be free of run-time errors through static analysis of all possible program states.

In Ada 2012³⁸, there are four predefined exceptions in the language:

- *CONSTRAINT_ERROR*: raised whenever a subtype’s constraint is not satisfied or whenever a numeric operation cannot deliver a correct result (e.g. for arithmetic overflow, division by zero).
- *PROGRAM_ERROR*, raised upon an attempt to call a subprogram or activate a task when the body of the corresponding unit has not yet been elaborated.
- *STORAGE_ERROR*: raised whenever space is exhausted.
- *TASKING_ERROR*: raised when exceptions arise during intertask communication.

SPARK is a subset of Ada and many of run-time errors in Ada are excluded in SPARK because of the constraints of language features in SPARK, e.g. no dynamic allocation in SPARK, therefore no *STORAGE_ERROR* exception. Thus the remaining main run-time errors in SPARK are: incorrect indexing of array, writing to a variable with a value out of the range of the variable’s type through either assignment or pass-by-value in procedure call, overflow of an arithmetic operation with regard to the range of the target base type, and division by zero. All of these interesting errors can be divided into three major categories: range error, overflow error and division error. The following are some classical examples to illustrate these kinds of run-time errors in SPARK.

Range Error

Example 2.2.1 (Incorrect Indexing of Array)

```
subtype IndexT is Integer range 0 .. 10;
type ArrayT is array (IndexT) of Integer;
procedure Update(A: in out ArrayT; I: in IndexT; V: in Integer) is
```

```

begin
  ...
  A(I + 1) := V; — possible range error;
  ...
end Update;

```

The `ArrayT` is defined as an array of integer type with `IndexT` as its indexing bound type. It will raise range error in `A(I+1)` when `I` is 10, as the result of `I+1` falls out of the range of `IndexT` and will cause illegal array access.

Example 2.2.2 (Assignment Range Error)

```

subtype T is Integer range 0 .. 10;
procedure Assign(X: in T; Y: in Integer; Z: out T) is
begin
  ...
  Z := X + 1; — possible range error;
  Z := Y; — possible range error;
  ...
end Assign;

```

Type `T` is defined as a subtype of integer with range 0 to 10. For a variable `z` of type `T`, the assignment with `x+1` will cause range error when the value of `x` is 10. Similarly, the range error is raised for assignment from `y` to `z` whenever the value of `y` goes beyond the range between 0 and 10.

Example 2.2.3 (Procedure Call Range Error)

```

subtype T is Integer range 0 .. 10;
procedure f(X: in T; Y: out Integer) is
begin
  Y := X + 1;
end f;
procedure g(U: in Integer; V: out T) is
begin
  ...
  f(U, V); — possible range error;
  ...
end g;

```


Procedure f increases the value of x by one and assigns the result to y , with x being a variable of subtype τ and y being an integer, and there is no run-time error in this procedure. But, when it's called in procedure g with arguments u and v , it may cause range errors in two possible places: the range error raised when passing in the value from u to x and the range error when passing out the value from y to v when it returns. In both cases, they try to write to a variable with a value that maybe out of its range.

Overflow Error

Example 2.2.4 (Arithmetic Operation Overflow)

```

procedure f(X: in Integer; Y: in out Integer) is
begin
  ...
  Y := X + Y;  — possible overflow error;
  ...
  Y := X / Y;  — possible overflow error;
  ...
end f;

```

Overflow error happens when the resulting value of an arithmetic operation, including $+$, $-$, $*$ and $/$, gets out of the range of the base type integer. For example, for x/y , the overflow happens when x is the minimum value of integer and y is -1 .

Division Error

Example 2.2.5 (Division by Zero)

```

procedure f(X: in Integer; Y: in out Integer) is
begin
  ...
  Y := X / Y;    — possible division error;
  ...
  Y := X mod Y; — possible division error;
  ...
end f;

```

The division by zero error happens whenever the divisor is zero for division operators, such as $/$ and mod .

2.3 Information Security

There exist a wide range of safety- and security- critical information systems being used in the area of finance, healthcare, military and aviation to process multi-level security data, including password checking system, online shopping and banking system. In general, there are three ways to protect information confidentiality and integrity. *Cryptography* provides a way to hide information in data and protect data from tampering, but it's costly and impractical to decrypt and encrypt the data each time we need to process the data. *Access controls* can protect data from being read or modified by unauthorized users. However, it cannot prevent the propagation of information after it has been released for processing by a program. *Information flow* is the transfer of information from an input to an output in a given process. It reflects an end-to-end behavior of a system and *Information flow control* provides a complementary approach to track and regulate the information flow of a system to prevent secret data from leaking into public. One promising way to ensure the secure information flow of a system is to use *noninterference*, which requires that secret data may not interfere with (or affect) public data³⁹, as an end-to-end semantic security condition to reason about information flow security.

However, the security requirements enforced by *noninterference* are too restrictive. In fact, computing systems often need to deliberately declassify (or release) parts of its confidential information, for example, in password checking system, it's necessary to reveal some information about the stored password, telling the user whether his input password is correct or not. *Declassification* of information occurs when the confidentiality of information is decreased or become less restrictive. It's an exception to the normal secure information flow. The major challenge is to design an elegant declassification mechanism to precisely capture the intentional information release and ensure that the release is safe: the attacker could neither get around the declassification mechanism nor exploit the declassification mechanism to reveal more secret information than intended, e.g. secret laundering. A lot of research has been carried out in the area of declassification, and Sabelfeld and Sands⁴⁰ provides a road

map of the main declassification methods in current language-based security research and classify them according to four dimensions: *what* can be declassified, *where* declassification can occur, *who* is able to declassify information and *when* it's allowed to be declassified.

2.4 Formalization and Proof in Coq

Coq is a proof assistant, which is based on the *Curry-Howard correspondence* (propositions-as-types, formulas-as-types or proofs-as-programs), for interactive theorem proving. It provides a specification language called Gallina, which integrates programming and proving within a single formal language. That's, Gallina can be used as either a higher-ordering functional programming language to develop normal functional programs or a logic system to build and prove mathematical theories.

The logical foundation of Coq is the Calculus of Inductive Constructions (CIC), which has been proved to have property of *strong normalization*. This is a crucial property to ensure termination of all programs (or proofs) written in Gallina, as non-terminating programs introduce logical inconsistency, where any theorem can be proved with an infinite loop. This is also one way to avoid the halting problem, which is common in other programming languages.

Coq comes with a set of built-in automation tactics, such as *intros*, *inversion*, *simpl*, *auto* and so on, to address a goal directly or be applied repeatedly to reduce a goal to its subgoals until they are completely proved. While it is possible to conduct proofs using only those tactics, you can significantly increase your productivity by working with a set of more powerful user-defined tactics. To do it, Coq supplies a tactic language called Ltac, which enables users to develop powerful problem-specific tactics for domain-specific applications.

In contrast to the classical program verification method, where programs and specifications for program correctness properties are developed separately and finally a proof is built for the programs with respect to their specifications, dependent types in Coq make it

possible to integrate programming, specification, and proof into a single phase. It supports to encode correctness properties and proof within types, for example, the array type with specified array size can guarantee the absence of out-of-bounds errors. Adam Chlipala from MIT wrote a book⁴¹ about how to develop certified programs with dependent types in Coq. Both the classical program verification method and dependent types mechanism have their own advantages, and it's hard to say which one is the best choice. It totally depends on the favor of the user which verification style he prefers, as both can achieve the same goal. In general, dependent types work great and save effort for verification of programs manipulating data structures with some invariant properties. It can automatically propagate the invariant properties attached to data structures along the verification procedure without assuming and proving these invariants all the way down. And in most other cases, the classical program verification method is more convenient.

Certified Program vs Certifying Program: A certified program is the one coming with formal mathematical artifacts (such as machine-checked proofs) that serve as evidence that its implementation is consistent with its specification⁴¹, while a certifying program is the one to generate evidence for another program to testify that it's in fact consistent with its specification for a particular use of the program.

Some of the most famous certified programs include CompCert⁵ and VST¹⁷ as mentioned before. CompCert is a certified compiler that the compiler itself is proved to be correct in Coq. VST is a certified software verification toolchain built based on top of CompCert that targets to prove the correctness of the whole software toolchain in Coq from source code analyzer to program translator and the program supporting context. Furthermore, as part of the VST project, researchers even developed a certified theorem prover, called VeriStar⁴², for a decidable subset of separation logic. All these certified programs can guarantee the correctness of the program verified at the source code level can still hold at the machine code level.

Usually, it's much easier to check the output of the program than verifying the correct-

ness of the program itself. Certifying program is built based on this idea such that the program itself is not necessarily to be correct but it can generate a certified output, such as certifying compiler⁴³. It constructs proof for the compiled program, with the proof to be easily checked by the program consumer, thus the output of the certifying compiler is also called proof-carrying code⁴⁴. Proof-carrying code establishes the trust between the program consumer and its producer, which is important to convince the consumer that the foreign program is safe to execute, particularly in distributed and web computing where mobile code is allowed. A lot of work on certifying compiler focus on type-safety properties that it constructs proofs of type safety for programs with respect to some typing rules. However, it's difficult to automatically build proof for more advanced correctness and security properties for a program with certifying compiler.

Chapter 3

Formal Semantics of SPARK 2014

One main contribution of this thesis is a formal language reference semantics of core SPARK 2014 defined using the Coq proof assistant⁴⁵; Coq allows for specifying, implementing, and proving programming language related properties. We chose Coq due to the fact that it has a relatively small core which has been vetted by many experts in the programming language community (small trust-base).

The core language includes features typically found in imperative languages such as arrays, records, and procedure calls, as well as SPARK-specific structures, such as nested procedures and subtypes. In Ada programming language, it has introduced four categories of predefined exceptions that may be raised during the program execution. As a subset of Ada, the exceptions that may occur in SPARK are referred as run-time errors. One major difference between SPARK and other programming languages (e.g., C) is that verification for absence of run-time errors is required by the semantics of the language itself. Thus, our reference semantics perform the required run-time checks; that is, run-time checks are enforced at appropriate points during the program execution, and the program will terminate with a run-time error message as soon as one of its run-time checks fails.

The formalization includes: (a) a SPARK AST representation (symbols and types are fully resolved), and (b) SPARK evaluation semantics (including, e.g., state/value represen-

tations, expression evaluation, and statement execution).

3.1 Syntax of Core SPARK 2014

Figures 3.1, 3.2 and 3.3 show the syntax of core SPARK that we have formalized in Coq. The syntax is given according to both SPARK 2014 and Ada 2012 reference manuals, and we have ignored some trivial details, e.g., `numeric_literal` denoting the integer literals.

In Figure 3.1, a SPARK program compilation is constructed from a set of compilation units `compilation_unit` that can be separated compiled. A `library_item` is a compilation unit that's the body of a library unit `library_unit_body`. A `subprogram_body` specifies the execution of a subprogram and it's an implementation of the `library_unit_body`.

Subprogram is a procedure that can have side effects to externally visible variables through either output parameters or global variables. SPARK supports three access modes: `in`, `out` and `in out`. A parameter with `in` mode is readable only, `out` means writable only, and `in out` means both readable and writable. By default, the mode of parameter is `in`. Within the `declarative_part` of the procedure body, the user can declare new objects (e.g., integer variable) through `object_declaration`, new types (e.g., subtype, array and record type) through `subtype_declaration` and `type_declaration`, or even nested procedures. A derived type defined with `derived_type_definition` is a new type created from an existing one (e.g., type `T` is `new Integer range 1 .. 5`). A procedure implementation body contains a sequence of statements `handled_sequence_of_statements`, which can be either simple statement `simple_statement` (e.g., assignment `assignment_statement`) or compound statement `compound_statement` (e.g., if statement `if_statement` and loop statement `loop_statement`). An expression `expression` can be integer/boolean constant (`numeric_literal`), variable, or nested array or record (`name`).

For example, the following procedure *Factorial* defines a `subprogram_body`, which can work as a compilation unit. The procedure name *Factorial* corresponds to the `defining_program_unit_name` in the syntax, and the parameters *M* and *N* are its `parameter_profile`. The local declarations

```

compilation ::= { compilation_unit }

compilation_unit ::= library_item

library_item ::= library_unit_body

library_unit_body ::= subprogram_body

subprogram_body ::=
    subprogram_specification is
        declarative_part
    begin
        handled_sequence_of_statements
    end;

subprogram_specification ::=
    procedure_specification

procedure_specification ::=
    procedure defining_program_unit_name parameter_profile

defining_program_unit_name ::= defining_identifier

parameter_profile ::= [formal_part]

formal_part ::=
    (parameter_specification {; parameter_specification})

parameter_specification ::=
    defining_identifier_list : mode subtype_mark

mode ::= [in] | in out | out

defining_identifier_list ::=
    defining_identifier {, defining_identifier}

defining_identifier ::= identifier

subtype_mark ::= subtype_name

```

Figure 3.1: *Core SPARK Syntax (Part 1)*


```

declarative_part ::= { declarative_item }

declarative_item ::=
    basic_declarative_item | subprogram_body

basic_declarative_item ::= basic_declaration

basic_declaration ::=
    type_declaration | subtype_declaration
    | object_declaration

type_declaration ::= full_type_declaration

subtype_declaration ::=
    subtype defining_identifier is subtype_indication

full_type_declaration ::=
    type defining_identifier is type_definition

type_definition ::=
    integer_type_definition
    | array_type_definition
    | record_type_definition
    | derived_type_definition

handled_sequence_of_statements ::= sequence_of_statements

sequence_of_statements ::= statement {statement}

statement ::= simple_statement | compound_statement

simple_statement ::= null_statement
    | assignment_statement
    | procedure_call_statement

compound_statement ::=
    if_statement
    | loop_statement

```

Figure 3.2: *Core SPARK Syntax (Part 2)*

```

assignment_statement ::= name := expression;

procedure_call_statement ::= procedure_name actual_parameter_part;

if_statement ::=
    if condition then
        sequence_of_statements
    [else
        sequence_of_statements]
    end if;

loop_statement ::=
    while condition loop
        sequence_of_statements
    end loop;

name ::= identifier
    | indexed_component
    | selected_component

expression ::= relation {and relation} | relation {or relation}

indexed_component ::= prefix(expression {, expression})

selected_component ::= prefix . identifier

prefix ::= name

relation ::= simple_expression [relational_operator simple_expression]

simple_expression ::=
    [unary_adding_operator] term {binary_adding_operator term}

term ::= factor {multiplying_operator factor}

factor ::= primary | not primary

primary ::= numeric_literal | name | (expression)

```

Figure 3.3: *Core SPARK Syntax (Part 3)*

of *Result* and *T* are the `declarative_part` of the procedure and `handled_sequence_of_statements` is the implementation body of the procedure specified in between *begin* and *end*.

```
procedure Factorial (N : in Integer; M : out Integer)
is
  Result : Integer := 1;
  T : Integer;
begin
  T := N;
  while T > 0 loop
    Result := Result * T;
    T := T - 1;
  end loop;
  M := Result;
end Factorial;
```

This is a core subset of SPARK 2014 that the other SPARK language features can also be translated and represented with this core subset. Formalization of the language semantics is discussed in detail in the following sections.

3.2 Run-Time Checks

SPARK defines a set of run-time checks to be inserted and verified during the program certification process and guarantee that for all possible execution of SPARK program, it's impossible for the checks to be violated. For the core SPARK 2014, we mainly focus on the the following widely used and highly important run-time checks as required to be enforced by SPARK reference manual.

- Overflow Check: this is a check for an operator where its operation may cause overflow or underflow, such as binary operators ($+$, $-$, $*$, $/$) and unary operator ($-$).
- Division Check: this is check for division operators, such as ($/$, mod), to indicate a zero divide check.

- Range Check: this is a check for an expression whose computed value must fall within the target type range of the context, such as the right hand side expression of an assignment with its left hand side being some variable of integer subtype, subscript expression in an indexed component, argument expressions for a procedure call and initialization value expression for an object declaration where the types of their target variables are some range constrained ones.

3.3 Formal Language Semantics

3.3.1 SPARK AST Representation

SPARK ASTs are represented using inductive type definitions in Coq, as shown in Figures 3.4 and 3.5, where each constructor of the type definitions is annotated with a unique AST number. The AST numbers are useful as keys for source location, symbol, and type tables. For example, the following inductively defines an expression:

```
Inductive expr: Type := BinOp: astnum -> binop -> expr -> expr -> expr
      | ...
```

where BinOp is the constructor for binary expression from two sub-expressions and one binary operator, labeled with a unique AST number. As an example, the following shows the Coq AST for the binary expression *Result* * *T*, where 25 is its astnum and 26 and 28 are the astnum for both sub-expressions *Result* and *T* and Multiply is a binop to denote the operator *. The BinOp is a Coq AST constructor to bind all these elements together to specify the multiplication expression and comments in Coq are enclosed between (* and *).

```
(BinOp 25 Multiply
  (Name 26 (Identifier 27 ((*Result*) 5) ))
  (Name 28 (Identifier 29 ((*T*) 6) )) )
```

For any SPARK program, all of its used names can be represented as natural numbers in Coq, including variable name, type name, procedure name and others, as long as the number is a unique representation of that name, e.g., 5 representing *Result* in the above example.

```

Definition astnum := nat.
Definition idnum := nat.
Definition procnum := nat.
Definition typenum := nat.

Inductive literal: Type :=
  | Integer_Literal: Z -> literal
  | Boolean_Literal: bool -> literal.

Inductive exp: Type :=
  | Literal: astnum -> literal -> exp
  | Name: astnum -> name -> exp
  | BinOp: astnum -> binop -> exp -> exp -> exp
  | UnOp: astnum -> unop -> exp -> exp

with name: Type :=
  | Identifier: astnum -> idnum -> name
  | IndexedComponent: astnum -> name -> exp -> name
  | SelectedComponent: astnum -> name -> idnum -> name.

Inductive stmt: Type :=
  | Null: stmt
  | Assign: astnum -> name -> exp -> stmt
  | If: astnum -> exp -> stmt -> stmt -> stmt
  | While: astnum -> exp -> stmt -> stmt
  | Call: astnum -> astnum -> procnum -> list exp -> stmt
  | Seq: astnum -> stmt -> stmt -> stmt.

Inductive type: Type :=
  | Boolean
  | Integer
  | Subtype (t: typenum)
  | Derived_Type (t: typenum)
  | Integer_Type (t: typenum)
  | Array_Type (t: typenum)
  | Record_Type (t: typenum).

```

Figure 3.4: *SPARK AST in Coq (Part 1)*

```

Inductive range: Type := Range (l: Z) (u: Z).

Inductive typeDecl: Type :=
  | SubtypeDecl:
    astnum -> typenum -> type -> range -> typeDecl
  | DerivedTypeDecl:
    astnum -> typenum -> type -> range -> typeDecl
  | IntegerTypeDecl:
    astnum -> typenum -> range -> typeDecl
  | ArrayTypeDecl:
    astnum -> typenum -> type -> type -> typeDecl
  | RecordTypeDecl:
    astnum -> typenum -> list (idnum * type ) -> typeDecl.

Record objDecl: Type := mkobjDecl{
  declaration_astnum: astnum;
  object_name: idnum;
  object_nominal_subtype: type;
  initialization_expression: option (exp) }.

Record paramSpec: Type := mkparamSpec{
  parameter_astnum: astnum;
  parameter_name: idnum;
  parameter_subtype_mark: type;
  parameter_mode: mode }.

Inductive decl: Type :=
  | NullDecl: decl
  | TypeDecl: astnum -> typeDecl -> decl
  | ObjDecl: astnum -> objDecl -> decl
  | ProcBodyDecl: astnum -> procBodyDecl -> decl
  | SeqDecl: astnum -> decl -> decl -> decl

with procBodyDecl: Type :=
  mkprocBodyDecl
  (procedure_astnum: astnum)
  (procedure_name: procnum)
  (procedure_parameter_profile: list paramSpec)
  (procedure_declarative_part: decl)
  (procedure_statements: stmt).

```

Figure 3.5: *SPARK AST in Coq (Part 2)*

To be more precise, instead of sharing the same natural number domain for all different names, we use `idnum` as natural number domain for variable names, `procnum` for procedure names, and `typenum` for type names. In other words, different types of names can share the same number but they are differentiated with respect to different semantic domains. For example, given the following SPARK program:

```

type T is range 0 .. 10;
...
procedure Increase (X : in out T) is
begin
  X := X + 1;
end Increase;

```

its Coq AST is represented as:

```

(TypeDecl 4 (IntegerTypeDecl 5 ((*T*) 1) (Range 0 10)))
...
(ProcBodyDecl 1
  (mkprocBodyDecl 2
    (* === Procedure Name === *)
    ((*Increase*) 1)
    (* === Formal Parameters === *)
    (
      (mkparamSpec 3 ((*X*) 1) Integer In_Out) :: nil)
    (* === Object Declarations === *)
    ...
    (* === Procedure Body === *)
    ...
  )
)

```

where the type name T , procedure name $Increase$ and parameter name X are all represented as number 1 , which is allowed as they appear in different semantics domains. The 1 in constructor `IntegerTypeDecl` distinguishes with the 1 in constructors `mkprocBodyDecl` and `mkparamSpec`.

Our formalized SPARK subset supports two kinds of literals, as defined as `literal` type, where `Integer.Literal` is the constructor for integer literal and `Boolean.Literal` for boolean literal.

Expressions includes literal, binary expression, unary expression, nested array and record access and so on, which is defined as `exp` and `name` types. Statement `statement` includes assignment, conditional statement, while loop and procedure call.

SPARK supports range constrained scalar (integer) types that are useful as array index types; that is, the range constraints are used to determine in-bounds/out-of-bounds array operations (instead of using a special `.length` field such as in Java). Range constrained types can be declared using either a subtype declaration (e.g., `subtype T10 is Integer range 1 .. 10`), a derived type definition (e.g., `type U10 is new Integer range 1 .. 10`), or an integer type definition (e.g., `type W10 is range 1 .. 10`); they semantically differ in that the last two introduce a new type, while the first one does not; the differences have to be taken into account in the formalization. This illustrates the non-trivial number of language features that one has to cover when formalizing a real programming language that can be directly leveraged for developing high-integrity industrial tools. In Coq, these range constrained types can be defined with `type_declaration`, for example, `Subtype_Declaration` is the constructor for subtype declaration, where `typenum` is the declared subtype name, `type` is its parent type name, `range` specifies the range of the declared subtype. `Array_Type_Declaration` is the constructor for declaring new array type, where `typenum` is the declared array type name, the first `type` denotes array index subtype mark and the second `type` denotes array component type; `Record_Type_Declaration` is the constructor for declaring new record type, where `typenum` is the declared record type name and `list (idnum * type)` defines a list of record fields.

Besides the declaration of new types, user can define new objects, such as declaration of variables, and it even supports the declaration of nested procedures to enable new procedure to be defined and used within the scope of the enclosing procedure. `Type_declaration` is defined for such purpose with support for declaration of various types, objects and procedures.

3.3.2 State/Value

Due to the run-time checks, evaluating either an expression or a statement may produce an error state when the run-time check fails (otherwise a value or a state is produced, respectively), which is captured using the following generic inductive type:

```
Inductive Ret (A: Type): Type := OK: A          -> Ret A
      | RTE: errorType -> Ret A.
```

Type parameter A is either the value/state type, and `errorType` is the run-time error state type (e.g., division by zero, overflow, out of range), which are defined as following:

```
Inductive value: Type :=
  | Undefined
  | Int (n : Z)
  | Bool (n : bool)
  | ArrayV (a : list (arrindex * value))
  | RecordV (r : list (idnum * value)).
```

The value of an uninitialized variable is labeled as `Undefined`. `ArrayV` represents the array object and `RecordV` represents record object.

```
Definition store : Type := list (idnum * value).
```

```
Definition state := list store.
```

The `state` is a stack of frames, which is represented as a list of `store` to capture the mapping from variable `id` to value.

```
Inductive errorType: Type :=
  | Division_By_Zero
  | Overflow
  | Out_Of_Range.
```

The `errorType` represents the three categories of run-time errors to be modeled in the SPARK language semantics.

3.3.3 Expression Semantics

The expression operational semantics are defined by the inductive types given below. They are complicated by the fact that sub-expression evaluation can produce an error state. In

Coq, inductive types are used for mathematical constructions of a collection of objects. Here, we apply the inductive types for constructing evaluation rules for expressions (or programs), which inductively defines the computation relationships between the resulting values (or states) and the expression (or program) to be evaluated under certain states.

```

Inductive evalExp: symTable -> state -> expr -> Ret value -> Prop :=
  EvalBinOpE1.RTE: forall st s e1 msg n op e2,
    evalExp st s e1 (RTE msg) ->
      evalExp st s (BinOp n op e1 e2) (RTE msg)
| EvalBinOpE2.RTE: forall st s e1 v1 e2 msg n op,
    evalExp st s e1 (OK v1) -> evalExp st s e2 (RTE msg) ->
      evalExp st s (BinOp n op e1 e2) (RTE msg)
| EvalBinOp: forall st s e1 v1 e2 v2 op v n,
    evalExp st s e1 (OK v1) -> evalExp st s e2 (OK v2) -> evalBinOp op v1 v2 v ->
      evalExp st s (BinOp n op e1 e2) v
...

Inductive evalBinOp: BinOp -> value -> value -> Ret value -> Prop :=
  CheckBinops: forall op v1 v2 v v',
    op = Add \/ op = Sub \/ op = Mul ->
      Denotational.binOp op v1 v2 = Some (Int v) -> overflowCheck v v' ->
        evalBinOp op v1 v2 v'
| CheckDivRTE: forall v1 v2,
    divCheck v1 v2 (RTE Division.By_Zero) ->
      evalBinOp Div (Int v1) (Int v2) (RTE Division.By_Zero)
| CheckDiv: forall v1 v2 v v',
    divCheck v1 v2 (OK (Int v)) -> overflowCheck v v' ->
      evalBinOp Div (Int v1) (Int v2) v'
...

```

EvalBinOpE1.RTE specifies the evaluation of a binary expression ($e_1 \text{ op } e_2$) where the evaluation of e_1 produces an error state (similarly, EvalBinOpE2.RTE for when e_2 fails). EvalBinOp specifies the situation where evaluations of both e_1 and e_2 produce operand values, which are then evaluated using evalBinOp; evalBinOp incorporates various run-time checks such as division by zero and overflow checks by using divCheck and overflowCheck; divCheck produces a value if the second operand is non-zero (otherwise, it produces the error state RTE Division.By_Zero), and overflowCheck produces a value if the given value fits within the (platform) integer type value

range (otherwise, it produces `RTE Overflow`). Run-time checks for other language features such as array indexing are specified in the same spirit as the above, but in some cases, it requires to enforce more language specific run-time checks, such as range check for array indexing. The following is the formalization of name evaluation for both accessing array component and record field.

```

Inductive evalName: symTable -> state -> name -> Ret value -> Prop :=
| EvalIndexedComponentX_RTE: forall st s x msg ast_num e,
  evalName st s x (RTE msg) ->
  evalName st s (Indexed.Component ast_num x e) (RTE msg)
| EvalIndexedComponentE_RTE: forall st s x a e msg ast_num,
  evalName st s x (Ok (ArrayV a)) ->
  evalExp st s e (RTE msg) ->
  evalName st s (Indexed.Component ast_num x e) (RTE msg)
| EvalIndexedComponent_RTE: forall st s x a e i t l u ast_num,
  evalName st s x (Ok (ArrayV a)) -> valExp st s e (Ok (Int i)) ->
  fetch_exp_type (name_astnum x) st = Some (Array_Type t) ->
  extract_array_index_range st t (Range l u) ->
  rangeCheck i l u (RTE Out_Of_Range) ->
  evalName st s (Indexed.Component ast_num x e) (RTE Out_Of_Range)
| EvalIndexedComponent: forall st s x a e i t l u v ast_num,
  evalName st s x (Ok (ArrayV a)) -> evalExp st s e (Ok (Int i)) ->
  fetch_exp_type (name_astnum x) st = Some (Array_Type t) ->
  extract_array_index_range st t (Range l u) ->
  rangeCheck i l u (Ok (Int i)) ->
  array_select a i = Some v ->
  evalName st s (Indexed.Component ast_num x e) (Ok v)
| EvalSelectedComponentX_RTE: forall st s x msg ast_num f,
  evalName st s x (RTE msg) ->
  evalName st s (Selected.Component ast_num x f) (RTE msg)
| EvalSelectedComponent: forall st s x r f v ast_num,
  evalName st s x (Ok (RecordV r)) ->
  record_select r f = Some v ->
  evalName st s (Selected.Component ast_num x f) (Ok v)
...

```

`EvalIndexedComponentX_RTE` specifies the evaluation of an array component accessing $(x(e))$ where the evaluation of the array x produces an error state, and `EvalIndexedComponentE_RTE` for the

case when the evaluation for indexing expression e fails. In the evaluation for array indexed component, an additional range check is required to be performed according to the index type of the array, which is fetched from a preconstructed symbol table. `EvalIndexedComponent_RTE` is the evaluation rule for the case when the value of e falls out of the range of array indexing type t and throws out an `Out.Of.Range` error, while `EvalIndexedComponent` specifies the run-time error free evaluation of array indexing. The evaluation of record field accessing ($r.f$) is similar, it returns with a run-time error whenever the evaluation of record r fails, as specified with `EvalSelectedComponentX_RTE`, otherwise, returns the value of the specified record field with `EvalSelectedComponent`.

3.3.4 Statement Semantics

For the semantics of statement, range checks are enforced during statement executions of, for example, assignments and procedure calls. We describe the intuition behind statement semantic rules using examples before giving their formal semantics in Coq.

For an assignment, range check is enforced for its right hand side expression if the left hand side expression's type is a range constrained type. For example,

```

subtype MyInt is Integer range 1 .. 10;
X: MyInt;
...;
X := X + 1;

```

That is, x is a variable of type `MyInt`, which is defined as a subtype of `Integer` ranging from 1 to 10. The assignment increments x by 1, as follows. First, $x + 1$ is evaluated; if it returns a value (instead of an error state), the value is checked against the range of `MyInt` before updating x .

For a procedure call, range checks are required for both input arguments and output parameters if the types of input parameters and output arguments are range constrained types because input arguments are assigned to the procedure input parameters, and output arguments are assigned to the output parameters. For example,

```

procedure foo(U: In MyInt, V: Out Integer) is
begin
  V := U + 1;
end foo;
X: Integer;
Y: MyInt;
...;
foo(X, Y);

```

The procedure `foo` has one input parameter `u` and one output parameter `v`. When `foo(X, Y)` is executed, the value of `x` (whose type is the general `Integer` type) is checked against `MyInt`'s range first. Similarly, a range check is enforced when assigning the value of `v` to `Y` once `foo` finishes executing.

The formal semantics for statement is defined as following:

```

Inductive evalStmt: symTable -> state -> statement -> Ret state -> Prop :=
| EvalAssignE_RTE: forall st s e msg ast_num x,
  evalExp st s e (RTE msg) ->
    evalStmt st s (Assign ast_num x e) (RTE msg)
| EvalAssign: forall st s e v x t s1 ast_num,
  evalExp st s e (Ok v) ->
    fetch_exp_type (name_astnum x) st = Some t ->
    is_range_constrained_type t = false ->
    storeUpdate st s x v s1 ->
    evalStmt st s (Assign ast_num x e) s1
| EvalAssignRange_RTE: forall st s e v x t l u ast_num,
  evalExp st s e (Ok (Int v)) ->
    fetch_exp_type (name_astnum x) st = Some t ->
    extract_subtype_range st t (Range l u) ->
    rangeCheck v l u (RTE Out_Of_Range) ->
    evalStmt st s (Assign ast_num x e) (RTE Out_Of_Range)
| EvalAssignmentRange: forall st s e v x t l u s1 ast_num,
  evalExp st s e (Ok (Int v)) ->
    fetch_exp_type (name_astnum x) st = Some t ->
    extract_subtype_range st t (Range l u) ->
    rangeCheck v l u (Ok (Int v)) ->
    storeUpdate st s x (Int v) s1 ->
    evalStmt st s (Assign ast_num x e) s1
...

```

The inductive type `evalStmt` specifies the evaluation semantics for statement that translates an initial state from one normal state to another normal or run-time error state. `EvalAssignE_RTE` is the evaluation rule for assignment (`Assign ast_num x e`) when the evaluation of the right hand side expression `e` gets into run-time error state, which is propagated as the final state of assignment evaluation. `EvalAssign` gives the evaluation semantics for a normal assignment to a non-range-constrained variable by first evaluating the value of `e` and then using it to update the state of `x` with `storeUpdate` operation, where `fetch_exp_type` returns the type of `x` and `is_range_constrained_type` is a function to check whether it's a range constrained type. `EvalAssignRange_RTE` defines the evaluation semantics for assignment to range-constrained variable and it returns an `Out_Of_Range` error when the value of the right hand side expression `e` goes beyond the allowed value range of the left hand side name `x`, while `EvalAssignmentRange` is for the case when both the evaluation of `e` and the range check of its value against type of `x` are all `Ok`. `storeUpdate` is used to update the value of a name, which can be either a variable, array indexed component or record selected component, with its formal semantics defined as the following:

```

Inductive storeUpdate: symTable -> state -> name -> value -> Ret state -> Prop
:= | SU_Identifier: forall s x v s1 st ast_num,
    update s x v = Some s1 ->
    storeUpdate st s (Identifier ast_num x) v (Ok s1)
| SU_IndexedComponentX_RTE: forall st s x msg ast_num e v,
    evalName st s x (RTE msg) ->
    storeUpdate st s (Indexed_Component ast_num x e) v (RTE msg)
| SU_IndexedComponentE_RTE: forall st s x a e msg ast_num v,
    evalName st s x (Ok (ArrayV a)) \ / evalName st s x (Ok Undefined) ->
    eval_expr st s e (RTE msg) ->
    storeUpdate st s (Indexed_Component ast_num x e) v (RTE msg)
| SU_IndexedComponent_RTE: forall st s x a e i t l u ast_num v,
    evalName st s x (Ok (ArrayV a)) \ / evalName st s x (Ok Undefined) ->
    eval_expr st s e (Ok (Int i)) ->
    fetch_exp_type (name_astnum x) st = Some (Array_Type t) ->
    extract_array_index_range st t (Range l u) ->
    do_range_check i l u (RTE Out_Of_Range) ->
    storeUpdate st s (Indexed_Component ast_num x e) v (RTE Out_Of_Range)

```

```

| SU_IndexedComponent: forall st s x arrObj a e i t l u v a1 s1 ast_num,
  evalName st s x (Ok arrObj) ->
  arrObj = (ArrayV a) \ / arrObj = Undefined ->
  eval_expr st s e (Ok (Int i)) ->
  fetch_exp_type (name_astnum x) st = Some (Array.Type t) ->
  extract_array_index_range st t (Range l u) ->
  do_range_check i l u (Ok (Int i)) ->
  arrayUpdate arrObj i v = (Some (ArrayV a1)) ->
  storeUpdate st s x (ArrayV a1) s1 ->
  storeUpdate st s (Indexed.Component ast_num x e) v s1
...

```

`SU_Identifier` is a rule for state update of a variable x in state s with some value v , which results in a new state $s1$. The state update to an array indexed component (`Indexed.Component ast num x e`) by some new value v is a little complex. The `storeUpdate` terminates in an error state whenever the evaluation of x , or the evaluation of e , or the range check of the indexing expression get into an error state, as specified by `SU_IndexedComponentX_RTE`, `SU_IndexedComponentE_RTE` and `SU_IndexedComponent_RTE` separately. `SU_IndexedComponent` updates the state of x with new value v when it passes all kinds of required run-time checks for its subexpressions. The `storeUpdate` for nested array and record is defined recursively. For example, if x is a field of a record r and it's a variable of array, to update the value of $r.x(1)$ with value v , first, 1) we have to read the array value of x from the record r , then update it with the value v , then, 2) read the record value of r , and update it with new array value for its field x , and finally, 3) write back the updated record value to the store for r .

3.3.5 Declaration Semantics

For an object declaration, range check is required for the value of its initialization expression if its declared type is a range constrained type. Other declarations, such as type declaration and procedure declaration, should have no effect on program execution state.

3.3.6 Evaluation

The main evaluation mechanism that we used to assess the integrity of the mechanized semantics was through manual inspection by various experts including SPARK/Ada designers/developers. Moreover, we have proved that the SPARK formal semantics enjoys a form of type safety (Section 4.3), which guarantees, to some extent, its internal consistency. Furthermore, we double checked the semantics against the SPARK⁴⁶ and Ada³⁸ reference manuals, as well as against the GNAT compiler by probing it on some test programs and experiments (Section 4.4).

Chapter 4

Run-Time Check Certification

4.1 Architecture

Figure 4.1 gives an architectural overview of our approach; the subsequent sections will describe each of the components.

4.2 Certified Run-Time Check Generator

Given a SPARK program, the GNAT compiler front-end builds the program fully-resolved (symbol/type) AST decorated with flags that indicate the position and nature of the run-time checks to be performed. When down-stream tools process the ASTs, they interpret or transform the decorations. For example, a later phase of the GNAT compiler replaces each decoration with an assertion AST representing code that implements the corresponding run-time check. In contrast, the Why3⁴⁷-based GNATprove verification tool uses the decorations to generate verification conditions. Both tools assume that the run-time check decorations inserted by the GNAT compiler front-end are correct.

To formally capture the notion of decorating ASTs with run-time check information, we implemented in Coq a run-time check decoration generator (RT-GEN in Figure 4.1) whose

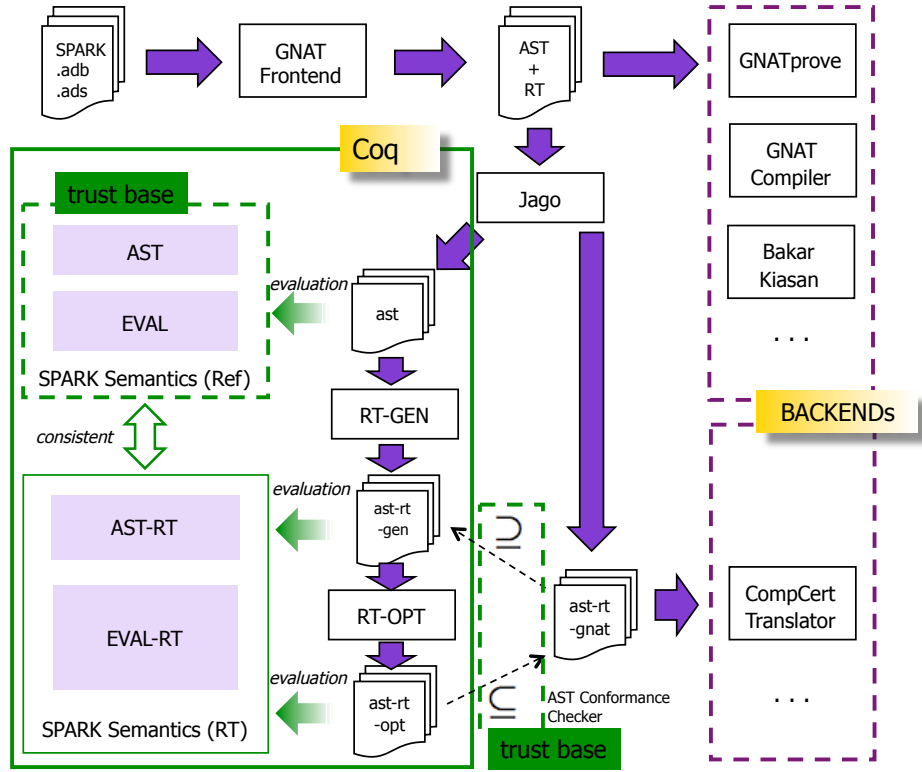


Figure 4.1: Architectural Overview

consistency with the mechanized SPARK reference semantics was established via a Coq proof. Hence, the correctness of RT-GEN is *certified*. To achieve this, a different set of operational semantic rules is needed (called EVAL-RT) – one that “evaluates” an AST with run-time check decorations and only enforces the checking semantics where a decoration occurs. Then, one can prove that, for any program and for any program initial state, EVAL-RT supplied with run-time check decorations generated by RT-GEN produces *exactly the same state* as EVAL (*i.e.*, the SPARK reference semantics).

There are many ways one can engineer EVAL-RT and RT-GEN. One way is to create EVAL-RT by modifying EVAL to accept a table that maps astnum to a collection of run-time checks and then have RT-GEN generate such a table. Another way is to define a new AST type (AST-RT) that explicitly holds run-time decorations as attributes, and RT-GEN transforms EVAL’s AST to AST-RT. We developed both; perhaps surprisingly, the consistency proof is

shorter in the latter case (the former is more general/extensible, hence, more complex). Thus, for simplicity, we present the latter here.

EVAL-RT: is a modified EVAL that accepts AST-RT where run-time check decorations are represented as tree attributes. For example, AST-RT expression is defined as follows.

Inductive expRT: **Type** :=

```
| BinOpRT: astnum → binOp → expRT → expRT →
      interiorChecks → exteriorChecks → expRT
| ...
```

The difference from AST is that two additional fields interiorChecks and exteriorChecks are introduced; interiorChecks are intended for run-time checks associated with the binary operator (e.g., addition requires overflowCheck), while exteriorChecks are checks associated with expression's context (e.g., if the expression is used for array indexing, then it should be range-checked against the array size). Once AST-RT is defined, one can then define EVAL-RT that accepts AST-RT and enforces the explicitly listed run-time checks (e.g., in interiorChecks and exteriorChecks), as illustrated below.

Inductive evalExpRT:

```
symTabRT → state → expRT → Ret value → Prop :=

(* rule: no error from e1 & e2 evaluations *)
| EvalBinOpRT: ∀ st s e1 v1 e2 v2 ins op v n exs ,
  (* evaluate args *)
  evalExpRT st s e1 (OK v1) →
  evalExpRT st s e2 (OK v2) →
  (* process RT checks *)
  evalBinOpRTS ins op v1 v2 v →
  evalExpRT st s (BinOpRT n op e1 e2 ins exs) v
...

```

Inductive evalBinOpRTS: checkFlags → binOp →
value → value → Ret value → **Prop** :=

(rule: done with checks, perform op *)*

| CheckBinOpNil: ∀ op v1 v2 v,
Denotational.binOp op v1 v2 = Some v →
evalBinOpRTS nil op v1 v2 (OK v)

(rule: performing next check returns error *)*

| ChecksBinOpRTE: ∀ ck op v1 v2 msg cks,
evalBinOpRT ck op v1 v2 (RTE msg) →
evalBinOpRTS (ck :: cks) op v1 v2 (RTE msg)

(rule: performing next check returns OK,
continue iteration over checks *)*

| ChecksBinOp: ∀ ck op v1 v2 v cks v',
evalBinOpRT ck op v1 v2 (OK v) →
evalBinOpRTS cks op v1 v2 v' →
evalBinOpRTS (ck :: cks) op v1 v2 v'.

EvalBinOpRT specifies how a binary expression's interiorChecks are enforced through evalBinOpRTS, that iterates over the run-time check decorations (CheckBinop). If none of the run-time checks produces an error state, the binary operation is then performed (CheckBinOpNil) using evalBinOpRT (which is defined similarly to evalBinOp in Section 3.3); otherwise, it returns the error state (CheckBinopRTE). (Note that enforcement of exteriorChecks is not presented above as it involves arrays, which is not presented due to space constraint.)

RT-GEN: translates AST to AST-RT. In developing RT-GEN, we first specified its behavior declaratively as a Coq inductively defined relation (e.g., toExpRT below) between AST to AST-RT (with the symbol table as an auxiliary component). Then, we implemented the

translation as a Coq function (e.g., `toExpRTImpl`).

Inductive `toExpRT`: `symTab` \rightarrow `exp` \rightarrow `expRT` \rightarrow `Prop` :=

```

  (* insert checks for overflow on op result *)
| ToBinOpO:  $\forall$  st op e1 e1RT e2 e2RT n,
  op = Add  $\vee$  op = Sub  $\vee$  op = Mul  $\rightarrow$ 
  toExpRT st e1 e1RT  $\rightarrow$  toExpRT st e2 e2RT  $\rightarrow$ 
  toExpRT st (BinOp n op e1 e2)
  (BinOpRT n op e1RT e2RT [OverflowCheck] nil)

```

```

  (* for Div, insert checks div by 0 and
     overflow on op result *)
| ToBinOpDO:  $\forall$  st op e1 e1RT e2 e2RT n,
  op = Div  $\rightarrow$  toExpRT st e1 e1RT  $\rightarrow$ 
  toExpRT st e2 e2RT  $\rightarrow$ 
  toExpRT
  st
  (BinOp n op e1 e2)
  (BinOpRT n op e1RT e2RT
   [DivCheck, OverflowCheck] nil)

```

...

Function `toExpRTImpl`(`st`:`symTab`)(`e`:`exp`): `expRT` :=...

As can be observed, `ToBinOpO` specifies that RT-GEN should generate (interior) `OverflowCheck` for addition, substraction, or multiplication, and both `DivCheck` and `OverflowCheck` for division; `toExpRT` is implemented by `toExpRTImpl` using Coq's programming language features (like ML's) which is extractable to OCaml to produce an executable.

Evaluation: To certify RT-GEN, we proved that its specification is consistent (*sound* and

complete) with respect to the SPARK mechanized semantics. For example, for expressions, we proved the following consistency lemma:

Lemma `toExpRTConsistent`: $\forall e \text{ eRT } st \text{ stRT } s \ v,$
 $\text{toExpRT } st \ e \ \text{eRT} \rightarrow \text{toSymTabRT } st \ \text{stRT} \rightarrow$
 $(\text{evalExpRT } stRT \ s \ \text{eRT } \ v \leftrightarrow \text{evalExp } st \ s \ e \ v).$

where `toSymTabRT` transforms `symTab` to `symTabRT`, which, among other things, maps procedure names to their AST-RT. We then proved that the RT-GEN implementation is consistent with respect to its specification, for example:

Lemma `toExpRTImplConsistent`: $\forall e \text{ eRT } stRT,$
 $\text{toExpRTImpl } stRT \ e = \text{eRT} \leftrightarrow \text{toExpRT } stRT \ e \ \text{eRT}.$

Therefore, the implementation is transitively consistent with respect to the SPARK semantics (by transitivity of implication $\rightarrow / \leftrightarrow$).

Lemma `RTGenConsistent`: $\forall p \text{ pRT } st \ \text{stRT } s \ s',$
 $\text{RTGen } st \ p \ \text{pRT} \rightarrow \text{toSymTabRT } st \ \text{stRT} \rightarrow$
 $(\text{EvalRT } stRT \ s \ \text{pRT } \ s' \leftrightarrow \text{Eval } st \ s \ p \ s').$

Lemma `RTOptConsistent`: $\forall pRT \ \text{pRTOpt } stRT \ s \ s',$
 $\text{RTOpt } stRT \ pRT \ \text{pRTOpt} \rightarrow$
 $(\text{EvalRT } stRT \ s \ pRT \ s' \leftrightarrow \text{EvalRT } stRT \ s \ \text{pRTOpt } s').$

$\{\tau \leq \tau'\}$
 $\{SECRET \leq SECRET, PUBLIC \leq PUBLIC\}$
 $\{SECRET \leq \tau, \tau' \leq PUBLIC, \tau \leq \tau'\}$
 $\{SECRET \leq SECRET, PUBLIC \leq PUBLIC,$
 $SECRET \leq \tau, \tau' \leq PUBLIC, \tau \leq \tau'\}$
 $\{SECRET \leq SECRET, PUBLIC \leq PUBLIC,$
 $SECRET \leq \tau, \tau' \leq PUBLIC, \tau \leq \tau',$
 $SECRET \leq PUBLIC\}$

4.3 Certified Run-Time Check Optimizer

While RT-GEN generates a sufficient set of run-time checks, some of them may not be necessary. In fact, the GNAT front-end uses optimization techniques to reduce the set of run-time checks that it generates; in practice, we expect the set generated by GNAT to be a subset of the RT-GEN generated set (we confirmed through experiments that this is indeed the case in Section 4.4). The question is then whether GNAT’s optimizations are (certifiably) sound. Our approach to answer this is to have a certified optimizer – RT-OPT, that reduces the run-time checks generated by RT-GEN. Now, it is widely known that, in general, an optimizer cannot actually ever be optimal (due to the halting problem). Thus, the best we can hope for is to have RT-OPT reduce to the same (or even better, i.e., smaller) set as GNAT’s (a smaller set implies that GNAT can be improved further).

RT-OPT: transforms AST-RT to another AST-RT by removing some run-time checks whose corresponding verification conditions (VCs) can be discharged; it discharges the VCs by employing abstract interpretation⁴⁸ with interval numeric domain. Similar to RT-GEN, we first specified RT-OPT as Coq inductively defined relation and then implemented it as a Coq function. For expressions, RT-OPT produces AST-RT along with the expression’s interval domain (if any) as follows:

```
Inductive optExp: symTabRT →
    expRT → (expRT * interval) → Prop := ...

Function optExpImpl(st:symTabRT)
    (e:expRT): option(expRT * interval) := ...
```

where `optExp` is typeset in Figure 4.3 for readability. One invariant of RT-OPT is that integer expression optimization should produce an interval that fits within the compilation target platform-specific two’s complement integer range, which makes up the default interval $[INT_{MIN}, INT_{MAX}]$. Γ holds the abstract interpretation context such as symbol table, etc. For notational convenience, `interiorChecks` and `exteriorChecks` are not explicitly shown;

$$\begin{aligned}
\text{divInterval}(v_1, w_1, v_2, w_2) &= \begin{cases} [w_1/v_2, \min(v_1/w_2, INT_{MAX})], & \text{if } w_2 < 0 \wedge w_1 < 0 & (4.1) \\ [w_1/w_2, v_1/v_2], & \text{if } w_2 < 0 \wedge v_1 > 0 & (4.2) \\ [w_1/w_2, \min(v_1/w_2, INT_{MAX})], & \text{if } w_2 < 0 \wedge \neg(w_1 < 0 \vee v_1 > 0) & (4.3) \\ [v_1/v_2, w_1/w_2], & \text{if } v_2 > 0 \wedge w_1 < 0 & (4.4) \\ [v_1/w_2, w_1/v_2], & \text{if } v_2 > 0 \wedge v_1 > 0 & (4.5) \\ [v_1/v_2, w_1/v_2], & \text{if } v_2 > 0 \wedge \neg(w_1 < 0 \vee v_1 > 0) & (4.6) \\ [v_1, \min(|v_1|, INT_{MAX})], & \text{if } \neg(w_2 < 0 \vee v_2 > 0) \wedge w_1 < 0 & (4.7) \\ [-w_1, w_1], & \text{if } \neg(w_2 < 0 \vee v_2 > 0) \wedge v_1 > 0 & (4.8) \\ [-\max(|v_1|, |w_1|), \min(\max(|v_1|, |w_1|), INT_{MAX})], & \text{otherwise} & (4.9) \end{cases} \\
\text{modInterval}(v_1, w_1, v_2, w_2) &= \begin{cases} [v_2 + 1, 0], & \text{if } w_2 < 0 & (4.10) \\ [0, w_2 - 1], & \text{if } v_2 > 0 & (4.11) \\ [if\ v_2 = 0\ then\ 0\ else\ v_2 + 1, if\ w_2 = 0\ then\ 0\ else\ w_2 - 1], & \text{otherwise} & (4.12) \end{cases}
\end{aligned}$$

Figure 4.2: Interval Bounds For Divide and Modulus

EraseOverflowCheck and *EraseDivCheck* remove overflow and division interiorChecks, respectively, while *EraseRangeCheck* removes range exteriorChecks.

The `INT1` rule in Figure 4.3 optimizes away the overflow check in the case of an integer literal AST-RT n where n is within the the platform’s integer range; a single-value interval $[n, n]$ is returned along with the optimized AST-RT (i.e., the tight single-value interval allows for concrete interpretation). On the other hand, `INT2` specifies the case where the overflow check is kept whenever n is outside the range, thus, the default interval is returned (in this case, an error message can be generated to notify the developer). `ADD1` and `ADD2` first try to optimize the two operands and compute the expression interval bounds (i.e., $[u, v]$). `ADD1` specifies the case where the bounds are within the platform’s integer range, hence, the overflow check associated the binary operation can be safely removed; otherwise, `ADD2` specifies that run-time checks are preserved, and the resulting interval is the platform’s integer range. Similarly, for subtract and multiply operations, `SUB1` and `SUB2` specify the two cases for run-time checks optimization for subtract expressions, and `MUL1` and `MUL2` for optimizations of multiplication expressions. In `MUL1` and `MUL2`, $\min(\min(v1 * v2, v1 * w2), \min(w1 * v2, w1 * w2))$ and $\max(\max(v1 * v2, v1 * w2), \max(w1 * v2, w1 * w2))$ compute the lower and upper bound for multiplication of two values within intervals $[v1, w1]$ and $[v2, w2]$ respectively, which has been proved correct with Coq.

$$\begin{array}{c}
\frac{n \in [INT_{MIN}, INT_{MAX}]}{\Gamma \vdash \mathit{optExp}(n) = (\mathit{EraseOverflowCheck}(n), [n, n])} \text{INT1} \qquad \frac{n \notin [INT_{MIN}, INT_{MAX}]}{\Gamma \vdash \mathit{optExp}(n) = (n, [INT_{MIN}, INT_{MAX}])} \text{INT2} \\
\frac{\Gamma \vdash \mathit{optExp}(e_1) = (e'_1, [v_1, w_1]) \quad \Gamma \vdash \mathit{optExp}(e_2) = (e'_2, [v_2, w_2]) \quad v = v_1 + v_2 \quad w = w_1 + w_2 \quad \{v, w\} \subseteq [INT_{MIN}, INT_{MAX}]}{\Gamma \vdash \mathit{optExp}(e_1 + e_2) = (\mathit{EraseOverflowCheck}(e'_1 + e'_2), [v, w])} \text{ADD1} \\
\frac{\Gamma \vdash \mathit{optExp}(e_1) = (e'_1, [v_1, w_1]) \quad \Gamma \vdash \mathit{optExp}(e_2) = (e'_2, [v_2, w_2]) \quad v = v_1 + v_2 \quad w = w_1 + w_2 \quad \{v, w\} \not\subseteq [INT_{MIN}, INT_{MAX}]}{\Gamma \vdash \mathit{optExp}(e_1 + e_2) = (e'_1 + e'_2, [\max(v, INT_{MIN}), \min(w, INT_{MAX})])} \text{ADD2} \\
\frac{\Gamma \vdash \mathit{optExp}(e_1) = (e'_1, [v_1, w_1]) \quad \Gamma \vdash \mathit{optExp}(e_2) = (e'_2, [v_2, w_2]) \quad v = v_1 - v_2 \quad w = w_1 - v_2 \quad \{v, w\} \subseteq [INT_{MIN}, INT_{MAX}]}{\Gamma \vdash \mathit{optExp}(e_1 - e_2) = (\mathit{EraseOverflowCheck}(e'_1 - e'_2), [v, w])} \text{SUB1} \\
\frac{\Gamma \vdash \mathit{optExp}(e_1) = (e'_1, [v_1, w_1]) \quad \Gamma \vdash \mathit{optExp}(e_2) = (e'_2, [v_2, w_2]) \quad v = v_1 - v_2 \quad w = w_1 - v_2 \quad \{v, w\} \not\subseteq [INT_{MIN}, INT_{MAX}]}{\Gamma \vdash \mathit{optExp}(e_1 - e_2) = (e'_1 - e'_2, [\max(v, INT_{MIN}), \min(w, INT_{MAX})])} \text{SUB2} \\
\frac{\Gamma \vdash \mathit{optExp}(e_1) = (e'_1, [v_1, w_1]) \quad \Gamma \vdash \mathit{optExp}(e_2) = (e'_2, [v_2, w_2]) \quad \{v, w\} \subseteq [INT_{MIN}, INT_{MAX}]}{v = \min(\min(v_1 * v_2, v_1 * w_2), \min(w_1 * v_2, w_1 * w_2)) \quad w = \max(\max(v_1 * v_2, v_1 * w_2), \max(w_1 * v_2, w_1 * w_2))} \text{MUL1} \\
\frac{\Gamma \vdash \mathit{optExp}(e_1 * e_2) = (\mathit{EraseOverflowCheck}(e'_1 * e'_2), [v, w])}{\Gamma \vdash \mathit{optExp}(e_1 * e_2) = (e'_1 * e'_2, [\max(v, INT_{MIN}), \min(w, INT_{MAX})])} \text{MUL2} \\
\frac{\Gamma \vdash \mathit{optExp}(e_1) = (e'_1, [v_1, w_1]) \quad \Gamma \vdash \mathit{optExp}(e_2) = (e'_2, [v_2, w_2]) \quad \{v, w\} \not\subseteq [INT_{MIN}, INT_{MAX}]}{v = \min(\min(v_1 * v_2, v_1 * w_2), \min(w_1 * v_2, w_1 * w_2)) \quad w = \max(\max(v_1 * v_2, v_1 * w_2), \max(w_1 * v_2, w_1 * w_2))} \text{MUL2} \\
\frac{\Gamma \vdash \mathit{optExp}(e_1) = (e'_1, [v_1, w_1]) \quad \Gamma \vdash \mathit{optExp}(e_2) = (e'_2, [v_2, w_2]) \quad 0 \notin [v_2, w_2] \quad INT_{MIN} \notin [v_1, w_1] \vee -1 \notin [v_2, w_2]}{\Gamma \vdash \mathit{optExp}(e_1 / e_2) = (\mathit{EraseOverflowCheck}(\mathit{EraseDivCheck}(e'_1 / e'_2)), \mathit{divInterval}(v_1, w_1, v_2, w_2))} \text{DIV1} \\
\frac{\Gamma \vdash \mathit{optExp}(e_1) = (e'_1, [v_1, w_1]) \quad \Gamma \vdash \mathit{optExp}(e_2) = (e'_2, [v_2, w_2]) \quad 0 \notin [v_2, w_2] \quad INT_{MIN} \in [v_1, w_1] \wedge -1 \in [v_2, w_2]}{\Gamma \vdash \mathit{optExp}(e_1 / e_2) = (\mathit{EraseDivCheck}(e'_1 / e'_2), \mathit{divInterval}(v_1, w_1, v_2, w_2))} \text{DIV2} \\
\frac{\Gamma \vdash \mathit{optExp}(e_1) = (e'_1, [v_1, w_1]) \quad \Gamma \vdash \mathit{optExp}(e_2) = (e'_2, [v_2, w_2]) \quad 0 \in [v_2, w_2] \quad INT_{MIN} \notin [v_1, w_1] \vee -1 \notin [v_2, w_2]}{\Gamma \vdash \mathit{optExp}(e_1 / e_2) = (\mathit{EraseOverflowCheck}(e'_1 / e'_2), \mathit{divInterval}(v_1, w_1, v_2, w_2))} \text{DIV3} \\
\frac{\Gamma \vdash \mathit{optExp}(e_1) = (e'_1, [v_1, w_1]) \quad \Gamma \vdash \mathit{optExp}(e_2) = (e'_2, [v_2, w_2]) \quad 0 \in [v_2, w_2] \quad INT_{MIN} \in [v_1, w_1] \wedge -1 \in [v_2, w_2]}{\Gamma \vdash \mathit{optExp}(e_1 / e_2) = (e'_1 / e'_2, \mathit{divInterval}(v_1, w_1, v_2, w_2))} \text{DIV4} \\
\frac{\Gamma \vdash \mathit{optExp}(e_1) = (e'_1, [v_1, w_1]) \quad \Gamma \vdash \mathit{optExp}(e_2) = (e'_2, [v_2, w_2]) \quad 0 \notin [v_2, w_2]}{\Gamma \vdash \mathit{optExp}(e_1 \% e_2) = (\mathit{EraseDivCheck}(e'_1 \% e'_2), \mathit{modInterval}(v_1, w_1, v_2, w_2))} \text{MOD1} \\
\frac{\Gamma \vdash \mathit{optExp}(e_1) = (e'_1, [v_1, w_1]) \quad \Gamma \vdash \mathit{optExp}(e_2) = (e'_2, [v_2, w_2]) \quad 0 \in [v_2, w_2]}{\Gamma \vdash \mathit{optExp}(e_1 \% e_2) = (e'_1 \% e'_2, \mathit{modInterval}(v_1, w_1, v_2, w_2))} \text{MOD2} \\
\frac{\Gamma \vdash \mathit{optExp}(e) = (e', [v, w]) \quad \{-w, -v\} \subseteq [INT_{MIN}, INT_{MAX}]}{\Gamma \vdash \mathit{optExp}(-e) = (\mathit{EraseOverflowCheck}(-e'), [-w, -v])} \text{NEG1} \\
\frac{\Gamma \vdash \mathit{optExp}(e) = (e', [v, w]) \quad \{-w, -v\} \not\subseteq [INT_{MIN}, INT_{MAX}]}{\Gamma \vdash \mathit{optExp}(-e) = (-e', [\max(-w, INT_{MIN}), \min(-v, INT_{MAX})])} \text{NEG2} \\
\frac{\Gamma(x) = \tau_{INT} \quad \llbracket \tau_{INT} \rrbracket = [\tau_{MIN}, \tau_{MAX}]}{\Gamma \vdash \mathit{optExp}(x) = (x, [\max(\tau_{MIN}, INT_{MIN}), \min(\tau_{MAX}, INT_{MAX})])} \text{VARINT}
\end{array}$$

Figure 4.3: RT-OPT Specification for Expression (excerpts)

$$\begin{array}{c}
\frac{\Gamma \vdash \text{optName}(a)=(a', \text{Aggregate}) \quad \Gamma \vdash \text{optExp}(e)=(e', [v_1, w_1])}{\Gamma \vdash \text{arrayIndexTypeRange}(a)=[l, u] \quad \Gamma \vdash \text{arrayComponentTypeBound}(a)=\text{componentBound} \quad \{v_1, w_1\} \subseteq [l, u]}{\Gamma \vdash \text{optName}(a[e])=(\text{EraseRangeCheck}(a'[e']), \text{componentBound})} \text{ARRAY1} \\
\frac{\Gamma \vdash \text{optName}(a)=(a', \text{Aggregate}) \quad \Gamma \vdash \text{optExp}(e)=(e', [v_1, w_1])}{\Gamma \vdash \text{arrayIndexTypeRange}(a)=[l, u] \quad \Gamma \vdash \text{arrayComponentTypeBound}(a)=\text{componentBound} \quad \{v_1, w_1\} \not\subseteq [l, u]}{\Gamma \vdash \text{optName}(a[e])=(a'[e'], \text{componentBound})} \text{ARRAY2} \\
\frac{\Gamma \vdash \text{optName}(r)=(r', \text{Aggregate}) \quad \Gamma \vdash \text{recordFieldTypeBound}(r.f)=\text{fieldBound}}{\Gamma \vdash \text{optName}(r.f)=(r'.f, \text{fieldBound})} \text{RECORD}
\end{array}$$

Figure 4.4: RT-OPT Specification for Array and Record Access

For division, four cases (Div1-4) specify the different situations where division by zero and/or operation overflow (i.e., when dividing INT_{MIN} by -1) could occur; in all the cases, the resulting interval is specified by *divInterval* (see Figure 4.2) that does case analysis on the positivity/negativity of the interval operands. For example, (5) specifies the case where both of the operand intervals $[v_1, w_1]$ and $[v_2, w_2]$ are positive (i.e, the low bounds v_1 and v_2 are positive); in this case, the resulting interval is $[v_1/w_2, w_1/v_2]$ where its low bound v_1/w_2 is computed by dividing the smallest value of the first operand’s interval with the largest value of the second operand’s interval, and its high bound w_1/v_2 is computed by dividing the largest value of the first operand’s interval with the smallest value of the second operand’s interval. The *divInterval* specification illustrates a slice of the RT-OPT’s complexity for computing tight intervals in order to optimize away many run-time checks; rest assured however that they are proven to be correct (and tested to boot!). It’s similar for modulus operator that is specified with MOD1 and MOD2, whose resulting interval is specified by *modInterval* in Figure 4.2.

For unary negative operator, the rule NEG1 safely removes the overflow check for the unary expression when all possible values of the negative operation on its operand are within the integer range; and rule NEG2 preserves the check as the result of negation may cause overflow (i.e. negation of INT_{MIN}).

Lastly, the VARINT rule specifies that an integer variable reference’s interval is its integer type range intersected by the platform’s integer range (i.e., leveraging the RT-OPT invariant

$$\begin{array}{c}
\frac{\Gamma \vdash \mathit{optName}(x) = (x', xBound) \quad \Gamma \vdash \mathit{optExp}(e) = (e', eBound) \quad \Gamma \vdash \mathit{rangeConstrained}(x) = \mathit{false}}{\Gamma \vdash \mathit{optStmt}(x := e) = (x' := e')} \text{ ASSIGN1} \\
\\
\frac{\Gamma \vdash \mathit{optName}(x) = (x', [v_1, w_1]) \quad \Gamma \vdash \mathit{optExp}(e) = (e', [v_2, w_2]) \quad \{v_2, w_2\} \subseteq [v_1, w_1]}{\Gamma \vdash \mathit{optStmt}(x := e) = (\mathit{EraseRangeCheck}(x' := e'))} \text{ ASSIGN2} \\
\\
\frac{\Gamma \vdash \mathit{optName}(x) = (x', [v_1, w_1]) \quad \Gamma \vdash \mathit{optExp}(e) = (e', [v_2, w_2]) \quad \{v_2, w_2\} \not\subseteq [v_1, w_1]}{\Gamma \vdash \mathit{optStmt}(x := e) = (x' := e')} \text{ ASSIGN3} \\
\\
\frac{\Gamma \vdash \mathit{optExp}(e) = (e', eBound) \quad \Gamma \vdash \mathit{optStmt}(c_1) = (c'_1) \quad \Gamma \vdash \mathit{optStmt}(c_2) = (c'_2)}{\Gamma \vdash \mathit{optStmt}(\mathit{if } e \text{ then } c_1 \text{ else } c_2) = (\mathit{if } e' \text{ then } c'_1 \text{ else } c'_2)} \text{ IF} \\
\\
\frac{\Gamma \vdash \mathit{optExp}(e) = (e', eBound) \quad \Gamma \vdash \mathit{optStmt}(c) = (c')}{\Gamma \vdash \mathit{optStmt}(\mathit{while } e \text{ do } c) = (\mathit{while } e' \text{ do } c')} \text{ WHILE} \\
\\
\frac{\Gamma \vdash \mathit{optStmt}(c_1) = (c'_1) \quad \Gamma \vdash \mathit{optStmt}(c_2) = (c'_2)}{\Gamma \vdash \mathit{optStmt}(c_1; c_2) = (c'_1; c'_2)} \text{ SEQ} \\
\\
\frac{\Gamma(p) = (\mathit{Procedure } p \text{ params } \mathit{procedureBody}) \quad \Gamma \vdash \mathit{optArgs}(args, params) = (args')}{\Gamma \vdash \mathit{optStmt}(\mathit{call}(p, args)) = (\mathit{call}(p, args'))} \text{ CALL}
\end{array}$$

Figure 4.5: *RT-OPT Specification for Statement*

that all computed integer values are always checked for overflows).

Figure 4.4 shows the check optimization rules for array and record access. As array and record are defined as `name` in SPARK AST syntax in Coq (see Figure 3.4), `optName` is used for specifying the optimization of name expressions to distinguish with `optExp` for normal expressions. `ARRAY1` and `ARRAY2` define the optimization of both `interiorChecks` and `exteriorChecks` for array expressions. As array can be nested, `optName(a[e])` is defined recursively by calling `optName(a)`, and then do the `interiorChecks` optimization for indexing expression `e` by calling `optExp(e)`; if the value interval `[v1, w1]` of `optExp(e)` falls within the array index type range `[l, u]`, remove the range `exteriorChecks` from the array expression as specified in `ARRAY1`, otherwise, keep the range check in `ARRAY2`. The resulting array component bound can be either (a) an interval `[v, w]`, bounded by machine integer range `[INTMIN, INTMAX]`, if it's an array of integer; or (b) *Boolval* if it's an array of boolean values; or (c) *Aggregate* if it's a nested array (e.g. array of array, array of record). The rule `RECORD` shows the similar optimization for record expressions, and its resulting bound value `fieldBound` can also be an integer interval `[v, w]`, *Boolval* or *Aggregate*, depending on the type of the visited record field.

$$\begin{array}{c}
\frac{}{\Gamma \vdash \text{optArgs}(\text{nil}, \text{nil}) = (\text{nil})} \text{ARGS1} \\
\\
\frac{\Gamma \vdash \text{mode}(p) = \text{In} \quad \Gamma \vdash \text{rangeConstrained}(p) = \text{false} \\ \Gamma \vdash \text{optExp}(a) = (a', a\text{Bound}) \quad \Gamma \vdash \text{optArgs}(\text{args}, \text{params}) = (\text{args}')}{\Gamma \vdash \text{optArgs}(a :: \text{args}, p :: \text{params}) = (a' :: \text{args}')} \text{ARGS2} \\
\\
\frac{\Gamma \vdash \text{mode}(p) = \text{In} \quad \Gamma \vdash \text{optArgs}(\text{args}, \text{params}) = (\text{args}') \\ \Gamma \vdash \text{paramTypeBound}(p) = [v_1, w_1] \quad \Gamma \vdash \text{optExp}(a) = (a', [v_2, w_2]) \quad \{v_2, w_2\} \subseteq [v_1, w_1]}{\Gamma \vdash \text{optArgs}(a :: \text{args}, p :: \text{params}) = (\text{EraseRangeCheck}(a') :: \text{args}')} \text{ARGS3} \\
\\
\frac{\Gamma \vdash \text{mode}(p) = \text{In} \quad \Gamma \vdash \text{optArgs}(\text{args}, \text{params}) = (\text{args}') \\ \Gamma \vdash \text{paramTypeBound}(p) = [v_1, w_1] \quad \Gamma \vdash \text{optExp}(a) = (a', [v_2, w_2]) \quad \{v_2, w_2\} \not\subseteq [v_1, w_1]}{\Gamma \vdash \text{optArgs}(a :: \text{args}, p :: \text{params}) = (a' :: \text{args}')} \text{ARGS4} \\
\\
\frac{\Gamma \vdash \text{mode}(p) = \text{Out} \quad \Gamma \vdash \text{rangeConstrained}(a) = \text{false} \\ \Gamma \vdash \text{optExp}(a) = (a', a\text{Bound}) \quad \Gamma \vdash \text{optArgs}(\text{args}, \text{params}) = (\text{args}')}{\Gamma \vdash \text{optArgs}(a :: \text{args}, p :: \text{params}) = (a' :: \text{args}')} \text{ARGS5} \\
\\
\frac{\Gamma \vdash \text{mode}(p) = \text{Out} \quad \Gamma \vdash \text{optArgs}(\text{args}, \text{params}) = (\text{args}') \\ \Gamma \vdash \text{paramTypeBound}(p) = [v_1, w_1] \quad \Gamma \vdash \text{optExp}(a) = (a', [v_2, w_2]) \quad \{v_1, w_1\} \subseteq [v_2, w_2]}{\Gamma \vdash \text{optArgs}(a :: \text{args}, p :: \text{params}) = (\text{EraseRangeCheckOnReturn}(a') :: \text{args}')} \text{ARGS6} \\
\\
\frac{\Gamma \vdash \text{mode}(p) = \text{Out} \quad \Gamma \vdash \text{optArgs}(\text{args}, \text{params}) = (\text{args}') \\ \Gamma \vdash \text{paramTypeBound}(p) = [v_1, w_1] \quad \Gamma \vdash \text{optExp}(a) = (a', [v_2, w_2]) \quad \{v_1, w_1\} \not\subseteq [v_2, w_2]}{\Gamma \vdash \text{optArgs}(a :: \text{args}, p :: \text{params}) = (a' :: \text{args}')} \text{ARGS7} \\
\\
\frac{\Gamma \vdash \text{mode}(p) = \text{InOut} \quad \Gamma \vdash \text{rangeConstrained}(p) = \text{false} \vee \text{rangeConstrained}(a) = \text{false} \\ \Gamma \vdash \text{optExp}(a) = (a', a\text{Bound}) \quad \Gamma \vdash \text{optArgs}(\text{args}, \text{params}) = (\text{args}')}{\Gamma \vdash \text{optArgs}(a :: \text{args}, p :: \text{params}) = (a' :: \text{args}')} \text{ARGS8} \\
\\
\frac{\Gamma \vdash \text{mode}(p) = \text{InOut} \quad \Gamma \vdash \text{optArgs}(\text{args}, \text{params}) = (\text{args}') \\ \Gamma \vdash \text{paramTypeBound}(p) = [v_1, w_1] \quad \Gamma \vdash \text{optExp}(a) = (a', [v_2, w_2]) \quad v_1 = v_2 \quad w_1 = w_2}{\Gamma \vdash \text{optArgs}(a :: \text{args}, p :: \text{params}) = (\text{EraseRangeCheckOnReturn}(\text{EraseRangeCheck}(a')) :: \text{args}')} \text{ARGS9} \\
\\
\frac{\Gamma \vdash \text{mode}(p) = \text{InOut} \quad \Gamma \vdash \text{optArgs}(\text{args}, \text{params}) = (\text{args}') \\ \Gamma \vdash \text{paramTypeBound}(p) = [v_1, w_1] \quad \Gamma \vdash \text{optExp}(a) = (a', [v_2, w_2]) \quad \{v_1, w_1\} \not\subseteq [v_2, w_2] \quad \{v_2, w_2\} \subseteq [v_1, w_1]}{\Gamma \vdash \text{optArgs}(a :: \text{args}, p :: \text{params}) = (\text{EraseRangeCheck}(a') :: \text{args}')} \text{ARGS10} \\
\\
\frac{\Gamma \vdash \text{mode}(p) = \text{InOut} \quad \Gamma \vdash \text{optArgs}(\text{args}, \text{params}) = (\text{args}') \\ \Gamma \vdash \text{paramTypeBound}(p) = [v_1, w_1] \quad \Gamma \vdash \text{optExp}(a) = (a', [v_2, w_2]) \quad \{v_1, w_1\} \subseteq [v_2, w_2] \quad \{v_2, w_2\} \not\subseteq [v_1, w_1]}{\Gamma \vdash \text{optArgs}(a :: \text{args}, p :: \text{params}) = (\text{EraseRangeCheckOnReturn}(a') :: \text{args}')} \text{ARGS11} \\
\\
\frac{\Gamma \vdash \text{mode}(p) = \text{InOut} \quad \Gamma \vdash \text{optArgs}(\text{args}, \text{params}) = (\text{args}') \\ \Gamma \vdash \text{paramTypeBound}(p) = [v_1, w_1] \quad \Gamma \vdash \text{optExp}(a) = (a', [v_2, w_2]) \quad \{v_1, w_1\} \not\subseteq [v_2, w_2] \quad \{v_2, w_2\} \not\subseteq [v_1, w_1]}{\Gamma \vdash \text{optArgs}(a :: \text{args}, p :: \text{params}) = (a' :: \text{args}')} \text{ARGS11}
\end{array}$$

Figure 4.6: RT-OPT Specification for Arguments

Figure 4.5 lists the optimization rules for statements. For assignments, as illustrated in `ASSIGN1`, `ASSIGN2` and `ASSIGN3`, perform optimizations on both left and right side expressions; the optimization for `range exteriorChecks` is carried out in `ASSIGN2` only when x is a range constrained variable and the value bound of e cannot escape the expected value range of x , where the predicate `rangeConstrained(x)` checks whether x is a variable of range constrained type. Rules `IF`, `WHILE` and `SEQ` define run-time check optimizations recursively on their subcomponents. For procedure call, run-time checks are required when evaluating and passing the values of arguments to the callee procedure and when returning the result to the calling procedure. The procedure call rule `CALL` specifies the optimization for its arguments against to its formal parameters.

Figure 4.6 gives all possible cases for check optimization of arguments with respect to different In/Out modes of the corresponding parameters. `ARGS1` is a special case for procedure call without parameters; `ARGS2-4` for arguments that are only readable by the called procedure, and `ARGS5-7` for arguments that are only writable by the called procedure, and `ARGS8-11` for both readable and writable arguments. In general, there are two kinds of `exteriorChecks` optimizations for arguments when calling and returning from the called procedure: `EraseRangeCheck` is to remove the range check `RangeCheck` and `EraseRangeCheckOnReturn` is to remove the range check `RangeCheckOnReturn`. Both `RangeCheck` and `RangeCheckOnReturn` enforce the same kind of range check, but at different situations and in different directions. `RangeCheck` enforces the range check on the values of In/InOut arguments before they are passed into the parameters when the procedure is called, and `RangeCheckOnReturn` enforces the range check on the values of parameters before they are written to the Out/InOut arguments when the procedure returns. Both range checks reside in arguments AST.

Well-Typed State: `VARINT` assumes that it can use the variable’s integer type range for the variable reference’s interval. This holds if all values in the state are well-typed. To discharge this assumption, we first specified the meaning for a state to be well-typed:

Inductive `wellTypedState`: `symTabRT` \rightarrow `state` \rightarrow **Prop**:=

| WellTypedState: \forall stRT s ,
 $(\forall$ x v, fetch x s = Some v \rightarrow
 \exists t, lookup stRT x = Some t \wedge
wellTypedValue t v) \rightarrow
wellTypedState stRT s .

then proved that EVAL-RT specification (hence, by virtue of consistency transitivity, EVAL specification) preserve state well-typed-ness, for example, for EVAL-RT statement semantics that may incur state changes, we proved the following preservation lemma:

Lemma wellTypedStatePreservation: \forall s s' stmt stmtRT st stRT ,
toSymTabRT st stRT \rightarrow
toStmtRT st stmt stmtRT \rightarrow
wellTypedStmt stRT stmtRT \rightarrow
wellTypedState stRT s \rightarrow
evalStmtRT stRT s stmtRT s' \rightarrow
wellTypedState stRT s' .

Evaluation: To certify RT-OPT, we proceeded similarly to RT-GEN certification (albeit much more complex to prove); that is, we proved that RT-OPT specification is consistent (*sound* and *complete*) with the respect to the RT-GEN specification described in Section 4.2, and that RT-OPT implementation is consistent with respect to its specification. Therefore, the implementation is transitively consistent with respect to the SPARK mechanized semantics. For example, for statements, we proved the following consistency lemma:

Lemma optStmtConsistent: \forall stmt stmtRT stmtRTOpt st stRT s s' ,
toStmtRT st stmt stmtRT \rightarrow
toSymTabRT st stRT \rightarrow
wellTypedStmt stRT stmtRT \rightarrow
wellTypedState stRT s \rightarrow

$$\text{optStmt stRT stmtRT stmtRTOpt} \rightarrow \\ (\text{evalStmtRT stRT s stmtRT s}' \leftrightarrow \text{evalStmtRT stRT s stmtRTOpt s}').$$

We then proved that the RT-OPT implementation is consistent with respect to its specification, for example:

Lemma `optStmtImplConsistent`: $\forall \text{ stRT stmt stmtRT},$
 $\text{optStmtImpl stRT stmt} = \text{Some stmtRT} \leftrightarrow \text{optStmt stRT stmt stmtRT}.$

Therefore, the implementation is transitively consistent with respect to the SPARK semantics (by transitivity of implication $\rightarrow / \leftrightarrow$).

4.4 Certifying GNAT RT Generator

Now that we have RT-GEN and RT-OPT, we can implement a conformance checker that can establish that, for a SPARK 2014 program p , the run-time check decoration insertion of the GNAT front-end for p conforms to the mechanized SPARK 2014 reference semantics. Specifically, for program p , the GNAT front-end generates a fully resolved AST with run-time check decorations, and we developed a tool called Jago that takes the GNAT AST and produces: (1) a Coq object of type AST (`ast`), where the GNAT run-time decorations are erased, and (2) a Coq object of type AST-RT (`ast-rt-gnat`), where the GNAT run-time decorations are preserved (Jago also applies some program transformations to desugar language constructs that lie outside of the language subset to fall within the language subset). Then, applying RT-GEN on `ast` produces `ast-rt-gen`, and applying RT-OPT on `ast-rt-gen` produces `ast-rt-opt`, both of which are of type AST-RT.

To automate the actual AST conformance check, we implemented a tool in Coq – \subseteq , that given two objects of type AST-RT, it determines whether the set of run-time checks in the first object is a subset of the second's. Thus, GNAT run-time decoration insertion on program p is conformant to the SPARK 2014 reference semantics if `ast-rt-opt` \subseteq `ast-rt-gnat` \subseteq `ast-rt-gen`. This toolchain essentially turns the GNAT front-end into a certifying run-time check dec-

oration generator; that is, for a given program p , it generates evidence of “conformity to SPARK 2014 reference semantics for p ’s run-time check decorations” that is automatically machine-checked by certified tools.

Note that this does not guarantee that the actual binary run-time check assertion code for p subsequently generated by the GNAT compiler back-end is correct; it simply means that decorations indicating what assertions should be produced is correct. This, alone has significant value because, for example, it goes a long way toward establishing the correspondence between GNAT and GNATprove’s (as well as any other SPARK backend tools’) treatment of run-time checks. Moreover, since there are only three categories of run-time checks relevant for this language subset, since each of these categories can be represented by a simple code pattern involving a few numerical comparisons, since the pattern itself can be easily inspected and tested, and since the generation of binary code for the pattern is reasonable straightforward and can also be easily tested, one might argue that establishing the correctness of the decorations is one of the more important steps in establishing trust in the overall end-to-end production of the executable run-time checks.

4.5 Evaluation: Certifying GNAT

We evaluated GNAT according to the methodology described in Section 4.4 on a collection of programs. Table 4.1 presents the experiment data for various program units (packages/procedures) from the test programs. The first two SPARK programs come from the Ada Conformity Assessment Test Suite (ACATS)⁴⁹ that all Ada compilers must pass. SPARKSkein is an implementation of the Skein hash algorithm in SPARK, which was proved free of run-time errors⁵⁰. Tetris is the motivating example for run-time check certification, which is implemented partly in SPARK and partly in Ada (we only checked the SPARK part). All other examples are representative code from AdaCore, Altran and our own designed benchmark covering the core language subset. For each unit, **LoC** in Table 5.1 gives the unit’s

Unit	LoC	Base				GNAT				Opt				Diff			
		D	O	R	T	D	O	R	T	D	O	R	T	D	O	R	T
ACATS_c53007a	143	-	16	-	16	-	14	-	14	-	14	-	14	-	-	-	-
ACATS_c55c02b	74	-	2	5	7	-	2	-	2	-	2	-	2	-	-	-	-
array_record_package	54	1	11	2	14	1	11	2	14	1	11	2	14	-	-	-	-
array_subtype_index	12	-	1	1	2	-	1	-	1	-	1	1	2	-	-	+1	+1
arrayrecord	43	1	9	2	12	1	9	-	10	1	9	-	10	-	-	-	-
assign_subtype_var	10	-	1	1	2	-	1	-	1	-	1	1	2	-	-	+1	+1
binary_search	40	1	6	12	19	1	-	4	5	-	-	4	4	-1	-	-	-1
bounded_in_out	17	-	1	4	5	-	-	3	3	-	-	4	4	-	-	+1	+1
dependence_test_suite_01	164	-	2	-	2	-	2	-	2	-	2	-	2	-	-	-	-
dependence_test_suite_02	249	-	15	-	15	-	15	-	15	-	15	-	15	-	-	-	-
division_by_non_zero	12	1	2	1	4	1	-	-	1	-	-	-	-1	-	-	-	-1
faultintegrator	25	-	2	-	2	-	2	-	2	-	2	-	2	-	-	-	-
gcd	18	1	3	-	4	1	3	-	4	1	3	-	4	-	-	-	-
gnatprove_test_bool	38	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-
linear_div	21	-	3	-	3	-	3	-	3	-	3	-	3	-	-	-	-
modulus	24	1	2	3	6	1	1	-	2	-	1	-	1	-1	-	-	-1
odd	14	1	2	-	3	1	1	-	2	-	1	-	1	-1	-	-	-1
p_simple_call	36	-	5	-	5	-	5	-	5	-	5	-	5	-	-	-	-
prime	21	1	2	-	3	1	2	-	3	1	2	-	3	-	-	-	-
procedurette01	25	-	3	-	3	-	3	-	3	-	3	-	3	-	-	-	-
quantifiertest	14	-	1	2	3	-	1	-	1	-	1	-	1	-	-	-	-
recordtest01	23	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-	-
recursive_proc_pkg	18	-	3	-	3	-	3	-	3	-	3	-	3	-	-	-	-
SPARKSkein	646	7	94	246	347	7	58	29	94	-	52	25	77	-7	-6	-4	-17
sort	43	-	5	6	11	-	5	6	11	-	5	6	11	-	-	-	-
Tetris	373	-	29	58	87	-	-	25	25	-	-	25	25	-	-	-	-
the_stack	42	-	4	6	10	-	-	6	6	-	-	6	6	-	-	-	-
the_stack_praxis	35	-	2	4	6	-	-	4	4	-	-	4	4	-	-	-	-
two_way_sort	49	-	4	17	21	-	-	4	4	-	-	4	4	-	-	-	-

Table 4.1: *Experiment Data*

number of lines of code. **Base** gives the number of run-time checks in `ast-rt-gen`, **GNAT** gives the number of run-time checks in `ast-rt-gnat`, **Opt** gives the number of run-time checks in `ast-rt-opt`, and **Diff** represents the number of run-time checks in **GNAT** that differs than the ones in **Opt**. Dash (“-”) means “none”; a negative number $-n$ in **Diff** means that **Opt** removes n more run-time checks than **GNAT**; and, a positive number $+m$ means **Opt** has m more number of run-time checks than **GNAT** (“somehow”). Sub-column **D** gives the number of division by zero run-time checks; **O** gives the number of overflow run-time checks; **R** gives the number of range run-time checks; and, **T** is the total number of run-time checks (i.e., $\mathbf{D+O+R}$).

As can be observed from Table 4.1, the GNAT frontend is a solid tool for run-time check generation/verification as most of its generated run-time checks match the certified RT-OPT. This is reasonable because our formalization captures the most commonly used run-time checks in SPARK and GNAT is quite mature after many years of effort to improve it, as well as the effort to improve the GNATprove toolchain by AdaCore and Altran (which drives some of the improvements in GNAT). However, RT-OPT edges out GNAT in some cases, especially for SPARKSkein. One reason is that GNAT does not take any advanced optimizations, for the division/modulus binary operator, it does not optimize even with constant; for example, GNAT generates division by zero check for the expression $(R + 1) \bmod 3$ while RT-OPT optimized it away.

For SPARKSkein, consider a procedure call `Inject_Key(R * 2)`, (for procedure declaration `Inject_Key(X: in U32)`), `R` is a variable of type `U32`, and `U32` is a subtype of `Integer` with range `0..INT_MAX`; an overflow check for `R * 2` is enough to guarantee the absence of both overflow and range error, while GNAT keeps both overflow check and range check for such cases. For expression `(Byte_Count - (Blocks_Done * 64))`, where `Byte_Count` is a variable of `U32` and `Block_Done` is a variable of `U32`'s subtype with range `1..2`, the overflow check for both subtract and multiply operators, as requested by GNAT, can be optimized by RT-OPT. Similarly, for assignment `Bytes_Hashed := Block_Count * 64`, the overflow check for multiply operator and the range check against the type of `Bytes_Hashed` can all be safely removed by RT-OPT.

There are other cases showing that RT-OPT is better than GNAT's optimizations: for `binary_search` example, the division check on expression $(\text{Right} - \text{Left}) / 2$ can be safely removed as specified in RT-OPT, while GNAT makes no optimization on division expressions with even constant divisor 2; this also applies to the modular operator as shown in `modulus` example, where the division check for `mod`, as required by GNAT, within the array expression `KS((R + 1) mod (8 + 1))` will be optimized by RT-OPT. The similar optimizations by RT-OPT vs GNAT can be found in `division_by_non_zero` and `odd` examples.

In some cases, GNAT produces fewer run-time checks than RT-OPT; these inconsistencies are benign because they are due to differences in how GNAT (vs RT-OPT) reports the need for checks and in how it assumes down-stream translation will interpret decorations for run-time checks.

Regarding the reporting issue, in procedure `array_subtype_index`, there is an assignment `A(0) := 0`, where the index type of `A` is a subtype of integer with range `1 .. 10`; thus, accessing `A` with the index `0` is out of its required range, so it will cause range error. GNAT gives a *warning* at compile time in such case, and it does not generate a range check; on the other hand, RT-OPT keeps this check. (A similar issue exists for `assign_subtype_var`.)

Another inconsistency is due to the fact that a single run-time check decoration in the GNAT AST can lead downstream translation steps to introduce run-time checking code that implements multiple checks. Consider `bounded_in_out`:

```
subtype T1 is Integer range 0 .. 10;
subtype T2 is Integer range 5 .. 15;
procedure Decrease (X: in out T1) is
begin X := X - 1; end Decrease;
V: T2;      ...;      Decrease(V);
```

when `Decrease(V)` is called, according to the SPARK semantics, there should be two different range checks for argument `V` on both passing in argument and passing out return value because `X` is declared using both **in** and **out**. However, GNAT only generates one range check *decoration*; this is because it is assumed that the check decoration should be interpreted according to the variable **in/out** modes. That is, if the variable is (strictly) either **in** or **out** (and not both), then the run-time check decoration should be interpreted giving rise to code for one run-time check. However, if the variable is both **in** and **out**, then the GNAT run-time check AST decoration should be interpreted as giving rise to code for two checks, one for each direction. On the other hand, RT-GEN explicitly generates the two check decorations (which are kept by RT-OPT).

The inconsistencies above can be easily rectified by either modifying GNAT or RT-GEN/RT-OPT/ \subseteq ; they are kept here to document our findings.

Further Assessment: The fact that RT-OPT is better in some cases illustrates that, despite its maturity, GNAT can still be improved further, e.g., by adopting the optimization specified and implemented in RT-OPT; that is, the RT-OPT specification can be used as a reference for implementing further optimizations in GNAT, and once implemented, they can then be checked for conformance against the RT-OPT implementation. Furthermore, in the case where new optimizations are added to GNAT that goes beyond RT-OPT as presented here, those new optimizations can be added to RT-OPT in order to: (a) mechanically verify that they are correct, and (b) further keep GNAT as a certifying run-time check generator.

Our research work demonstrates the feasibility of engineering an approach and corresponding tools with mechanized correctness proofs that leverage recent advancements and maturity of various formal method techniques and tools to make a direct impact in significantly increasing confidence in industrial tools; in our case, the industrial tools are used to develop critical systems that require the utmost level of integrity, thus, warranting such effort.

From a business perspective, we believe it is desirable as it adds to the value proposition – the trustworthiness of GNAT compiler and associated SPARK 2014 is increased. Furthermore, we believe that the approach can eventually help in tool qualification processes typically done in software certifications and regulatory reviews associated with standards (e.g., DO-178C in avionics) that increasingly recognize the value of formal methods and an official tool qualification process.

Threats To Internal Validity: Our approach is predicated on the assumption that practitioners are willing to trust the approach’s trust-base, which includes Coq and the SPARK formal language semantics presented in Section 3.3. That is, problems in Coq or in the formal semantics threaten the internal validity of our approach. As to why this might be a concern, recent stable releases of Coq (e.g., v8.4pl5) have an unguarded optimization bug

that cause them to accept a *proof of false* (\perp) in rare cases where an inductive type is defined with more than 255 type constructors⁵¹; once \perp is accepted, any proof can be accepted, which essentially renders any proof system untrustable. Understandably, the bug has since been fixed (starting in Coq v8.4pl6). In addition, our current implementation uses: (a) the parser, symbol resolver, and type checker of GNAT itself, and (b) Jago to build program representations in Coq; both are not certified tools. Ideally, a certified frontend can be developed to address this issue; this certified frontend is orthogonal and out of the scope of the work presented here, and they can be addressed in the future. Moreover, the \subseteq tool that compares AST-RT objects is manually inspected instead of certified (it is small – 172 LoC, and its functionality is very simple); regardless, it should be considered as part of the trust-base at this point of time.

Threats To External Validity: One must also consider the extent to which the results presented for the given test suite would extend to SPARK 2014 programs in general. For this objective, program size and execution time are not really issues – the cost of insertion of run-time checks is in general linear in the number of AST nodes. The interval analysis needed for optimization does add some additional complexity, but not enough to significantly impact performance. On the other hand, a principle concern is that our test suite provides appropriate coverage of all the different types of run-time checks specified in the SPARK 2014 language reference manual. In addition, our language subset needs to be expanded to eventually cover the full programming language (in fact, this work represents our second iteration; we presented our initial work with a small language subset corresponding to a simple imperative language with while-loop as a 2-page abstract paper for an industrial position presentation⁵²).

Overall Perspective: In the end, if GNAT/GNATProve is a run-time checker, our approach is a checker of checker, and Coq is the checker of a checker of a checker. Both Coq and the SPARK formal semantics are ultimately checked by manual inspections (which would improve over time). So, who checks the checkers? It seems the answer lies in a

well-engineered towering house of checkers with decreasingly unsafe spaces¹ as one ascends the tower and eventually comes to the realization of having to trust (hopefully minimal) creations of intelligent beings.

¹Analogous to “reducing attack surfaces” commonly touted in cybersecurity to manage risks.

Chapter 5

Declassification Policy for SPARK

There exist a wide range of safety/security critical information systems being used in the area of finance, healthcare, military and aviation to process multi-level security data, including password checking system, online shopping and banking system. In general, there are three ways to protect information confidentiality and integrity. Cryptography provides a way to hide information in data and protect data from tampering, but it is costly and impractical to decrypt and encrypt the data each time we need to process the data. Access controls can protect data from being read or modified by unauthorized users. However, it cannot prevent the propagation of information after it has been released for processing by a program. Information flow is the transfer of information from an input to an output in a given process. It reflects an end-to-end behavior of a system and information flow control provides a complementary approach to track and regulate the information flow of a system to prevent secret data from leaking into public. One promising way to ensure the secure information flow of a system is to use noninterference, which requires that secret data may not interfere with (or affect) public data, as an end-to-end semantic security condition to reason about information flow security.

However, the security requirements enforced by noninterference are too restrictive. In fact, computing systems often need to deliberately declassify (or release) parts of its confi-

dential information, for example, in password checking system, it's necessary to reveal some information about the stored password, telling the user whether his input password is correct or not. Declassification of information occurs when the confidentiality of information is decreased or becomes less restrictive. It's an exception to the normal secure information flow. The major challenge is to design an elegant declassification mechanism to precisely capture the intentional information release and ensure that the release is safe: the attacker could neither get around the declassification mechanism nor exploit the declassification mechanism to reveal more secret information than intended, e.g. secret laundering. A lot of research has been carried out in the area of declassification according to four dimensions⁵³: *what* can be declassified, *where* declassification can occur, *who* is able to declassify information and *when* it's allowed to be declassified.

The main contributions of this chapter are:

- a design of a language-based information security policy specification framework to capture the desired information flow from one domain to another on the event of certain actions, and show how the framework can be specified and integrated into SPARK using Ada 2012 aspects decorations. It enhances SPARK current information flow analysis with ability to declare domains and specify declassification policy between those domains.
- a design of a static enforcement algorithm that can automatically check whether the program conforms to the specified information security policy. It's a type checking system that based on type constraint generation followed by constraint solving procedure. The checking algorithm is compositional, and the verification of information security can be achieved modularly, at the level of individual subprograms, such that a called procedure can be checked with its inferred type constraint specification.
- formalization of the operational semantics for programs with declassification procedures and proof of the correctness of the policy enforcement algorithm with respect to the formalized program semantics.

- evaluation of our designed security policy framework on some examples to assess the expressiveness of the policy language and the degree of automation provided by the algorithm to verify that the program behaves as expected.

5.1 Syntax of Security Policy

5.1.1 Policy Design Principles

Our goal is to propose a security policy framework for SPARK that can provide the ability to specify security domains and control information flow of different domains. Here are some design principles that we have adopted:

- Simple to use, which means little burden for users to specify policy.
- Easy to integrate into SPARK 2014.
- Easy to check with static analysis.
- Expressive enough to specify and check security policy for real SPARK programs.

5.1.2 Policy Aspects

As SPARK's contract language is aspect-oriented, to be consistent with this language feature, we also propose some new aspects to support the security policy, which has ability to specify:

- the security domains as enumeration types, with or without ordering.
- the association between data and security domains.
- the allowed declassification operations.

Ordered Aspect We introduce the security type as a natural part of the SPARK language by adding a new aspect *Ordered* to the normal enumeration type. With this new aspect, a type can be annotated to indicate different types of security domains. The symbol \leq is used to denote the ordering between two security domains and its antisymmetry. For any two security domains ℓ_1 and ℓ_2 , $\ell_1 \leq \ell_2$ means the security level of ℓ_2 is at least as high as the security level of ℓ_1 , so any information from the security domain ℓ_1 (or annotated with ℓ_1) is allowed to flow into the destination of security domain ℓ_2 .

Totally ordered security domains can be defined as:

type T is (ℓ_1 , ℓ_2 , ℓ_3) **with**

Ordered ;

where the defined security domain values are ordered according to their positions in the declared enumeration type T . That's $\ell_1 \leq \ell_2$, $\ell_2 \leq \ell_3$ and $\ell_1 \leq \ell_3$.

Partially ordered security domains can be defined as:

type T is (ℓ_1 , ℓ_2 , ℓ_3) **with**

Ordered \Rightarrow $\{\ell_1 \leq \ell_2\}$;

which means T is a security type and only ℓ_1 and ℓ_2 are ordered with \leq . The security domain ℓ_3 is isolated from the other two security domains.

Totally separated security domains can be defined as:

type T is (ℓ_1 , ℓ_2 , ℓ_3) **with**

Ordered \Rightarrow **null**;

which means that all security domains defined in security type T should be isolated from each other.

The same idea could also be used to define integrity domains, where the normal flows go from critical data to non-critical data. In this work, we mainly focus on the confidentiality (also referred as security) domains. Specification of multiple dimensional domains (both confidentiality and integrity) will be included in the future work.

Domain Aspect With the definition of security types, data can be annotated with the new aspect *Domain* to indicate that it belongs to a security domain, for example:

$X : \text{Integer } \mathbf{with} \text{ Domain} \Rightarrow \ell$

where X is defined as an integer variable within security domain ℓ .

The security domains in these annotations are all static, it means that any data should belong to exactly the listed domain, and it cannot belong to two different incompatible domains at the same time. The associated domain can be regarded as a invariant property for the data, whatever information flow involving the domain-associated data should follow the security policy enforced on its domain.

In this proposal, we are limiting this feature to global variables, as the extension to library-level variables, subprogram parameters/results, and local variables is likely increasing the work in the tools for no clear benefit. Furthermore, to make it simpler and more precise, we can only associate domains for those security-critical global variables that may either hold sensitive data that should be protected or separated from other domains or work as source input ports that provide sensitive input information or work as output ports that deliver information to the public or other sessions.

Declassifier Aspect Verifying that data flows respect the allowed flows between domains can be achieved modularly, at the level of individual subprograms, based on *Depends* contracts. Indeed, all dependencies listed in *Depends* contracts (either manually written or generated by the tool) should respect the allowed directions of flow. For example, the following would be allowed if the security domain of Y is at least as high as X :

procedure Secure_Copy (X: **in** T; Y: **out** T) **with**
 Depends $\Rightarrow (Y \Rightarrow X)$; — *read as: Y depends on X*

while the following would be detected as a violation of the security policy if security domains of X and Y have no \leq ordering:

procedure Insecure_Copy (X: **in** T; Y: **out** T) **with**

Depends $\Rightarrow (Y \Rightarrow X)$; — *read as: Y depends on X*

It is almost never the case that all flows respect the simple security policy stated above. In general, a few operations known as declassifications are allowed to violate the default security policy, for example the operation that encrypts secret data before sending it on a public network.

We propose to allow specifying which operations are declassifiers with a new aspect *Declassifier*. Such operations should specify fully the possible source and target domains for the declassification(s). For example:

— *with domains ℓ_1 and ℓ_2 and $\ell_2 \leq \ell_1$*

procedure *Encrypt* (X: **in** T; Y: **out** T) **with**

Declassifier ,

Domain $\Rightarrow (X \Rightarrow \ell_1, Y \Rightarrow \ell_2)$,

Depends $\Rightarrow (Y \Rightarrow X)$; — *read as: Y depends on X*

it means that *Encrypt* is a declassification procedure that's allowed to declassify information from domain ℓ_1 to ℓ_2 . The domain annotations for parameters X and Y also enforce that whenever calling *Encrypt*(u, v), the security domain of passed in argument u should be less than and equal to ℓ_1 , and when the call returns, ℓ_2 should be less than and equal to the security domain of the passed out argument v .

For those procedures denoted as declassifiers, they are assumed to be trustful and being implemented correctly. So unlike the non-declassifier procedures, we don't need to get into its implementation body during static analysis.

In summary, the security policy language is quite simple and easy to use, what users need to do is just to define security types of their interest, and then annotate those critical source/target data with the defined security domains, and specify the trusted declassification procedures. The enforcement for checking security policy will be performed automatically, which will be discussed in the next section.

5.2 Enforcement of Security Policy

The introduction of declassification means that not all subprograms can be analyzed simply by checking that the final variable dependencies respect the security policy, as violations may occur which are allowed by some declassification step. Thus, flow analysis should be updated to analyze each assignment for its respect of security policies, whether this is a direct assignment (assignment operation) or an indirect one (call to a procedure that has outputs). In both cases, there are restrictions on the flows from input variables (either from the expression assigned, or the inputs of the call on which this output depends, or the control under which this assignment takes place) to the assigned variable. In this chapter, we propose to effectively enforce these restrictions by a constraint-based typing system, which is proved to be sound with respect to the operational semantics of program with declassification procedures. Any program satisfying the type constraint system is called an information secure program.

Here are some symbols that will be used in the following sections:

- ℓ : concrete security domain (or security level)
- α : security type variable
- C : set of subtyping constraints, which are in the form of $T_1 \leq T_2$
- p : context security type served to eliminate indirect information flows
- Γ_g : a mapping from global variables to security types
- Γ_l : a mapping from local variables to security types
- $freshType()$: generate fresh security type variable
- $freshVar()$: generate fresh variable name
- $ModVar_{local}(c)$: set of local variables maybe modified within statement c

Security Type Expression

$T ::= \tau \mid T \sqcup T; \quad \tau ::= \ell \mid \alpha;$

Type Inference Rules

$$\begin{array}{c} \frac{}{\Gamma_g; \Gamma_l \vdash n : \perp} \text{LITERAL} \\ \frac{\Gamma_l(x) = \tau}{\Gamma_g; \Gamma_l \vdash x : \tau} \text{LOCAL-VAR} \\ \frac{\Gamma_l(x) = \text{null} \wedge \Gamma_g(x) = \tau}{\Gamma_g; \Gamma_l \vdash x : \tau} \text{GLOBAL-VAR} \end{array} \qquad \begin{array}{c} \frac{\Gamma_g; \Gamma_l \vdash e : T}{\Gamma_g; \Gamma_l \vdash \square e : T} \text{UNARY-EXP} \\ \frac{\Gamma_g; \Gamma_l \vdash e_1 : T_1, \quad \Gamma_g; \Gamma_l \vdash e_2 : T_2, \quad T = T_1 \sqcup T_2}{\Gamma_g; \Gamma_l \vdash e_1 \odot e_2 : T} \text{BINARY-EXP} \end{array}$$

Figure 5.1: *Security Type Inference for Expression*

A security type constraint (also referred as type constraint) is an ordering (or subtyping) relationship between two type expressions (see Figure 5.2): $T_1 \leq T_2$, and it's called an atomic type constraint if both T_1 and T_2 are τ , such as $\alpha \leq \ell$, $\ell_1 \leq \ell_2$.

5.2.1 Type Constraint Generation

As mentioned before, user only needs to annotate the security types for global variables of their interests, and the enforcement can infer security types for the rest, including locally defined variables and parameters of procedures. The security policy is enforced by generating type constraints at each execution step. The satisfiability of the type constraint system determines the information security of the program, and any solution for the type constraint system is also a type inference for the untyped variables.

Figure 5.1 and 5.2 show the type inference rules for expression and type constraint generation rules for statement respectively. In the type inference rules for expression, a constant can flow to any domain as denoted by type \perp in the rule LITERAL. We treat differently for the security types of global and local variables. The security type for a global variable is fixed, while it's varied for the local variable depending on its current content. This is because in the information security, we concern about the security of information flow between global variables, which maybe accessible to the outside, and local variables are only working as

$\frac{\Gamma_g; \Gamma_l \vdash e : T, \quad \Gamma_l(x) \neq \text{null}, \quad \alpha = \text{freshType}(), \quad C = \{T \leq \alpha, p \leq \alpha\}, \quad \Gamma'_l = \Gamma_l[x \rightarrow \alpha]}{\Gamma_g; \Gamma_l; p \vdash x := e \Rightarrow \Gamma'_l; C} \text{ ASSIGN-LOCAL-UPDATE}$	$\frac{\Gamma_g; \Gamma_l \vdash e : T, \quad \Gamma_g; \Gamma_l; p \sqcup T \vdash c_1 \Rightarrow \Gamma'_l; C', \quad \Gamma_g; \Gamma_l; p \sqcup T \vdash c_2 \Rightarrow \Gamma''_l; C'', \quad \Gamma'''_l = \Gamma'_l \sqcup \Gamma''_l, \quad C''' = C' \cup C''}{\Gamma_g; \Gamma_l; p \vdash \text{if } e \text{ then } c_1 \text{ else } c_2 \Rightarrow \Gamma'''_l; C'''} \text{ IF}$
$\frac{\Gamma_g; \Gamma_l \vdash e : T, \quad \Gamma_l(x) = \text{null} \wedge \Gamma_g(x) = \tau, \quad C = \{T \leq \tau, p \leq \tau\}}{\Gamma_g; \Gamma_l; p \vdash x := e \Rightarrow \Gamma_l; C} \text{ ASSIGN-GLOBAL-UPDATE}$	$\frac{\Gamma_g; \Gamma_l; p \vdash c_1 \Rightarrow \Gamma'_l; C', \quad \Gamma_g; \Gamma'_l; p \vdash c_2 \Rightarrow \Gamma''_l; C'', \quad C''' = C' \cup C''}{\Gamma_g; \Gamma_l; p \vdash c_1; c_2 \Rightarrow \Gamma'_l; C'''} \text{ SEQUENCE}$
$\Psi = \text{ModVar}_{\text{local}}(c) = \{x_1, \dots, x_k\}, \quad \Gamma'_l = \Gamma_l[x_1 \rightarrow \alpha_1][\dots][x_k \rightarrow \alpha_k], \text{ where } \alpha_i = \text{freshType}(), i \in [1, k],$ $\Gamma_g; \Gamma'_l \vdash e : T, \quad \Gamma_g; \Gamma'_l; p \sqcup T \vdash c \Rightarrow \Gamma''_l; C', \quad C_0 = \{\Gamma_l(x) \leq \Gamma'_l(x) \mid x \in \Psi\}, \quad C_1 = \{\Gamma'_l(x) \leq \Gamma''_l(x) \mid x \in \Psi\}, \quad C'' = C_0 \cup C_1 \cup C'$	
$\frac{\Gamma_g; \Gamma_l; p \vdash \text{while } e \text{ do } c \Rightarrow \Gamma'_l; C''}{\text{ WHILE}}$	
$\Gamma_g(f) = (\text{procedure } f(x_1 : \eta_1, \dots, x_k : \eta_k), C_f), \quad \eta_i = \begin{cases} \tau_i & \text{if } \text{Mode}(x_i) = \text{In/Out} \\ (\tau_{i_1}, \tau_{i_2}) & \text{if } \text{Mode}(x_i) = \text{InOut} \end{cases}$ $\lambda_1(\tau) ::= \text{if } (\tau == \text{Some } \ell) \text{ then } \ell \text{ else } \text{freshType}()$ $\lambda_2(x, \tau_x) ::= \text{if } (\Gamma_l(x) \neq \text{null}) \text{ then } \text{freshType}() \text{ else } \tau_x$ $\Gamma'_l = \Gamma_l \quad C'_f = C_f$ <p>for $i \in [1, k]$ do :</p> <p style="margin-left: 20px;">$\Gamma_g; \Gamma_l \vdash a_i : \tau_{a_i}$</p> <p style="margin-left: 20px;">case $\text{Mode}(x_i) = \text{In}$:</p> <p style="margin-left: 40px;">$C_i = \{\tau_{a_i} \leq \lambda_1(\tau_i), p \leq \lambda_1(\tau_i)\} \quad C'_f = C'_f[\lambda_1(\tau_i)/\tau_i]$</p> <p style="margin-left: 20px;">case $\text{Mode}(x_i) = \text{Out}$:</p> <p style="margin-left: 40px;">$C_i = \{\lambda_1(\tau_i) \leq \lambda_2(a_i, \tau_{a_i}), p \leq \lambda_2(a_i, \tau_{a_i})\}$</p> <p style="margin-left: 40px;">$C'_f = C'_f[\lambda_1(\tau_i)/\tau_i] \quad \Gamma'_l = \Gamma'_l[a_i \rightarrow \lambda_2(a_i, \tau_{a_i})]$</p> <p style="margin-left: 20px;">case $\text{Mode}(x_i) = \text{InOut}$:</p> <p style="margin-left: 40px;">$C_{i_1} = \{\tau_{a_i} \leq \lambda_1(\tau_{i_1}), p \leq \lambda_1(\tau_{i_1})\}$</p> <p style="margin-left: 40px;">$C_{i_2} = \{\lambda_1(\tau_{i_2}) \leq \lambda_2(a_i, \tau_{a_i}), p \leq \lambda_2(a_i, \tau_{a_i})\}$</p> <p style="margin-left: 40px;">$C'_f = C'_f[\lambda_1(\tau_{i_1})/\tau_{i_1}][\lambda_1(\tau_{i_2})/\tau_{i_2}] \quad C_i = C_{i_1} \cup C_{i_2} \quad \Gamma'_l = \Gamma'_l[a_i \rightarrow \lambda_2(a_i, \tau_{a_i})]$</p> $C' = C_1 \cup \dots \cup C_k \cup C'_f$	
$\frac{\Gamma_g; \Gamma_l; p \vdash \text{call } f(a_1, a_2, \dots, a_k) \Rightarrow \Gamma'_l; C'}{\text{ PROCEDURE-CALL}}$	
<p style="text-align: center;"><i>the same as rule PROCEDURE-CALL except that $\tau_{i_1} = \tau_{i_2}$ and $C_f = \emptyset$</i></p> $\frac{\Gamma_g; \Gamma_l; p \vdash \text{call } f^{\text{Declassify}}(a_1, a_2, \dots, a_k) \Rightarrow \Gamma'_l; C'}{\text{ DECLASSIFY-CALL}}$	
$\Gamma'_l = \Gamma_l[x_1 \rightarrow \alpha_1][\dots][x_k \rightarrow \alpha_k], \text{ where } \alpha_i = \text{freshType}(), i \in [1, k]$ $\Gamma_g; \Gamma'_l; p \vdash c \Rightarrow \Gamma'_l; C$ $C_f = \text{Reduce}(\text{Simplify}(\text{Normalize}(C)))$ $\Gamma'_g = \Gamma_g[f \rightarrow (\text{procedure } f(x_1 : \eta_1, \dots, x_k : \eta_k), C_f)], \quad \eta_i = \begin{cases} \tau_i & \text{if } \text{Mode}(x_i) = \text{In} \\ \Gamma'_l(x_i) & \text{if } \text{Mode}(x_i) = \text{Out} \\ (\tau_i, \Gamma'_l(x_i)) & \text{if } \text{Mode}(x_i) = \text{InOut} \end{cases}$	
$\frac{\Gamma_g; \Gamma_l; p \vdash \text{procedure } f(x_1, \dots, x_k)\{c\} \Rightarrow \Gamma'_g}{\text{ PROCEDURE-DECL}}$	

Figure 5.2: *Type Constraints Generation Rules*

a mediator for transferring different information. Γ_g and Γ_l are used to record types for global and local variable respectively as specified in the rules `GLOBAL-VAR` and `LOCAL-VAR`. Type inference for both unary and binary expression are defined in rules `UNARY-EXP` and `BINARY-EXP`.

In type constraint generation rules for statement $(\Gamma_g; \Gamma_l; p \vdash c \Rightarrow \Gamma'_l; C)$, we define two different rules, `ASSIGN-GLOBAL-UPDATE` and `ASSIGN-LOCAL-UPDATE`, for assignments to global and local variables. The rule `ASSIGN-GLOBAL-UPDATE` defines the type constraint generation for assignment to global variable: first, we fetch the type τ' of the target variable x from Γ_g and infer the type T of the right hand side expression e , then, according to information security constraints, two types of constraints are generated: $T \leq \tau'$ and $p \leq \tau'$. It means that the security types of source information (either explicit or implicit) should be lower (or equal) than the security types of target information. Variable p denotes the security type of the context where the assignment happens. For the local variable, its security type changes with each assignment of new values. Thus, in the rule `ASSIGN-LOCAL-UPDATE` for local assignment, a fresh type variable α for x is generated with fresh function `freshType()`, followed by the generation of two type constraints for α and the update of Γ_l with new type variable α for x . For example:

— *assignment to a global variable* g_0 ,
 — *where* $\Gamma_g(g_0) = \tau$, $\Gamma_g; \Gamma_l \vdash x : \tau_1$, $\Gamma_g; \Gamma_l \vdash y : \tau_2$
 $g_0 = x + y;$

The produced type constraints for the above statement is $\{\tau_1 \sqcup \tau_2 \leq \tau, p \leq \tau\}$ with p being the type of path condition (or context) leading to this statement execution. While for assignment to local variables, as shown in the following,

— *assignment to a local variable* l_0 ,
 — *where* $\Gamma_g; \Gamma_l \vdash x : \tau_1$, $\Gamma_g; \Gamma_l \vdash y : \tau_2$
 $l_0 = x + y;$

first, we have to call `freshType()` to generate a fresh type variable τ_{new} , used for constraints generation of the above statement $\{\tau_1 \sqcup \tau_2 \leq \tau_{new}, p \leq \tau_{new}\}$, and then update Γ_l by

associating x with τ_{new} , which reflects the new type of the content held in x after the assignment.

In the rule IF for conditional statement, executed in the context p , if the type of conditional expression e is T , then generate type constraints separately for c_1 and c_2 under context $p \sqcup T$, finally merge the resulting constraints C' and C'' from both branches to get C''' , for example:

```

— conditional statement ,
— where  $y$  is a local variable , and
—  $\Gamma_g; \Gamma_l \vdash x : \tau_1, \Gamma_g; \Gamma_l \vdash m : \tau_2, \Gamma_g; \Gamma_l \vdash n : \tau_3$ 
if  $x > 0$  then
     $y := m$ ;
else
     $y := n$ ;
end if;

```

the type of conditional expression $x > 0$ is $\tau_1 \sqcup \perp$. The type constraints generated along the true branch are $C' = \{\tau_2 \leq \tau_{new1}, p \sqcup (\tau_1 \sqcup \perp) \leq \tau_{new1}\}$, and the type constraints generated in the false branch are $C'' = \{\tau_3 \leq \tau_{new2}, p \sqcup (\tau_1 \sqcup \perp) \leq \tau_{new2}\}$, where τ_{new1} and τ_{new2} are two fresh type variables generated by function $freshType()$. The final produced type constraints for conditional statement are $C''' = \{\tau_2 \leq \tau_{new1}, p \sqcup (\tau_1 \sqcup \perp) \leq \tau_{new1}, \tau_3 \leq \tau_{new2}, p \sqcup (\tau_1 \sqcup \perp) \leq \tau_{new2}\}$ by merging the resulting constraints of the both branches, that's $C''' = C' \cup C''$. The type mapping of local variables at the end of each branch are: $\Gamma'_l = \Gamma_l[y \rightarrow \tau_{new1}]$ and $\Gamma''_l = \Gamma_l[y \rightarrow \tau_{new2}]$. Thus, the final type mapping for local variables become $\Gamma'''_l = \Gamma_l[y \rightarrow \tau_{new1} \sqcup \tau_{new2}]$, that's $\Gamma'''_l = \Gamma'_l \sqcup \Gamma''_l$.

For sequent statement, generate type constraints sequentially for c_1 and c_2 , and use the union of their type constraints as its final constraint set, as specified in rule SEQUENCE .

Rule WHILE defines the type constraint generation procedure for the while loop statement, where $ModVar_{local}(c)$ calculates the set of local variables that maybe modified within the loop

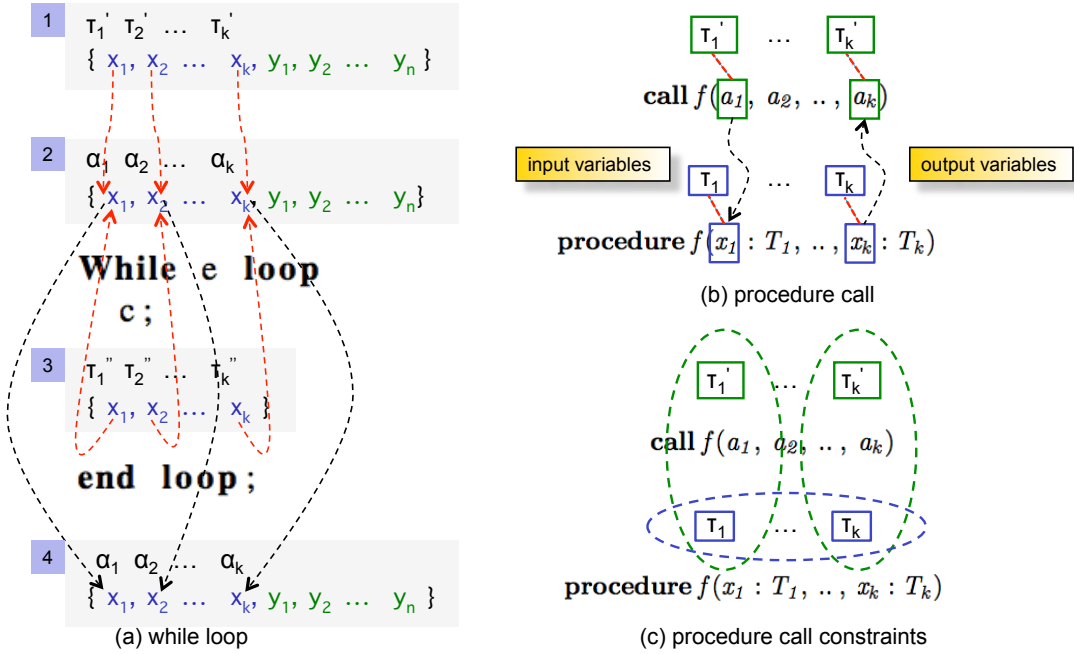


Figure 5.3: Type Constraints for While Loop

body c , Γ_l and Γ'_l are the type mapping for local variables before and after executing the while statement, and α_i is final fixed point type for the local variable x_i , $i \in [1, k]$. As illustrated in Figure 5.3 (a), the while loop is treated like a procedure call, all used variables, such as $\{x_1, \dots, x_k, y_1, \dots, y_n\}$, in while loop are serving as its interfaces/parameters: including both local variables and global variables. The types of those modified local variables, such as $\{x_1, \dots, x_k\}$, will reach a fixed point $\{\alpha_1, \dots, \alpha_k\}$ after several loop iterations and the types of other variables, both global variables and those used but unmodified local variables, such as $\{y_1, \dots, y_n\}$, will keep the same. Box 1 shows the types of used variables before entering while loop, where τ'_i is type for local variable x_i , $i \in [1, k]$, corresponding to $\Gamma_l(x_i)$ in the rule `WHILE`. As the type of y_i keeps the same during the while loop iteration, they are ignored to be tracked. Box 2 is fixed point type mapping for variables and it works as the interface of the while loop, with fresh type variable α_i being the fixed point type for x_i . Box 3 is type mapping for variables at the end of each loop iteration. In type constraint generation rule `WHILE`, type constraint set C_0 corresponds to $\{\tau'_i \leq \alpha_i \mid 1 \leq i \leq k\}$ between type mapping of Box 1 and Box 2, similar to type constraints for passing in value from

arguments to parameters in a procedure call; C' is type constraint set generated for while loop body c ; and C_1 corresponds to type constraint set $\{\tau_i'' \leq \alpha_i \mid 1 \leq i \leq k\}$ between Box 3 and Box 2, similar to type constraints for a recursive call by passing the values at the end of each iteration to the interface of the loop for next round of iteration. Box 4 is fixed type mapping after the while loop, which is the same as Box 2. For example:

```

— while loop ,
— where x, y, z are all local variables

while  $x > 0$  loop
     $z := x$ ;
     $x := y + z$ ;
end loop ;

```

assume that the types of x , y and z are τ_{x_0} , τ_{y_0} and τ_{z_0} when reaching the while loop and α_x , α_y and α_z , which are final fixed point types, when exiting the while loop. Fixed point type is the least upper bound type for all possible values that can be held in a local variable modified within the while loop body. The type of conditional expression $x > \theta$ based on fixed type of x is $\alpha_x \sqcup \perp$ and it guarantees that the generated type constraints for the while loop body can capture its all possible information flows. The produced type constraints for loop body are $C' = \{\alpha_x \leq \alpha_{z_1}, \alpha_x \sqcup \perp \leq \alpha_{z_1}, \alpha_y \sqcup \alpha_{z_1} \leq \alpha_{x_1}, \alpha_x \sqcup \perp \leq \alpha_{x_1}\}$, where α_{z_1} is the fresh type of z after the first assignment and α_{x_1} is the fresh type of x after the second assignment. The type constraints $C_0 = \{\tau_{x_0} \leq \alpha_x, \tau_{y_0} \leq \alpha_y, \tau_{z_0} \leq \alpha_z\}$ and $C_1 = \{\alpha_{x_1} \leq \alpha_x, \alpha_y \leq \alpha_y, \alpha_{z_1} \leq \alpha_z\}$ can ensure that the fixed types of x , y and z are always the upper bound types for whatever number of loop iterations. The complete type constraints for the while statement are $C'' = C_0 \cup C_1 \cup C'$, and the final local type mapping $\Gamma_l' = \Gamma_l[x \rightarrow \alpha_x][y \rightarrow \alpha_y][z \rightarrow \alpha_z]$.

In the rule PROCEDURE-CALL for procedure call $f(a_1, a_2, \dots, a_k)$, two kinds of constraints are generated: constraints between types of arguments and parameters C_i with $i \in [1, k]$, and constraints between types of parameters enforced by the procedure itself C_f' , as illustrated

in Figure 5.3 (b) (c). Type constraint generation for procedure call is similar to the one for assignments between arguments and parameters depending on the in/out mode of the parameters. To avoid the mess up for the case of calling the same procedure in multiple places, fresh type variables are introduced for types of parameters and their type constraints are updated accordingly with the fresh type variables. $\Gamma_g(f)$ extracts the type constraints for the parameters of the called procedure f , where η_i is the security type of the parameter x_i and C_f is the constraints between η_i , $i \in [1, k]$. If x_i is an input (or output) variable, in In (or Out) mode, $\eta_i = \tau_i$, meaning the type of any input arguments (or output parameters) should be less or equal to (or greater or equal than) τ_i ; if x_i is both an input and output variable, then η_i is a pair (τ_{i_1}, τ_{i_2}) , with τ_{i_1} enforcing the type constraint for the input arguments passed into x_i and τ_{i_2} for the output arguments returned from x_i . The function $\lambda_1(\tau)$ produces a fresh type variable to replace τ if τ is a type variable, or returns τ if it's a concrete type value, e.g. $\lambda_1(High)$ returns $High$, but $\lambda_1(\alpha)$ produces a fresh type variable α' . In function $\lambda_2(x, \tau_x)$, τ_x is the type of x , after the assignment to x , it produces a fresh type variable if x is a local variable, or returns τ_x if it's a global variable.

In order to do modular analysis for procedure, the types of its parameters and the associated constraints enforced by the information flow within the procedure body are generated once and used as a summary for type constraints for arguments whenever the procedure is called. The rule `PROCEDURE-CALL` specifies type constraints generation for a declared **procedure** $f(x_1, \dots, x_k)\{c\}$: first assign fresh type variable α_i for each parameter x_i , and then generate their type constraints C according to the procedure body. The resulting constraints C_f between types of parameters and global variables are stored as a summary for procedure f in Γ'_g . The constraint operators *Normalize* and *Simplify* are used for generating atomic constraints, computing constraint closure and simplifying constraints, which will be discussed in subsection 5.2.2. The operator *Reduce* removes all the type constraints except those about parameters and visible global variables. The parameters work as interface for receiving/returning the information from/to the external context, and their types and con-

straints are fixed when the procedure is called. Thus, the types of arguments should satisfy these constraints enforced on the parameters to guarantee the security of information flow within the procedure. For parameter x_i , if it's an input variable, it's security type will always be τ_i as it's only readable; if it's an output variable, it's final security type is $\Gamma'_l(x_i)$; and if it's both an input and output variable, it's type η_i is a pair $(\tau_i, \Gamma'_l(x_i))$ with τ_i being the input type of x_i and $\Gamma'_l(x_i)$ being the output type of x_i . For example:

```

— procedure declaration
procedure double(x: in Integer; y: out Integer) is
begin
  y := 2 * x;
end double;

```

to generate type constraint summary for procedure *double*, first we assign two fresh type variables α_1 and α_2 for parameters x and y , then generate their type constraints according to the information flow within the procedure body. In this example procedure, there is only one assignment that requires to enforce the constraints $\{\perp \sqcup \alpha_1 \leq \alpha_3\}$, where α_3 is a fresh type for y . After performing the normalization and simplification procedure (to be discussed later), we get the following type constraint summary: *procedure double*($x : \alpha_1, y : \alpha_3$) associated with constraints $\alpha_1 \leq \alpha_3$. It means that the parameter x accepts a value of type α_1 and the parameter y outputs a value of type α_3 , and it holds that $\alpha_1 \leq \alpha_3$. The usage of the type constraint summary can be illustrated in the following example:

```

— procedure calls ,
— where  $\Gamma_g; \Gamma_l \vdash m : \tau_1, \Gamma_l \vdash u : \tau_2$ 
...
double(m, g1);
double(u, g2);

```

if g_1 and g_2 are global variables with types τ_3 and τ_4 , then the type constraints generated for the first procedure call are $\{\tau_1 \leq \alpha'_1, \alpha'_3 \leq \tau_3, \alpha'_1 \leq \alpha'_3\}$ and the type constraints for the

second procedure call are $\{\tau_2 \leq \alpha_1'', \alpha_3'' \leq \tau_4, \alpha_1'' \leq \alpha_3''\}$. Each time when the procedure is called, all the type variables appearing in the procedure's constraint summary are replaced with some fresh type variables, e.g., in the first procedure call for *double*, α_1 and α_3 are replaced with fresh type variables α_1' and α_3' (α_1'' and α_3'' in the second procedure call). It can distinguish the type constraints generated for different procedure calls and reflect the polymorphism of type constraints for the called procedure.

5.2.2 Type Constraint Simplification

The type constraints produced by constraint generator can be huge and most of them can be either simplified or optimized away. To achieve this, we have designed a set of simplification rules for constraints after the normalization operation.

Normalization: It's a sequence of constraint transformations to finally get a set of *atomic* constraints. There are two types of constraints produced by the constraint generation rules, constraint for direct data flow from source information to target variable and the constraint for indirect control flow from the execution context to the enclosed execution statements. As we have discussed before, the target variable can be either global or local variables, and the type of global variable is fixed and the assignment to a local variable will always assign a fresh type variable to it, so the type of target variable is always τ , which is either some type variable or some concrete type value. Source information is expressed as an expression, whose type is T , having at most type operator \sqcup , and the type of context is sequence of conditional expressions that are joined with \sqcup operator, so the final produced constraints can only be in the form of $T \leq \tau$ that \sqcup is the only possible operation within T . The following is the normalization procedure for produced constraints:

$$C \cup \{T_1 \sqcup T_2 \leq \tau\} \Rightarrow_{norm} C \cup \{T_1 \leq \tau, T_2 \leq \tau\}$$

It means that for any constraint in the form of $T_1 \sqcup T_2 \leq \tau$, split it into two sub-constraints $T_1 \leq \tau$ and $T_2 \leq \tau$, and this procedure continues until all constraints are *atomic*.

In the previous section, we have given an example showing how to generate constraints for

a while loop, and here we will continue to show how to normalize the resulting constraints C'' , which is equal to $C_0 \cup C_1 \cup C'$ and $C_0 = \{\tau_{x_0} \leq \alpha_x, \tau_{y_0} \leq \alpha_y, \tau_{z_0} \leq \alpha_z\}$, $C_1 = \{\alpha_{x_1} \leq \alpha_x, \alpha_y \leq \alpha_y, \alpha_{z_1} \leq \alpha_z\}$, and $C' = \{\alpha_x \leq \alpha_{z_1}, \alpha_x \sqcup \perp \leq \alpha_{z_1}, \alpha_y \sqcup \alpha_{z_1} \leq \alpha_{x_1}, \alpha_x \sqcup \perp \leq \alpha_{x_1}\}$. Each constraint in C_0 and C_1 are already atomic, and only C' needs to be normalized. According to the normalization rule, $\alpha_x \sqcup \perp \leq \alpha_{z_1}$ is normalized to $\{\alpha_x \leq \alpha_{z_1}, \perp \leq \alpha_{z_1}\}$, and $\alpha_y \sqcup \alpha_{z_1} \leq \alpha_{x_1}$ is normalized to $\{\alpha_y \leq \alpha_{x_1}, \alpha_{z_1} \leq \alpha_{x_1}\}$, and $\alpha_x \sqcup \perp \leq \alpha_{x_1}$ is normalized to $\{\alpha_x \leq \alpha_{x_1}, \perp \leq \alpha_{x_1}\}$. The normalization results of C''' is $C'''_n = \{\tau_{x_0} \leq \alpha_x, \tau_{y_0} \leq \alpha_y, \tau_{z_0} \leq \alpha_z, \alpha_{x_1} \leq \alpha_x, \alpha_y \leq \alpha_y, \alpha_{z_1} \leq \alpha_z, \alpha_x \leq \alpha_{z_1}, \alpha_x \leq \alpha_{x_1}, \perp \leq \alpha_{z_1}, \alpha_y \leq \alpha_{x_1}, \alpha_{z_1} \leq \alpha_{x_1}, \alpha_x \leq \alpha_{x_1}, \perp \leq \alpha_{x_1}\}$.

Simplification: It's a procedure to remove redundant constraints, optimize away the constraints that are always true, type inference and others, following the above constraint normalization, which is performed in two steps:

First, compute the closure for the constraint set according to the transitivity rule of ordering. In other words, if both $\tau_1 \leq \alpha$ and $\alpha \leq \tau_2$ are in constraint set, then add $\tau_1 \leq \tau_2$ into the constraint set too. This procedure is repeated until no new constraints are added, as shown in the following rule:

$$C \cup \{\tau_1 \leq \alpha, \alpha \leq \tau_2\} \Rightarrow_{trans} C \cup \{\tau_1 \leq \alpha, \alpha \leq \tau_2, \tau_1 \leq \tau_2\}$$

Then, do simplification with the following rules.

- (1) $C \cup \{\tau_1 \leq \tau_2, \tau_1 \leq \tau_2\} \Rightarrow_{simp} C \cup \{\tau_1 \leq \tau_2\}$
- (2) $C \cup \{\perp \leq \tau\} \Rightarrow_{simp} C$
- (3) $C \cup \{\tau \leq \top\} \Rightarrow_{simp} C$
- (4) $C \cup \{\tau \leq \tau\} \Rightarrow_{simp} C$
- (5) $C \cup \{\ell_1 \leq \ell_2\} \Rightarrow_{simp} C$, **if** $\ell_1 \leq \ell_2$, **otherwise** report error
- (6) $C \cup \{\alpha \leq \tau, \tau \leq \alpha\} \Rightarrow_{antisym} (C[\tau/\alpha], \Gamma_g[\tau/\alpha])$
- (7) $C \cup \{\ell_1 \leq \alpha\} \cup \{\ell_2 \leq \alpha\} \Rightarrow_{simp} (C[\top/\alpha], \Gamma_g[\top/\alpha])$, **if** $\ell_1 \sqcup \ell_2 = \top$
- (8) $C \cup \{\alpha \leq \ell_1\} \cup \{\alpha \leq \ell_2\} \Rightarrow_{simp} (C[\perp/\alpha], \Gamma_g[\perp/\alpha])$, **if** $\ell_1 \sqcap \ell_2 = \perp$
- (9) $C \cup \{\ell \leq \alpha\} \Rightarrow_{simp} (C[\ell/\alpha], \Gamma_g[\ell/\alpha])$, **if** there is no ℓ' that $\ell \leq \ell'$
- (10) $C \cup \{\alpha \leq \ell\} \Rightarrow_{simp} (C[\ell/\alpha], \Gamma_g[\ell/\alpha])$, **if** there is no ℓ' that $\ell' \leq \ell$

Rule (1) removes the redundant constraint, and rules (2)-(4) optimize away the constraints that will always hold, and rule (5) reports error if the constraints enforced by the

security policy are violated. Rules (6)-(10) infer types for type variable in different cases, for example, in rule (7), if there are both $\ell_1 \leq \alpha$ and $\ell_2 \leq \alpha$ with condition $\ell_1 \sqcup \ell_2 = \top$ holds, then we can infer that $\top = \ell_1 \sqcup \ell_2 \leq \alpha$, thus α can only be \top . For the rule (9), if there exists constraint $\ell \leq \alpha$ and there is no ℓ' other than ℓ making $\ell \leq \ell'$ true, then α is ℓ , for example, if ℓ is \top , then no type satisfying $\top \leq \alpha$ except \top itself.

The final constraint set C is a set of atomic constraints in the form of: $\alpha \leq \ell$, $\ell \leq \alpha$ or $\alpha_1 \leq \alpha_2$.

To continue on the while loop example, we will show how to apply the simplification rules to $C_n''' = \{\tau_{x_0} \leq \alpha_x, \tau_{y_0} \leq \alpha_y, \tau_{z_0} \leq \alpha_z, \alpha_{x_1} \leq \alpha_x, \alpha_y \leq \alpha_y, \alpha_{z_1} \leq \alpha_z, \alpha_x \leq \alpha_{z_1}, \alpha_x \leq \alpha_{z_1}, \perp \leq \alpha_{z_1}, \alpha_y \leq \alpha_{x_1}, \alpha_{z_1} \leq \alpha_{x_1}, \alpha_x \leq \alpha_{x_1}, \perp \leq \alpha_{x_1}\}$. To be simple, we skip the computation of the closure set for C_n''' . The resulting simplified constraint set $C_s''' = \{\tau_{x_0} \leq \alpha_x, \tau_{y_0} \leq \alpha_y, \tau_{z_0} \leq \alpha_z, \alpha_{x_1} \leq \alpha_x, \alpha_{z_1} \leq \alpha_z, \alpha_x \leq \alpha_{z_1}, \alpha_y \leq \alpha_{x_1}, \alpha_{z_1} \leq \alpha_{x_1}, \alpha_x \leq \alpha_{x_1}\}$ by removing $\perp \leq \alpha_{z_1}$ and $\perp \leq \alpha_{x_1}$ with rule (2), removing $\alpha_y \leq \alpha_y$ with rule (4), and $\alpha_x \leq \alpha_{z_1}$ with rule (1).

5.2.3 Type Constraint Satisfiability

There have been a lot of work done on the type interference with subtyping constraints. Some focus on the general algorithms for type inference, such as^{54,55,56}, and some study the inherent difficulty of the problem such as^{57,58}, which showed that the general constraint satisfaction problem is PSPACE-complete. Paper⁵⁸ gives a sound decision procedure for checking satisfiability of the subtyping constraints, and proves that the satisfiability problem for subtyping constraints is solvable if the poset of atomic subtypings is a disjoint union of lattices. Since our goal is to check the security of the program with respect to the security policy, we only need to check the satisfiability of its type constraint set. In other words, the program is secure if its type constraints are solvable, otherwise, it's insecure. In this work, we will use the checking algorithm proposed in⁵⁸.

Theorem 1 (proved in⁵⁸). Subtyping constraint set \mathcal{C} is satisfiable in \mathcal{L} iff (1) it's weakly satisfiable and (2) ground consistent, where \mathcal{L} is a poset which is a disjoint union of lattices and \mathcal{C} is a flat system of constraints.

\mathcal{C} is said to be flat if each of its term is atomic constraint, which is satisfied for our generated type constraints after simplification. User defined partial order set of security types with *Ordered* aspect are corresponding to \mathcal{L} , which is a disjoint union of lattices $\mathcal{L} = \mathcal{L}_1 \cup \dots \cup \mathcal{L}_m$. Then, the satisfiability problem can be achieved by checking whether the following two conditions hold:

1. \mathcal{C} is weakly satisfiable with respect to \mathcal{L} . $\mathcal{C} = \{\tau_1 \leq \tau'_1, \dots, \tau_n \leq \tau'_n\}$ is weakly satisfiable if $\mathcal{C}_* = \{(\tau_1)_* = (\tau'_1)_*, \dots, (\tau_n)_* = (\tau'_n)_*\}$ is satisfiable, which is a unification problem and thus can be decidable in polynomial time. $(\tau)_*$ is called a shape of τ and it's defined as: (a) $(\ell)_* = *_i$ if $\ell \in \mathcal{L}_i$, (b) $(x)_* = x$, where ℓ denotes a concrete security type and x is a type variable.
2. \mathcal{C} is ground consistent with respect to \mathcal{L} . \mathcal{C} is ground consistent if for all $\ell, \ell' \in \mathcal{L}$, $\ell \leq \ell'$ holds in \mathcal{L} whenever $\mathcal{C} \vdash_s \ell \leq \ell'$, where $\ell \leq \ell'$ is either a term of \mathcal{C} or can be computed from its transitive closure.

For example, if there are two ordered domains *LOW* and *HIGH* in the lattice \mathcal{L}_1 , with $LOW \leq HIGH$, and there are two global variables g_1 and g_2 belonging to domains *LOW* and *HIGH* separately, as shown in the following:

```

type Domains is (LOW, HIGH) with Ordered; —  $LOW \leq HIGH$ 
 $g_1$ : Integer with Domain  $\Rightarrow$  LOW;
 $g_2$ : Integer with Domain  $\Rightarrow$  HIGH;
procedure f1(X: in Integer, Y: out Integer) is
begin
  Y :=  $g_1 + g_2$ ;

```

```

    g2 := X;
end f1;
procedure f2(X: in Integer) is
begin
    X := g2;
    g1 := X;
end f2;

```

For the procedure f_1 , given the type variable τ_1 for X and τ_2 for Y , we will have the constraint set $\mathcal{C} = \{LOW \leq \tau_2, HIGH \leq \tau_2, \tau_1 \leq HIGH\}$ for the procedure by the type constraint generation rules. According to the above satisfiability conditions, (1) \mathcal{C} is weakly satisfiable as $\mathcal{C}_* = \{(Low)_* = (\tau_2)_*, (HIGH)_* = (\tau_2)_*, (\tau_1)_* = (HIGH)_*\}$, which can be simplified to $\{*_1 = \tau_2, *_1 = \tau_2, \tau_1 = *_1\}$, and it's satisfiable when both τ_1 and τ_2 are $*_1$, which can be either LOW or $HIGH$; and (2) \mathcal{C} is ground consistent with respect to \mathcal{L}_1 as there is no $HIGH \leq LOW$ in \mathcal{C} or its transitive closure, thus \mathcal{C} is satisfiable.

For the procedure f_2 , given the type variable τ for X , we will have the constraint set $\mathcal{C} = \{HIGH \leq \tau, \tau \leq LOW\}$ for the procedure. According to the above satisfiability conditions, (1) \mathcal{C} is weakly satisfiable as $\mathcal{C}_* = \{(HIGH)_* = (\tau)_*, (\tau)_* = (LOW)_*\}$, which can be simplified to $\{*_1 = \tau, \tau = *_1\}$, and it's satisfiable when τ is $*_1$, which can be either LOW or $HIGH$; but (2) \mathcal{C} is not ground consistent as there is $HIGH \leq LOW$ in the transitive closure of \mathcal{C} , thus \mathcal{C} is not satisfiable.

5.3 Example

In SPARK, a method can be defined with either *procedure* or *function*, where *procedure* allows side-effects to externally visible variables while *function* cannot.

Figure 5.4 (a) shows excerpts of a SPARK program with four global integer variables (*Key*, *SSN*, *BankAccount*, *Disk*) and three procedures (*Encrypt*, *Write*, *Write_E*). Proce-

<pre> Key: Integer; SSN: Integer; BankAccount: Integer; Disk: Integer; procedure Encrypt(K: in Integer; V: in Integer; R: out Integer) is begin R := K * V; -- encryption simulation; end Encrypt; procedure Write() is Result: Integer; begin Encrypt(Key, SSN, Result); Disk := Result; end Write; procedure Write_E() is Result: Integer; begin Encrypt(Key, BankAccount, Result); Disk := Result; end Write_E; </pre> <p style="text-align: center;">(a)</p>	<pre> type Domains is (Public, Secret, TopSecret) with Ordered; Key: Integer with Domain => Secret; SSN: Integer with Domain => Secret; BankAccount: Integer with Domain => TopSecret; Disk: Integer with Domain => Public; procedure Encrypt(K: in Integer; V: in Integer; R: out Integer) with Declassifier, Domain => (K => Secret, V => Secret, R => Public) is begin R := K * V; -- encryption simulation; end Encrypt; procedure Write() is Result: Integer; begin Encrypt(Key, SSN, Result); Disk := Result; end Write; procedure Write_E() is Result: Integer; begin Encrypt(Key, BankAccount, Result); Disk := Result; end Write_E; </pre> <p style="text-align: center;">(b)</p>
--	---

Figure 5.4: *Illustration of Declassification Policy Framework*

procedure *Encrypt* simulates a simple encryption operation by encrypting value V with key K and putting the encrypted result in R . Procedure *Write* encrypts SSN and writes the result on $Disk$, and procedure *Write_E* puts the encrypted $BankAccount$ on $Disk$.

The security requirements for the information of the system can be described as the following: all secret information should be encrypted before they are stored on disk, while top secrets should not allow to be stored on disk even after encryption. We assume that Key and SSN are classified as secret information, $BankAccount$ as top secret, and $Disk$ is accessible to the public. Furthermore, procedure *Encrypt* is assumed to perform our desired encryption function. Now the question is how can we verify that the program is information secure with respect to the above specified security requirements.

Figure 5.4 (b) shows the program specified with our proposed security policy framework to automatically enforce the above security requirements, where the code highlighted with green bars is the specification of the required information security contracts for the

program to be analyzed. In this paper, we propose to define security domains as an enumeration type annotated with a special aspect called *Ordered*. For example, the enumeration type *Domains* is defined as a type of security domains and the aspect *Ordered* by default means totally ordering between domain values: $\{Public \leq Secret, Secret \leq TopSecret, Public \leq TopSecret\}$, which means information of lower security domain is allowed to flow into destination of higher domains. Following the definition of the type of security domain are the associations of security domains with variables holding information of our interests. The aspect *Domain* binds the security domain for the specified variable, for example, *Key* is associated with domain *Secret*. To specify the declassification policy, we introduce another new aspect called *Declassifier*, which means the declassification of information from one domain to another. *Encrypt* is specified with *Declassifier* aspect, with security domain association for each of its parameters. It means that *Encrypt* is a trusted declassifier function to perform declassification of information from *Secret* domain (K, V) to *Public* domain (R) .

With user specified information contract, our last step is to check whether the program satisfies the declassification policy or not. First, we need to build the inter-procedure call graph, and then do static analysis for each procedure in a bottom-up way. In this example, *Encrypt* is called by both *Write* and *Write_E*, so we start with *Encrypt*. When we analyze *Encrypt*, we find that it's a *Declassifier*, so we just skip it as it's specified by the user as a trusted declassification function. Then we reach *Write* and get into its implementation body. On procedure call *Encrypt*, it will pass in the value of global variables *Key* and *SSN* to parameters *K* and *V*, which would generate type constraints $\{Secret \leq Secret, Secret \leq Secret\}$ as required by the secure information flow rules that the security domain of source information should be less restrictive than the security domain of target information. On the return of procedure call *Encrypt*, it will pass out the return value from parameter *R* to local variable *Result*, which will produce type constraints $\{Public \leq \alpha\}$ as the local variable *Result* is defined without any security domain association so we assign it a fresh type variable α . For assignment following the *Encrypt* call, the type constraint $\{\alpha \leq Public\}$

is generated. Finally, we get the constraints $\{Secret \leq Secret, Secret \leq Secret, Public \leq \alpha, \alpha \leq Public\}$. Obviously, these constraints are satisfiable when α takes the security domain *Public*.

For procedure *Write_E*, we can analyze it in the same way, and finally we will get the following constraints $\{Secret \leq Secret, TopSecret \leq Secret, Public \leq \alpha, \alpha \leq Public\}$. As we can see, $TopSecret \leq Secret$ violates the security requirement. So, from the above analysis, we can conclude that *Write* is secure while *Write_E* is not.

This section gives an example to show how we can use the security policy framework to automatically enforce the information security requirements. In the following sections, we will discuss in detail about our proposed security policy framework.

5.4 Soundness of Policy Enforcement

5.4.1 Operational Semantics

Usually, an information flow from u to v is said to be secure whenever $\Gamma(u) \leq \Gamma(v)$ holds. But, the introduction of declassifier procedures makes it possible to allow information flow that doesn't need strictly follow the condition $\Gamma(u) \leq \Gamma(v)$ as long as the information flow goes through some trust declassifiers and satisfies their constraints. A program is secure with respect to a declassification policy iff (1) either the program is a declassifier to be trusted, or (2) all information flow incurred in each transition of the program is secure. To formally define the security of information flow and prove the soundness of the policy enforcement algorithm, we have given the formal semantics of the language with declassifier procedures, as shown in Figure 5.5.

The major difference of this semantics is the one for procedure call of declassifier, as shown in the rule `DECLASSIFYs`. For a declassifier procedure as specified by the user, as long as the security type of the arguments is compatible with the type of parameters, the information flow within the procedure is assumed to be secure. For example, for a declassifier procedure

$$\begin{array}{c}
\frac{}{\llbracket n \rrbracket_s = n} \text{LIT}_s \qquad \frac{}{\llbracket x \rrbracket_s = s(x)} \text{VAR}_s \qquad \frac{\llbracket e \rrbracket_s = v}{\llbracket \Box e \rrbracket_s = \Box v} \text{UNEXP}_s \qquad \frac{\llbracket e_1 \rrbracket_s = v_1 \quad \llbracket e_2 \rrbracket_s = v_2}{\llbracket e_1 \odot e_2 \rrbracket_s = v_1 \odot v_2} \text{BINEXP}_s \\
\\
\frac{\llbracket e \rrbracket_s = v \quad s' = s[x \rightarrow v]}{s \llbracket x := e \rrbracket_s s'} \text{ASSIGN}_s \quad \frac{\llbracket e \rrbracket_s = \text{true} \quad s \llbracket c_1 \rrbracket_s s'}{s \llbracket \text{if } e \text{ then } c_1 \text{ else } c_2 \rrbracket_s s'} \text{IFT}_s \quad \frac{\llbracket e \rrbracket_s = \text{false} \quad s \llbracket c_2 \rrbracket_s s'}{s \llbracket \text{if } e \text{ then } c_1 \text{ else } c_2 \rrbracket_s s'} \text{IFF}_s \\
\\
\frac{s \llbracket c_1 \rrbracket_s s_1 \quad s_1 \llbracket c_2 \rrbracket_s s'}{s \llbracket c_1; c_2 \rrbracket_s s'} \text{SEQ}_s \quad \frac{s \text{PassIn}(f(a_1, a_2, \dots, a_k)) s_1 \quad s_1 \llbracket f_{\text{body}} \rrbracket_s s_2 \quad s_2 \text{PassOut}(f(a_1, a_2, \dots, a_k)) s'}{s \llbracket \text{call } f(a_1, a_2, \dots, a_k) \rrbracket_s s'} \text{CALL}_s \\
\\
\text{procedure } f^{\text{Declassify}}(x_1 : \tau_1, \dots, x_k : \tau_k) \text{ with } \tau_i \text{ being specified security type of } x_i, i \in [1, k] \\
s \llbracket p(x_1, a_1); \dots; p(x_k, a_k) \rrbracket_s s', \quad p(x_i, a_i) ::= \begin{cases} \mathcal{D}_{\tau_i} := a_i & \text{if } \text{Mode}(x) = \text{In/InOut} \\ a_i := \mathcal{S}_{\tau_i} & \text{if } \text{Mode}(x) = \text{Out/InOut} \end{cases} \quad i \in [1, k] \\
\hline
s \llbracket \text{call } f^{\text{Declassify}}(a_1, a_2, \dots, a_k) \rrbracket_s s' \quad \text{DECLASSIFY}_s \\
\\
\frac{\llbracket e \rrbracket_s = \text{false}}{s \llbracket \text{while } e \text{ do } c \rrbracket_s s} \text{WHILEF}_s \quad \frac{\llbracket e \rrbracket_s = \text{true} \quad s \llbracket c \rrbracket_s s_1 \quad s_1 \llbracket \text{while } e \text{ do } c \rrbracket_s s'}{s \llbracket \text{while } e \text{ do } c \rrbracket_s s'} \text{WHILET}_s
\end{array}$$

Figure 5.5: Operational Semantics

to declassify information from High to Low, as long as the type of the information to be declassified is less than and equal to High, and the type of the resulting argument is greater than and equal to Low, then it's a secure procedure call. So declassifier procedure is specified to be a trust procedure and work like a black box, we don't need to track the information flow within it. Based on this assumption, we define the semantics for calling declassifier procedure as a sequence of assignments between arguments and some security domain source and destination. For any security domain τ , we introduce two global variables \mathcal{S}_τ (representing information source from domain τ) and \mathcal{D}_τ (representing information destination to domain τ) such that \mathcal{D}_τ is used to receive data from domain τ and \mathcal{S}_τ is used to produces data of domain τ . So, for any input argument a_i , if the type of its corresponding parameter is τ_i , then we translate it into the assignment $\mathcal{D}_{\tau_i} := a_i$; and for any output argument a_j , if the type of its corresponding parameter is τ_j , then we translate it into the assignment $a_j := \mathcal{S}_{\tau_j}$. In the rule CALL_s , $\text{PassIn}(f(a_1, a_2, \dots, a_k))$ passes in the arguments to the procedure f by assigning a_i to x_i when x_i is a parameter with *in* or *in out* mode, and $\text{PassOut}(f(a_1, a_2, \dots, a_k))$ passes out the resulting values when the procedure call returns by assigning x_j to a_j when x_j is a parameter with *out* or *in out* mode, where $i, j \in [1..k]$.

5.4.2 Security of Information Flow

τ -Equal (\equiv_{τ}^{Γ}). $\forall s t, s \equiv_{\tau}^{\Gamma} t$ iff $\llbracket x \rrbracket_s = \llbracket x \rrbracket_t$ for all x that $\Gamma(x) \leq \tau$.

For example, for two states s and t , with $s = \{l : 1, h : 3\}$ and $t = \{l : 1, h : 5\}$, if $\Gamma(l) = LOW$ and $\Gamma(h) = HIGH$ and $LOW \leq HIGH$, then we would say that $s \equiv_{LOW}^{\Gamma} t$, but $s \not\equiv_{HIGH}^{\Gamma} t$ as they don't agree on the value of *HIGH* variable h .

Security ($\Gamma \vdash Secure(c)$). $\forall s s' t t', s \llbracket c \rrbracket s'$ and $t \llbracket c \rrbracket t', \forall \tau \in security\ lattice, s' \equiv_{\tau}^{\Gamma} t'$ whenever $s \equiv_{\tau}^{\Gamma} t$.

The definition of the program security looks similar to the standard end-to-end noninterference property, but its based program semantics as shown in Figure 5.5 is different with standard semantics because of the introduction of declassification. For example,

— Assume two domains *LOW* and *HIGH*, with $LOW \leq HIGH$, and

— $\Gamma(l) = LOW$

— $\Gamma(time) = LOW$

— $\Gamma(h) = HIGH$

$v: Integer := h + time;$

$Encrypt(v, l);$

the above program is intended to attach a *time* property to a *HIGH* information h before it's encrypted and stored on a *LOW* variable l . The $Encrypt(x, y)$ is a declassifier function that makes it legal to transfer *HIGH* information (through parameter x) to *LOW* destination (through parameter y) after the encryption. Based on standard end-to-end noninterference property, the information flow within the program is insecure, which deviates from our expectation, as for any two initial states s and t , whenever $s \equiv_{LOW}^{\Gamma} t$, the conclusion $s' \equiv_{LOW}^{\Gamma} t'$ will not always hold for the final states s' and t' because the *LOW* variable l depends on the initial values of both *LOW* variable *time* and *HIGH* variable h . While, in our new semantics for program with declassification, two global dummy variables are introduced for each domain, that's \mathcal{S}_{LOW} and \mathcal{D}_{LOW} for *LOW* domain, and \mathcal{S}_{HIGH} and \mathcal{D}_{HIGH} for *HIGH* domain, and the program is transformed into the

following form:

v : Integer := h + time;

\mathcal{D}_{HIGH} := v;

l := \mathcal{S}_{LOW} ;

The security requirement for assignment $\mathcal{D}_{HIGH} := v$ guarantees the compatibility of the domain of v with the domain $HIGH$ and enforces that the declassifier function *Encrypt* can only declassify information from $HIGH$ compatible domains. Similarly, the assignment $l := \mathcal{D}_{LOW}$ reflects the user's view of information returned by *Encrypt*, that's, variable l receives some information from LOW domain that has been preprocessed (or declassified) from other domain. It does not matter how the declassification is processed within the declassifier function *Encrypt* as long as it's trusted, and for the user of the declassifier function, he will be guaranteed to get a value that can be visible in LOW domain once he gives a value compatible with $HIGH$ domain and there will be no information leak. So it make sense to do the program transformation for the procedure call of declassifier functions. Based on the semantics of the transformed program, we can prove the information flow security for the program: for any two initial states s and t , whenever $s \equiv_{LOW}^{\Gamma} t$, that's $\llbracket l \rrbracket_s = \llbracket l \rrbracket_t \wedge \llbracket time \rrbracket_s = \llbracket time \rrbracket_t \wedge \llbracket \mathcal{S}_{LOW} \rrbracket_s = \llbracket \mathcal{S}_{LOW} \rrbracket_t$, the conclusion $s' \equiv_{LOW}^{\Gamma} t'$ will always hold for the final states s' and t' , as l only depends on \mathcal{S}_{LOW} and $time$ depends on itself.

5.4.3 Soundness of Policy Enforcement

Well-Typedness ($\Gamma \vdash WellTyped(s)$): $\forall \Gamma s$,

($\forall x y_1 \dots y_k$,

x in state $s \wedge x$ derives from $\{y_1, \dots, y_k\} \rightarrow$

$\Gamma(y_1) \leq \Gamma(x) \wedge \dots \wedge \Gamma(y_k) \leq \Gamma(x)$

) $\rightarrow \Gamma \vdash WellTyped(s)$.

Well-typedness means that for any state variable x of a well typed state s , the types of its derived values should be less than and equal to its type. In other words, for any state variable x , there exists a function f_x such that the final value of x can be found as: $f_x(y_1, \dots, y_k)$, with the

condition $\Gamma(y_i) \leq \Gamma(x)$, $i \in [1..k]$, being satisfied.

Lemma Well-Typedness-Preserve: $\forall \Gamma_g \Gamma_l \Gamma'_l C p c s s'$,

$$\begin{aligned} & \Gamma_g; \Gamma_l; p \vdash c \Rightarrow \Gamma'_l; C \rightarrow C \text{ is satisfiable} \rightarrow \\ & s \llbracket c \rrbracket s' \rightarrow \Gamma_g; \Gamma_l \vdash \text{WellTyped}(s) \rightarrow \\ & \Gamma_g; \Gamma'_l \vdash \text{WellTyped}(s'). \end{aligned}$$

For any well-formed program c , with $\Gamma_g; \Gamma_l; p \vdash c \Rightarrow \Gamma'_l; C$, the program is secure with respect to the declassification policy if the constraints C is satisfiable.

Theorem Soundness: $\forall \Gamma_g \Gamma_l \Gamma'_l C p c$,

$$\begin{aligned} & \Gamma_g; \Gamma_l; p \vdash c \Rightarrow \Gamma'_l; C \rightarrow \\ & C \text{ is satisfiable} \rightarrow \\ & \Gamma_g \vdash \text{Secure}(c). \end{aligned}$$

With the lemma Well-Typedness-Preserve (to be proved later), the proof for the soundness theorem is straightforward: given assumptions $(A_1) \Gamma_g; \Gamma_l; p \vdash c \Rightarrow \Gamma'_l; C$, with $(A_2) C$ being satisfiable, and $(A_3) s \llbracket c \rrbracket s'$ and $(A_4) t \llbracket c \rrbracket t'$, our goal is to prove that *(Goal)* for any security domain τ , if $s \equiv_{\tau}^{\Gamma_g} t$ then $s' \equiv_{\tau}^{\Gamma_g} t'$. In our security policy enforcement framework, user has to specify the security domains for the global variables that are security critical, and make sure that information of different domains cannot interference with each other unless through the user specified declassification procedures. At any initial state of the program c , the value of any state variable x depends on itself, that's $f_x(x)$ and it holds that $\Gamma(x) \leq \Gamma(x)$. Thus, we get $(A_5) \Gamma_g; \Gamma_l \vdash \text{WellTyped}(s)$ and $(A_6) \Gamma_g; \Gamma_l \vdash \text{WellTyped}(t)$. By applying the lemma Well-Typedness-Preserve on (A_1) (A_2) (A_3) and (A_5) , we get $\Gamma_g; \Gamma'_l \vdash \text{WellTyped}(s')$; similar application can lead to $\Gamma_g; \Gamma'_l \vdash \text{WellTyped}(t')$. In other words, for any global variable x of domain τ , where $\tau = \Gamma_g(x)$, there exists a function f_x such that the final value of x (in both states s' and t') at the end of the program execution can be represented as $f_x(y_1, \dots, y_k)$ and $\Gamma_g(y_i) \leq \tau$ for $i \in [1..k]$, thus $\llbracket x \rrbracket_{s'} = \llbracket x \rrbracket_{t'}$ when $s \equiv_{\tau}^{\Gamma_g} t$, and the conclusion for *(Goal)* is done.

Proof for Lemma Well-Typedness-Preserve. The lemma can be proved by a structural induction on $\Gamma_g; \Gamma_l; p \vdash c \Rightarrow \Gamma'_l; C$ as shown in the below:

case 1: c is $(x := e)$, and our goal is to prove that $\Gamma_g; \Gamma'_l \vdash \text{WellTyped}(s')$. First, assume that $\Gamma_g; \Gamma_l \vdash e : T$. If x is a local variable, we will get $C = \{T \leq \alpha, p \leq \alpha\}$ with $\alpha = \text{freshType}()$ and $\Gamma'_l = \Gamma_l[x \rightarrow \alpha]$. As $\Gamma_g; \Gamma_l \vdash \text{WellTyped}(s)$, it can be inferred that, for any used variable x_e in e with type τ_{x_e} , it holds that $\tau_{x_e} \leq T$, and there exists a function f_{x_e} such that the value of x_e can be found as $f_{x_e}(y_1, \dots, y_m)$ with $\tau_{y_i} \leq \tau_{x_e}$ and τ_{y_i} being the type of y_i , thus $\tau_{y_i} \leq T$ for $i \in [1..m]$. Similarly, for any variable x_c in conditions leading to the assignment, it holds that $\tau_{x_c} \leq p$, with τ_{x_c} being the type of x_c and p being the type of conditions, and there exists a function f_{x_c} such that the value of x_c can be found as $f_{x_c}(z_1, \dots, z_n)$ with $\tau_{z_i} \leq \tau_{x_c}$ and τ_{z_i} being the type of z_i , thus $\tau_{z_i} \leq p$ for $i \in [1..n]$. With constraint C being true, we can infer that $\tau_{y_i} \leq \alpha$ from $\tau_{y_i} \leq T$ and $T \leq \alpha$ for $i \in [1..m]$, and $\tau_{z_i} \leq \alpha$ from $\tau_{z_i} \leq p$ and $p \leq \alpha$ for $i \in [1..n]$. As x is data-dependent on y_i , with $\tau_{y_i} \leq \alpha$ for $i \in [1..m]$ and control-dependent on z_i , with $\tau_{z_i} \leq \alpha$ for $i \in [1..n]$, we get that x is well-typed in state s' after the assignment and the well-typedness for other variables will carry over from s to s' , thus we prove that s' is well-typed.

If x is a global variable and $\Gamma_g(x) = \tau$, we will get $C = \{T \leq \tau, p \leq \tau\}$ and $\Gamma'_l = \Gamma_l$. Similar to the proof of the assignment to local variables, as $\Gamma_g; \Gamma_l \vdash \text{WellTyped}(s)$ and in the assignment, x is updated with the value e under some condition of type p , the truth of the constraints C can guarantee that the type of the source value domain for the updated x in s' is $\leq \tau$, thus $\Gamma_g; \Gamma_l \vdash \text{WellTyped}(s')$ holds.

case 2: c is **(if e then c_1 else c_2)**. As an inductive case, it introduces two induction hypotheses: $IH1 : \forall s s', C_1 \text{ is satisfiable} \rightarrow s \llbracket c_1 \rrbracket s' \rightarrow \Gamma_g; \Gamma_l \vdash \text{WellTyped}(s) \rightarrow \Gamma_g; \Gamma_{l_1} \vdash \text{WellTyped}(s')$, and $IH2 : \forall s s', C_2 \text{ is satisfiable} \rightarrow s \llbracket c_2 \rrbracket s' \rightarrow \Gamma_g; \Gamma_l \vdash \text{WellTyped}(s) \rightarrow \Gamma_g; \Gamma_{l_2} \vdash \text{WellTyped}(s')$, with $\Gamma_g; \Gamma_l; p \sqcup T \vdash c_1 \Rightarrow \Gamma_{l_1}; C_1$ and $\Gamma_g; \Gamma_l; p \sqcup T \vdash c_2 \Rightarrow \Gamma_{l_2}; C_2$ and $\Gamma_g; \Gamma_l \vdash e : T$. The assumption is that constraints C is satisfiable, with $C = C_1 \sqcup C_2$.

If $\llbracket e \rrbracket_s = \text{true}$, then $s \llbracket \text{if } e \text{ then } c_1 \text{ else } c_2 \rrbracket s' = s \llbracket c_1 \rrbracket s'$. C_1 is satisfiable as it's a subset of satisfiable C , by applying the induction hypothesis $IH1$, we get $\Gamma_g; \Gamma_{l_1} \vdash \text{WellTyped}(s')$.

If $\llbracket e \rrbracket_s = \text{false}$, then $s \llbracket \text{if } e \text{ then } c_1 \text{ else } c_2 \rrbracket s' = s \llbracket c_2 \rrbracket s'$. C_2 is satisfiable as it's a subset of

satisfiable C , by applying the induction hypothesis $IH2$, we get $\Gamma_g; \Gamma_{l_2} \vdash WellTyped(s')$.

Now we have proved that at the end of each branch s' is well-typed, and our goal is to prove $\Gamma_g; \Gamma'_l \vdash WellTyped(s')$ at the merging point of the two branches, where $\Gamma'_l = \Gamma_{l_1} \sqcup \Gamma_{l_2}$. For any variable x in s' , if it's a global variable, we can conclude that there exists a function f_{x_t} such that the value of x can be found as $f_{x_t}(y_{t1}, \dots, y_{tm})$, with $\tau_{y_{ti}} \leq \tau_x$ for $i \in [1..m]$, in the true branch and there exists a function f_{x_f} such that the value of x can be found as $f_{x_f}(y_{f1}, \dots, y_{fn})$, with $\tau_{y_{fi}} \leq \tau_x$ for $i \in [1..n]$, in the false branch. So, there should exist a function f_x such that the value of x at the end of the conditional statement can be found as $f_x(y_{t1}, \dots, y_{tm}, y_{f1}, \dots, y_{fn})$, with $\tau_{y_{ti}} \leq \tau_x$ for $i \in [1..m]$ and $\tau_{y_{fi}} \leq \tau_x$ for $i \in [1..n]$. Similarly, if it's a local variable, the type of its source value domain is $\leq \Gamma_{l_1}(x)$ in true branch and $\leq \Gamma_{l_2}(x)$ in false branch, so it's $\leq \Gamma'_l(x)$ as $\Gamma'_l(x) = \Gamma_{l_1}(x) \sqcup \Gamma_{l_2}(x)$. Finally, we reach that $\Gamma_g; \Gamma'_l \vdash WellTyped(s')$.

case 3: c is (**while** e **do** c_1). As an inductive case, it introduces the induction hypothesis: $IH : \forall s s', C_1 \text{ is satisfiable} \rightarrow s \llbracket c_1 \rrbracket s' \rightarrow \Gamma_g; \Gamma'_l \vdash WellTyped(s) \rightarrow \Gamma_g; \Gamma_{l_1} \vdash WellTyped(s')$, with $\Gamma_g; \Gamma'_l; p \sqcup T \vdash c_1 \Rightarrow \Gamma_{l_1}; C_1$ and $\Gamma'_l = \Gamma_l[x_1 \rightarrow \alpha_1][\dots][x_k \rightarrow \alpha_k]$, where α_i is the fixed-point type of local variable x_i that maybe modified within loop body, and $\Gamma_g; \Gamma'_l \vdash e : T$.

If $\llbracket e \rrbracket_s = false$, then $s' = s$, thus $\Gamma_g; \Gamma_l \vdash WellTyped(s')$ whenever $\Gamma_g; \Gamma_l \vdash WellTyped(s)$. Our goal is to prove $\Gamma_g; \Gamma'_l \vdash WellTyped(s')$. For any local variable x_i that maybe modified within loop body, it holds that $\Gamma_l(x_i) \leq \Gamma'_l(x_i)$ as generated by the constraint generation rule `WHILE`, and there exists a function f_{x_i} such that the value of x_i in state s' can be found as $f_{x_i}(y_1, \dots, y_n)$, with $\tau_{y_j} \leq \tau_{x_i} = \Gamma_l(x_i)$ for $j \in [1..n]$ because of $\Gamma_g; \Gamma_l \vdash WellTyped(s')$, by transitive relation of \leq ordering, we get $\tau_{y_j} \leq \Gamma'_l(x_i)$ for $j \in [1..n]$. For any global variable, its type keeps the same after the loop iteration, so in state s' , if it's well typed with respect to $\Gamma_g; \Gamma_l$ then it should also be well-typed with respect to $\Gamma_g; \Gamma'_l$. As both local and global variables are well-typed in state s' with respect to $\Gamma_g; \Gamma'_l$, it's natural to get that $\Gamma_g; \Gamma'_l \vdash WellTyped(s')$.

If $\llbracket e \rrbracket_s = true$, then $s \llbracket \text{while } e \text{ do } c_1 \rrbracket s'$ is the same as $s \llbracket c; \text{while } e \text{ do } c_1 \rrbracket s'$, and there should exist a state s_1 such that $s \llbracket c_1 \rrbracket s_1$ and $s_1 \llbracket \text{while } e \text{ do } c_1 \rrbracket s'$. C_1 is a subset of C , if C is satisfiable, then C_1 is satisfiable too. In the case of $\llbracket e \rrbracket_s$ being false, we have proved that $\Gamma_g; \Gamma'_l \vdash WellTyped(s)$ whenever $\Gamma_g; \Gamma_l \vdash WellTyped(s)$. By applying the induction hypothesis IH ,

we get $\Gamma_g; \Gamma_{l_1} \vdash \text{WellTyped}(s_1)$. For any local variable x_i that maybe modified within loop body, it holds that $\Gamma_{l_1}(x_i) \leq \Gamma'_l(x_i)$ as shown in the constraint generation rule `WHILE`, and there exists a function f_{x_i} such that the value of x_i in state s_1 can be found as $f_{x_i}(y_1, \dots, y_n)$, with $\tau_{y_j} \leq \tau_{x_i} = \Gamma_{l_1}(x_i)$ for $j \in [1..n]$ because of $\Gamma_g; \Gamma_{l_1} \vdash \text{WellTyped}(s_1)$, by transitive relation of \leq ordering, we get $\tau_{y_j} \leq \Gamma'_l(x_i)$ for $j \in [1..n]$. So, after one iteration of while loop, the state s_1 is still well-typed for any local variable x_i with respect to $\Gamma_g; \Gamma_{l_1}$. For the global variables, if they are well-typed with respect to $\Gamma_g; \Gamma_{l_1}$, then they are also well-typed with respect to $\Gamma_g; \Gamma'_l$, as the type of the global variables are stored in Γ_g , which is kept the same. So we can infer that $\Gamma_g; \Gamma'_l \vdash \text{WellTyped}(s_1)$ whenever $\Gamma_g; \Gamma_{l_1} \vdash \text{WellTyped}(s_1)$. Now we have reached the invariant that $\forall t t', t \llbracket c_1 \rrbracket t'$ if $\Gamma_g; \Gamma'_l \vdash \text{WellTyped}(t)$ then $\Gamma_g; \Gamma_{l_1} \vdash \text{WellTyped}(t')$, which guarantees the well-typedness for loop ending states after any number of iterations.

case 4: c is $(c_1; c_2)$. As an inductive case, it introduces two induction hypothesis:

IH1 : $\forall s s', C_1 \text{ is satisfiable} \rightarrow s \llbracket c_1 \rrbracket s' \rightarrow \Gamma_g; \Gamma_{l_1} \vdash \text{WellTyped}(s) \rightarrow \Gamma_g; \Gamma_{l_1} \vdash \text{WellTyped}(s')$, and
IH2 : $\forall s s', C_2 \text{ is satisfiable} \rightarrow s \llbracket c_2 \rrbracket s' \rightarrow \Gamma_g; \Gamma_{l_1} \vdash \text{WellTyped}(s) \rightarrow \Gamma_g; \Gamma'_l \vdash \text{WellTyped}(s')$, with
 $\Gamma_g; \Gamma_{l_1}; p \vdash c_1 \Rightarrow \Gamma_{l_1}; C_1$ and $\Gamma_g; \Gamma_{l_1}; p \vdash c_2 \Rightarrow \Gamma'_l; C_2$.

As $C = C_1 \cup C_2$, if C is satisfiable, then both C_1 and C_2 are also satisfiable. Given $s \llbracket c_1; c_2 \rrbracket s'$, there should exist s_1 such that $s \llbracket c_1 \rrbracket s_1$ and $s_1 \llbracket c_2 \rrbracket s'$. We can get $\Gamma_g; \Gamma_{l_1} \vdash \text{WellTyped}(s_1)$ by applying the induction hypothesis *IH1*. Furthermore, by applying the induction hypothesis *IH2*, we will get $\Gamma_g; \Gamma'_l \vdash \text{WellTyped}(s')$ and the proof is done.

case 5: c is $(\text{call } f^{\text{Declassify}}(a_1, \dots, a_k))$. Our goal is to prove $\Gamma_g; \Gamma'_l \vdash \text{WellTyped}(s')$.

For any input argument a_i , according to the semantics of procedure call for declassification, we have $\mathcal{D}_{\tau_i} := a_i$, with τ_i being the domain type of the corresponding parameter and \mathcal{D}_{τ_i} being a global variable of τ_i . According to the constraint generation rule `PROCEDURE-CALL`, it will generate type constraint $C_i = \{\tau_{a_i} \leq \tau_i, p \leq \tau_i\}$, where τ_{a_i} is type of a_i . Similar to the proof for assignment, $\forall \Gamma_g \Gamma_{l_1} s s'$, if $\Gamma_g; \Gamma_{l_1} \vdash \text{WellTyped}(s)$ and $s \llbracket \mathcal{D}_{\tau_i} := a_i \rrbracket s'$, then $\Gamma_g; \Gamma_{l_1} \vdash \text{WellTyped}(s')$ as long as the constraints C_i is satisfiable.

For any output argument a_j , we get $a_j := \mathcal{S}_{\tau_j}$, with τ_j being the domain type of the corresponding parameter and \mathcal{S}_{τ_j} being a global variable of τ_j . In constraint generation rule `PROCEDURE-CALL`,

if a_j is a local variable, a fresh type variable $\tau'_j = \text{freshType}()$ is generated for a_j and $\Gamma_l[a_j \rightarrow \tau'_j]$, with type constraints $C_j = \{\tau_j \leq \tau'_j, p \leq \tau'_j\}$. Similar to the proof for assignment, $\forall \Gamma_g \Gamma_l s s'$, if $\Gamma_g; \Gamma_l \vdash \text{WellTyped}(s)$ and $s \llbracket a_j := \mathcal{S}_{\tau_j} \rrbracket s'$, then $\Gamma_g; \Gamma_l[a_j \rightarrow \tau'_j] \vdash \text{WellTyped}(s')$ as long as the constraints C_j is satisfiable. If a_j is a global variable, then the type constraints $C_j = \{\tau_j \leq \Gamma_g(a_j), p \leq \Gamma_g(a_j)\}$, and the proof for preserving well-typedness can be established in a similar way.

So, given the initial state s before the procedure call such that $\Gamma_g; \Gamma_l \vdash \text{WellTyped}(s)$, as both passing in and passing out the values will keep the well-typedness of states, we can finally get $\Gamma_g; \Gamma'_l \vdash \text{WellTyped}(s')$.

case 6: c is (**call** $f(a_1, \dots, a_k)$). C_f is the type constraints between parameter types of procedure f and it's produced by rule PROCEDURE-DECL for $\Gamma_g; \Gamma_l; p \vdash \text{procedure } f(x_1, \dots, x_k)\{c_1\} \Rightarrow \Gamma'_g$. Inductively, we have $IH : \forall s s', C_1 \text{ is satisfiable} \rightarrow s \llbracket c_1 \rrbracket s' \rightarrow \Gamma_g; \Gamma_{l_1} \vdash \text{WellTyped}(s) \rightarrow \Gamma_g; \Gamma_{l_2} \vdash \text{WellTyped}(s')$, with $\Gamma_g; \Gamma_{l_1}; p \vdash c_1 \Rightarrow \Gamma_{l_2}; C_1$ and $\Gamma_{l_1} = \Gamma_l[x_1 \rightarrow \alpha_1][\dots][x_k \rightarrow \alpha_k]$, where $\alpha_i = \text{freshType}()$, $i \in [1, k]$. In the rule PROCEDURE-CALL for (**call** $f(a_1, \dots, a_k)$), each parameter type is renamed with some fresh type variable and C_f is updated accordingly. As the renaming will not affect the type constraints and its satisfiability, so it's a safe action. In our proof here, we can assume no renaming for parameter types now.

Given $s \llbracket \text{call } f(a_1, \dots, a_k) \rrbracket s'$, according to the operational semantics for procedure call, there exist s_1 and s_2 such that $s \text{ PassIn}(f(a_1, \dots, a_k)) s_1$, $s_1 \llbracket c_1 \rrbracket s_2$ and $s_2 \text{ PassOut}(f(a_1, \dots, a_k)) s'$.

For any input argument a_i , with type τ_{a_i} , there are type constraints $\{\tau_{a_i} \leq \alpha_i, p \leq \alpha_i\}$ being satisfiable. And it's easy to prove that if $\Gamma_g; \Gamma_l \vdash \text{WellTyped}(s)$ then $\Gamma_g; \Gamma_{l_1} \vdash \text{WellTyped}(s_1)$.

C_1 is a subset of C , if C is satisfiable then C_1 is also satisfiable, and $\Gamma_g; \Gamma_{l_2} \vdash \text{WellTyped}(s_2)$ can be inferred by applying the induction hypothesis IH .

For any output argument a_j , the type constraints are generated in the same way as for assignment $a_j := x_j$, similar to the proof for assignment, if $\Gamma_g; \Gamma_{l_2} \vdash \text{WellTyped}(s_2)$, then the well-typedness after the copying out operation will still hold. Finally, we get $\Gamma_g; \Gamma'_l \vdash \text{WellTyped}(s')$.

Program Name	Constraints#	Simp_Constraints#	SAT	Bugs
if_stmt	28	17	True	0
if_stmt_implicit_flow	12	6	False	1
mailbox	29	19	True	0
encrypt_system	17	5	False	1
password_check_system	19	8	True	0
procedure_call	91	57	False	1
procedure_call2	15	4	True	0
procedure_call3	20	6	False	2
seq_stmt	8	3	True	0
while_stmt	106	89	True	0
decryption_good ⁵⁹	133	107	True	0
decryption_bad	125	101	false	1
thumper_good ⁶⁰	69	41	True	0
thumper_bad	114	80	false	1

Table 5.1: *Experiment Data*

5.5 Evaluation

We have implemented an automatic verification tool as an associated part of the proposed declassification policy framework to automatically check whether the program conforms to the specified security policy. The evaluation is performed on a collection of small representative examples of SPARK programs. The analysis result for each example program is displayed in Table 5.1.

For each of these examples, **Constraint#** in Table 5.1 denotes the number of type constraints generated for each program. **Simp_Constraint#** gives the number of type constraints after simplifications, **SAT** shows the satisfiability of the constraints, and **Bugs** gives the number of information flow errors that violates user specified information security policy.

From the Table 5.1, we can see that constraint simplification rules can effectively reduce the number of type constraints to be checked. For the program *if_stmt_implicit_flow*, the detected information security violation is caused by the implicit control flow from secret information to public information. In program *encrypt_system*, the encryption function, which is designed to declassify information from secret domain to public domain, is used as an information laundering channel to declassify information from top secret to public. That’s the reason why the program fails the security policy requirement. In program *procedure_call*, the encryption function is wrapped within another function, and it’s used to declassify information with higher security level than it’s intended security level and the violation of the security policy is reported. In program *procedure_call2*, a declassification function called *Filter_And_Clean* is specified for declassifying information from top

secret to public and it demonstrates that it would also be fine to use the same declassification function to declassify the secret information that are less restricted than top secret. In program *procedure_call3*, a top secret information is allowed to be declassified to the public only if it goes through two separate specific declassification operations, one is for declassification from top secret to secret and another is for declassification from secret to public. There are two information flow within *procedure_call3* that performs information declassification without following the required security policy.

The *decryption* example, which is adapted from paper⁵⁹, is shown in the following:

```

-- key, msg: secret information
-- cipher, result : public information
msg := cipher * key;
Padding(msg, paddingOk);
if (paddingOk) then
    CheckSum(msg, checkSum);
    if (checkSum /= -1) then
        result := true;
    else
        result := false;
    end if;
else
    result := false;
end if;
procedure Padding(V: in Integer; R: out Boolean) is
begin
    R := (V mod 256 = 0);
end Padding;
procedure CheckSum(V: in Integer; R: out Integer) is

```

```

begin
    R := (V / 256) mod 256;
end CheckSum;

```

It decrypts a ciphertext (public) with a decryption key (secret) and returns the result (public) showing whether the decryption operation is successful or not. It returns *true* if the cyphertext has a valid padding and passes the integrity check, otherwise, return *false*. In our security policy framework, we define two security domains: $\{public, secret\}$ and $public \leq secret$, with *key* and *msg* annotated with *secret* domain, *cipher* and *result* in *public* domain. Both procedures *Padding* and *CheckSum* are specified as declassification functions to be allowed to declassify information from *secret* domain to *public* domain. The policy checker will not report any information security bugs for this program as its generated type constraints are satisfiable. However, if there is a mistake within the implementation, e.g.

```

if (key /= -1) then  — use key instead of checkSum
    result := true;
else
    result := false;
end if;

```

then the policy checker will report a bug for information leak from *key* (*secret*) to *result* (*public*).

The *thumper*⁶⁰ example is a prototype implementation for a time stamp protocol in SPARK programming language. It's still an ongoing project with a lot of major components missing. The working mechanism of the protocol is that: Alice needs a certificate or signature to prove later that one of her documents existed at (or before) the current time. She first computes a cryptographic hash of the document using a suitable secure hash algorithm. She then presents this hash to a trusted third party time stamping server. The server appends the current time to the end of the hash, signs the resulting data to make the official time stamp, and returns the time stamp to Alice. One of the major concerns for this example is to make sure the absence of information leak for the signature key. In other words, the server only uses the key for signature and all other information

flow from key is illegal. The following shows part of the implementation code:

```
-- server side --
Key: Integer;
Time: Integer;
...
procedure Tick(Time: in out Integer) is
begin
    Time := Time + 1; -- simulate the clock;
end Tick;
procedure AppendTime(U: in Integer; V: out Integer)
is begin
    Tick(Time);
    V := U + Time; -- simulate to append time to U
end AppendTime;
procedure Sign(Data: in Integer; Signature: out Integer)
is begin
    Signature := Data * Key; -- simulate the signature
end Sign;
procedure MakeSignature(Data: in Integer;
                        Signature: out Integer) is
    DataWithTime: Integer;
begin
    AppendTime(Data, DataWithTime);
    Sign(DataWithTime, Signature);
end MakeSignature;
procedure Hash(X: in Integer; Y: out Integer) is
begin
```

```

    Y := X mod 100; -- simulate the hash function
end Hash;

-- client side --
Document: Integer;
DocSignature: Integer;

-- the mediator between client and server --
procedure Mediator is
    HashValue: Integer;
begin
    -- receives the document from the client,
    -- and returns back the signature for it
    Hash(Document, HashValue);
    MakeSignature(HashValue, DocSignature);
end Mediator;

```

On the server side, it has a secret *Key* for signature and a timer *Time* to store the current time. The function *Tick* is to simulate the clock, *AppendTime* is to append the current time to a signed document, *Sign* is to generate signature and *Hash* to produce hash code. On the client side, it has a *Document* needed to be signed and stored at *DocSignature* to be visible to the public. If the program is correct, then there should be no information leak from the *secret Key* to the *Public DocSignature*. Similar to the previous example, we define two security domains: $\{public, secret\}$ and $public \leq secret$, with *Key* in *secret* domain, *DocSignature* in *public* domain. The procedure *Sign* is specified as declassification functions to be allowed to declassify information from *secret* domain to *public* domain. There is no bug reported by the policy checker as its generated type constraints are satisfiable. If we make an intentional information leak from *Key* to *DocSignature*,

then it will be detected and reported as a bug.

Further Assessment: The current evaluation of the proposed security policy framework is based on a collection of small examples that we have collected and adapted from various examples in related research papers. There are many reasons for why it's difficult to find bigger examples. Firstly, the SPARK programming language that we are working on is mainly used for the development of safety-critical systems, including commercial aviation, medical and space applications, it's so safety-critical that their source codes are usually unavailable to the public. Secondly, in the current research of the declassification policy, they mainly focus on the development of different semantic principles for declassification mechanism and their soundness proof, thus leads to a variety of definition of security (from different perspectives of *what*, *when*, *who* and *where* dimensions). But, as far as we know, none of these work have ever been used in any real applications to report any real defects. Usually, the validity of their proposed methods are proved to be correct based on their proposed semantic principles and illustrated in small examples. Thirdly, the declassification policy is a language-based security policy, which requires the extension of the existing programming languages to syntactically support the declassification policy. That's another major obstacle to apply the declassification policy in much bigger examples. The other reasons include: most of the current research are working on a toy language and the scalability of the proposed policy and its enforcement to a more complex language would be another challenge.

Since our proposed declassification policy is designed for SPARK programming language, and we have close cooperation with the SPARK designer company, which makes it possible for us do some further assessment on more bigger and practical examples in the future.

Chapter 6

Conclusion

Creating a highly reliable and robust software is a long existing challenge in the domain of safety- and security-critical applications. It's built based on formal verification technique to ensure that the expected behavior of the program conforms to the software-contract-based specifications. The contributions of this thesis are to make progress towards this direction to increase our confidence in the correctness of high integrity applications from two different perspectives: to guarantee the absence of run-time errors and to ensure the security of information flow.

We have formalized the dynamic/evaluation semantics for a significant subset of the high integrity language SPARK 2014 (which includes run-time checks as an integral part of the language) using the Coq proof assistant, and we have illustrated how this formal semantics can be used in a mechanized proof infrastructure to check that ASTs produced by the GNAT compiler frontend having correctly incorporated decorations for run-time checks. This included developing an optimizer with mechanized proofs of correctness that achieves run-time check placement optimizations equal to or better than GNAT. As the compiler and analyzers all share the AST produced by the frontend, with decorations indicating where run-time checks should be inserted, the certified AST increases the confidence in the GNAT compiler back-end that embeds run-time assertion checking when it emits machine code for testing, as well as in the GNATprove verifier that uses the run-time check decorations to determine what verification conditions to generate. The effectiveness of the

approach was demonstrated using programs from AdaCore test suites.

To control the information flow between different security domains and ensure the information security with respect to security requirements, we have proposed a language-based information security policy specification framework and the associated checking algorithm based on typing system to automatically check the information security of the program. Furthermore, we have demonstrated how the proposed security policy framework can be integrated into SPARK 2014 programming language with the introduction of some new security aspects, and we have implemented a prototype tool to show both the expressiveness of the policy language and the effectiveness of the checking algorithm for automatic enforcement of the security policy.

6.1 Future Work

The work in this thesis opens up a number of interesting opportunities for future work. Some of them are shown as follows:

- Towards the formalization of language semantics for complete SPARK 2014. Now we have formalized the semantics for a core subset of SPARK with support of three major categories of run-time checks. In the future, we are interested in adding more SPARK language features to support more run-time check certifications in a similar way as done in this thesis. Our final goal is to define the formal semantics for the complete language of SPARK 2014 as it's defined in SPARK reference manual. The formal and unambiguous semantics is beneficial for machine-verified proof of correctness of SPARK static analysis and translation tools.
- Certified SPARK frontend for CompCert certified compiler framework. The mechanized SPARK 2014 semantics (which was designed to align with the approach of CompCert⁶) along with the Jago translator provides the foundation for producing a mechanically proved translation from SPARK into CompCert's Clight, which would then provide a verified compiler for SPARK 2014 to the target languages supported by CompCert. In addition, the Jago translation also enables one to develop in Coq an integrated verification environment that includes the ability to use Coq to mechanically verify that a SPARK 2014 program conforms

to its formally specified contracts. In situations where very high confidence is needed, this type of infrastructure could be used directly by verification engineers, or it could enable existing automated tools like Kiasan⁶¹ or GNATprove⁶² to emit Coq proofs establishing that their verification results for a particular program are correct.

- Conditional declassification policy. The proposed security policy framework in this thesis allows user to specify the trust declassification functions to safely declassify information from one security domain to another. To capture more precise information flow, the policy can be extended with guard conditions to trigger the declassification actions, coming with a more advanced enforcement algorithm. It's called the conditional information declassification policy that declassification function can be called only when certain conditions are satisfied.

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