

ERC Starting Grant 2021
Part B2
CRETE: Certified Refinement Types

Section a. State-of-the-art and objectives

a.1 Introduction

Refinement types [42] are a modern software verification technique that extends types of an existing programming language with logical predicates, to verify critical program properties not expressible by the existing type system. For example, consider the function `get xs i` that returns the i th element of the list `xs`. The existing type below states that `get` takes a list of `as`, an integer and returns an `a`¹.

Existing Type: `get :: [a] → Int → a`
 Refinement Type: `get :: xs:[a] → i:{Int | 0 ≤ i < len xs} → a`

The type of `get` gets *refined* to enforce in-bound indexing, a property that the existing type system cannot encode. Concretely, the refinement $0 \leq i < \text{len } xs$ of the index `i` ensures that `get` will only be called with indices in the bounds of the input list, preventing memory violation bugs like Heartbleed.

Refinement types are designed to be practical. The specifications are naturally integrated within the existing language and the verification happens automatically by an SMT solver [7]. For example, it is trivial to verify that any natural number `i` is a good index for the list that contains `i+1` zeros.

```
type N = {i:Int | 0 ≤ i }
example :: i:N → Int
example i = get (replicate (i+1) 0) i -- replicate :: i:N → a → {xs:[a] | len xs == i }
```

Checking `example` uses the decidable theories of equality, uninterpreted functions, and linear arithmetic to essentially confirm that $i < i + 1$, which is trivial for SMT solvers. This SMT automation, on top of an existing language that comes with efficient runtimes, optimized libraries, and development tools, renders refinement type-based verification practical and accessible to mainstream programmers. Refinement type systems have been developed for various programming languages (Ocaml [35], Haskell [78], Ruby [43], Scala [39]) and have been used to enforce sophisticated properties (for example, about cryptographic protocols [10], reference aliasing [38], resource usage [40], and web security [47]).

But, refinement types are not sound. For example, calling `example` with the maximum (fixed-precision) integer will quickly violate the `example`'s (verified) specification due to overflows, leading to memory access violations (e.g., in `Data.Text.Unsafe`) or runtime exceptions (if `get` is partially defined).

```
ghci> example maxBound
*** Exception: Non-exhaustive patterns in function get
```

For this concrete problem there is an easy solution: `F*` [73] and `Stainless` [39] both encode fixed-precision integers as bit vectors to reason about overflows. But, the unsoundness problems are deeper. First, the correspondence between program and SMT expressions is difficult in general and currently there are no guarantees that the refinement type checker developers implemented it correctly. Second, the logic of refinement types is not well understood, leaving it unclear for the users what assumptions are safe to be made and which lead to inconsistencies, and thus unsound verification. Finally, unlike type-theory based verifiers, refinement type checkers do not rely on a core kernel. Usually, the implementation of refinement type checkers trusts the compiler of the underlying language to generate an intermediate representation language (IRL), the type checking rules (adapted to accommodate the IRL) to generate logical verification conditions (VC) and the SMT to validate the VCs. All these three trusted components are prone to implementation bugs that can lead to unsound verification.

In short, while practical refinement types have been extensively used to verify sophisticated properties of real world programs, their soundness is debatable.

The goal of this proposal is to develop a both practical and sound verification system.

¹We use the syntax of Haskell and Liquid Haskell [78].

	DML	SAGE	F★	Liquid Haskell	Stainless
Existing Language	✓	✓	✓	✓	✓
Decidable Type Checking	✓	✓	×	✓	✓
Static Type Checking	✓	×	✓	✓	✓
Type Inference	✓	×	?	✓	?
Predicate Subtyping	×	✓	✓	✓	×
Refined Type Variables	×	×	✓	✓	×
Data Type Subtyping	×	×	×	✓	×

Table 1: Desired features of practical refinement types and systems that implement them.

a.2 State-of-the-art

Next we discuss the state-of-the-art in refinement types. First, we compare the type-based verification approach of refinement types with assertion-based verification. Then, we present characteristic features and soundness claims of existing refinement type checkers. Finally, we compare against soundness claims of theorem provers and place refinement types between them and programming languages.

a.2.1 Type-based *vs.* Assertion-based verification

Refinement types are a type-based alternative to assertion-based verification systems, e.g., SPEC#[6], ESC/Java[33], Dafny[48], and more recently OpenJML[22] and Prusti[4]. Such systems, similar to refinement types, start from an existing programming language and automatically discharge assertions with an external solver. But, unlike refinement types, they directly encode the target language into the solver’s logic, without taking advantage of the type system to generate verification conditions.

Refinement types use the abstractions of types in two key ways to facilitate program verification. First, polymorphism – inherent in refinement type systems – gives “theorems for free”[83]. For example, consider the function `(++)` that appends two lists:

$$(++) :: xs:[a] \rightarrow ys:[a] \rightarrow \{v:[a] \mid \text{len } v = \text{len } xs + \text{len } ys\}$$

Calling `(++)` with two lists of integers greater than a variable `x`, i.e., $xs, ys :: \{v:\text{Int} \mid x < v\}$, returns a list that preserves the same property $xs ++ ys :: \{v:\text{Int} \mid x < v\}$, because of refinement type instantiation of the type variable. Such reasoning, taken for free in type-based verification, requires quantification in assertion-based systems that quickly leads to unpredictable verification [49].

Second, the abstraction of refinement type specifications provides a clear separation between the function definition and the properties relevant to verification. For instance, refinement type-based verification of the callers of `(++)` is unaware of the `(++)`’s recursive definition. On the negative side, this approach is imprecise and unable to deduce that 2 belongs to the list `[1] ++ [2]`. On the positive side, it can trivially reason about sophisticated length invariants on lists, since the type of `(++)` precisely captures how the function modifies the length of lists. Thus, refinement type-based verification, as opposed to assertion-based systems, provides the ground for modular and decidable verification.

a.2.2 Practical Refinement Types

Figure 1 summarizes the main ingredients of refinement types and lead systems that implement them.

The term refinement types was introduced in 1991 [35] as part of a system later named Dependent ML (DML) [86], which syntactically refines ML[56]’s user-defined data types into more precise subsets. For example, `singleton` can be defined by the user as a `list` that contains exactly one element. This form of refinements, now known as *datasort refinements* [29], combined with indexed types [88] is implemented in DML that has decidable type inference, via abstract interpretation and linear programming, to automatically verify data structure invariants [29]. Importantly, DML set the first objectives for practical refinement types. They need to be integrated with an existing programming language, enjoy decidable type checking (that can be automated by an external SMT solver) and type inference so that the user does not need to explicitly annotate every intermediate term.

The **SAGE** system [32] generalized refinements from data types to any base type, introducing the syntax $\{v:t \mid r\}$, where t is any base type (e.g., `Int`, `Bool`) and r is any pure, boolean expression of the underlying language. **SAGE** uses semantic, *predicate subtyping* [65] to generate verification conditions and an SMT solver (Simplify [27]) to check them. In **SAGE** type checking is undecidable and checked in a *hybrid* manner: partly at compile time using SMTs and partly at run-time via contract checks.

F* [10, 12], later renamed to **F*** [72], changed the language r of refinements into expressions of the underlying solver to restore static type checking. In **F***, refinements can include quantifiers, thus type checking is undecidable (in practice directed using SMT hints), but the system is expressive enough to verify real world applications, among which cryptographic routines of web-browsers [90, 62]. **F*** now also includes dependent types [73], effects [52] and metaprogramming [53].

Liquid types [63], now used by Liquid Haskell [79], made decidable type checking a priority. Liquid Haskell restricts the language r of refinements to logics that can be efficiently decided by SMTs (e.g., equality, uninterpreted functions, linear arithmetic, data types, but no quantifiers), for the sake of decidable type inference and predictable verification. To restore expressiveness, Liquid Haskell allows refinement and subtyping of polymorphic types and uses refinement reflection [81] to permit controlled reasoning about pure, terminating functions of the underlying language. Liquid Haskell has been used to verify a wide range of sophisticated properties, including resource usage [40], security metaproperties [57], and properties of real-world, distributed code [50].

Refinement types is a promising practical verification technology that in the last decade has spread to mainstream languages. [64] and [19] respectively verify C and JAVASCRIPT programs by refining a low-level language of locations. [44] integrates refinements within RACKET’s occurrence based type system. [43] integrates refinements in RUBY’s type system using just-in-time type checking. Finally, **Stainless** [39] is a refinement-type based verifier for higher-order SCALA programs.

a.2.3 Soundness of Refinement Types

Datort refinements (i.e., the DML-style refinement types) come with strong metatheoretic principles [87]: [51] defines a logical framework where refinements are proof-irrelevant predicates and [55] gives a categorical interpretation of refinement types. Yet, this line of work studies only refinements of data types and does not trivially generalize to practical refinement type systems.

F* [37] followed the LCF [60] approach to set the principles of refinement types, where an external, clearly defined logic is used to validate subtyping. This and similar approaches [1] though, neither formalize the correspondence between the logic and the verified language nor show the consistency of the verification system. Further, no LCF-style approach is defined to allow refinements on type variables or data types, features used by practical systems.

SAGE came with a novel soundness proof [45] that shows soundness of refinement type systems with respect to operational semantics. The denotation of the refined type $\{v:t \mid r\}$ is defined to be the set of all expressions e , with unrefined type t , for which $r[e/v]$ evaluates, using operational semantics, to true, i.e., $r[e/v] \hookrightarrow^* \text{true}$. Denotational subtyping is also defined via operational semantics over all possible instantiations of the typing environment and is undecidable. In practice, an external SMT solver is used to approximate this undecidable subtyping. Soundness in this setting is defined using denotational inclusion: if e has type τ , then e belongs in the denotation of τ . For example, since $2 : \{v:\text{Int} \mid 0 < v\}$, then $0 < 2 \hookrightarrow^* \text{true}$. This proving methodology provides a deep intuition on the semantics of refinement types and has been extensively used to formalize gradual types [9, 68]. But when used to formalize static verification of refinements types, it turns out to be insufficient.

Liquid Haskell [79] used **SAGE**’s methodology to formalize its core calculus. Such formalizations though are insufficient for three reasons. First, they do not formalize the SMT approximation of the underlying programming languages, easily leading to unsoundness (§ a.1). Second, unlike the LCF-style formalization, they do not clarify the logic used by refinement types, leaving it uncertain for the users what assumptions can be consistently made. For example, the PI recently detected that function extensionality had been encoded inconsistently in Liquid Haskell for many years [76]: the user was able to prove false each time the function extensionality axiom was used, invalidating all the verification efforts. Third, formalizations of small core calculi usually leave out sophisticated features supported by the actual implementation. **Stainless** [39] comes with a formalization of the complete refined System F , but, by design, **Stainless** is not using semantic subtyping and refined polymorphism as Liquid

Haskell and $F\star$, thus it cannot be directly applied for these systems. For example, Liquid Haskell is known to be inconsistent in the presence of recursive negative types². Ideally, a complete formalization of refined System F_ω with semantic subtyping is required to prevent future and understand known inconsistencies of refined systems. We propose such a formalization in research track III.

Even such a theoretical development though, would not be sufficient to guarantee soundness of practical refinement type checker implementations. The implementations of $F\star$, **Stainless**, and Liquid Haskell respectively consist of 1.3M, 185.3K, and 423K lines of code, and none of them concretely isolates a trusted core kernel. So, bugs that are inevitable in such big code bases can potentially lead to unsoundness. At each of these three verifiers approximately five soundness bugs are reported per year. Thus, to ensure soundness of the actual implementation a small trusted kernel is also required.

a.2.4 Design of Sound Theorem Provers

The recipe to implement a sound theorem prover is known. The prover consists of a small trusted kernel that implements a set of deductive rules that are proved consistent by the existence of a consistent mathematical model. For example, Isabelle/HOL [58] has a core kernel of 5K lines of ML code that implements HOL whose consistency is known because there is a set theoretic model [3]. Coq’s kernel is 14K lines of ML code that implement CIC [24, 23], a calculus also shown consistent by a set theoretic model [75]. Still, “on average, one critical bug has been found every year in Coq” [70]. So, one can only imagine how many critical bugs exist in the implementations of refinement type checkers.

Sadly, the soundness recipe cannot be applied to refinement type checkers. Their implementation highly depends on external solvers for automation and on the compiler of the underlying programming language for extraction of the intermediate representation language (IRL). Developed to support evolving programming languages, IRLs are subject to change, e.g., to facilitate runtime optimizations or support of novel language features. Thus, the development of a stable core kernel in a practical refinement type checker is not feasible. In research track II we aim to address this problem by reducing refinement to dependent type checking, and thus use Coq’s soundness guarantees.

a.2.5 The Design Spot: Between Legacy Programming Languages and Theorem Provers

In theory, sound and practical verification could be attained by the design of a theorem prover that also serves as a general purpose programming language or vice versa. For example, the Lean [25] theorem prover, is now a general purpose programming language with C/LLVM code generation and multithreading, used to implement Lean itself. On the opposite direction, the GHC Haskell compiler has recently been extended with dependent types [30, 18] to allow CIC-style theorem proving.

In practice though the design and maintenance decisions taken by the development teams cannot facilitate both the industrial requirements of legacy programming languages and the flexible research development of theorem provers. For example, the extension of GHC with dependent types has been tremendously slowed down by the code reviewing and backward compatibility industrial requirements of new compiler releases. The Lean theorem prover, on the contrary, clarifies in the documentation that, for the sake of flexible development, it guarantees neither backward compatibility nor per-request addition of new features, making it impossible for Lean to serve as an industrial programming language.

Refinement types occupy a unique design spot in which programs are developed in industrial programming languages, that abide by the strict maintenance requirements, while verification happens by external implementations that can follow more flexible, research-oriented release circles.

a.3 Scientific Objectives of CRETE

Certified refinement types (CRETE) will construct *sound* proofs for software verified by SMT-automated, *practical* refinement types. We will define explicit certificates that capture the SMT proofs and use them to derive Coq and HOL-style proofs of the original software. CRETE will be used to verify real world code, such as cryptographic protocols and secure web applications.

CRETE is divided in four scientific objectives summarized in Figure 1 and explained below.

² Liquid Haskell unsoundly allows subtyping on ADTs [github:issues/159](https://github.com/ucsb-spl/lsh/issues/159) while $F\star$ doesn’t allow it [github:issues/65](https://github.com/ucsb-spl/fstar/issues/65).

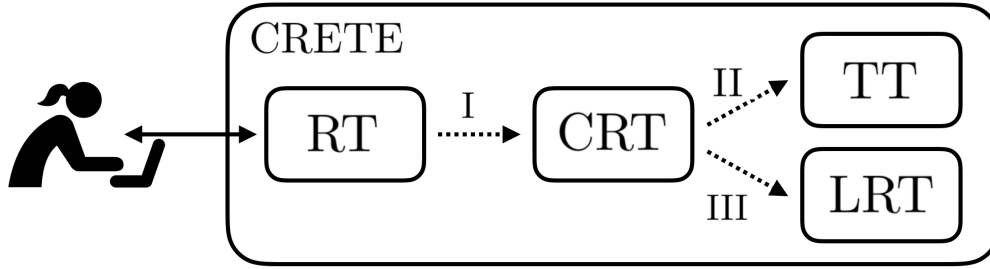


Figure 1: Objectives of CReTE. Starting from practical refinement types (RT, e.g., Liquid Haskell or Liquid Rust) we generate certified refinements (CRT; Objective I). CRT translate to type theory (TT, e.g., Coq; Objective II) and the logic of refinement types (LRT, variant of HOL; Objective III).

I: Certified Refinement Types The first objective is to define CRT, a certified refinement type system that isolates all automation of programs that type check into explicitly certified terms. The explicit certificates will be independently validated and tested using runtime execution of the underlying language, immediately reducing the soundness bugs of practical refinement type checkers.

II: Translation of CRT to Type Theory The second objective is to translate CRT programs into Coq, advancing both the theory and the practice of refinement types. In theory, this objective will formalize the relationship between refinement types and constructive type theory as verification techniques. In practice, the impact is greater. Coq is the most reliable software to mechanically check proofs. Connecting all the pieces, CReTE will translate programs – developed in a mainstream programming languages and verified using *practical*, SMT-automated refinement types – into Coq *sound* proofs thus, delivering the holy grail of practical and sound software verification.

III: Logic of Refinement Types The third objective is to establish soundness of CRT by employing the classical methodology of program semantics. We will define the logic of refinement types (LRT) as a deductive system, similar to HOL, that approximates CRT: intuitively, if $\Gamma \vdash e : \{v:a \mid p\ v\}$, then $\Gamma \vdash p\ e$ is provable in LRT. We will show consistency of LRT, thus getting consistency of CRT. This objective will clarify the expressive power and the consistent assumptions of our system, in practise, preventing future inconsistencies that lead to unsoundness. Importantly, LRT (like CIC) will define a consistent deductive system with strong mathematical foundations that, in the future, can serve as the core calculus of the next-generation theorem provers.

IV: Implementation and Evaluation on Applications The final objective is to implement CRT as a back-end to practical refinement type systems and evaluate the feasibility and impact of our methodology. We will implement CRT as a back-end to Liquid Haskell to examine the soundness of verified, real-world, secure web applications: was verification making any inconsistent assumptions? To ensure the generality of our methodology, we will also incorporate CRT to Liquid Rust, a novel refinement type checker for Rust programs that we will use to verify cryptographic protocols.

Section b. Methodology

Each of the four objectives is addressed by a research track. Next, for each research track of CReTE, we present the required tasks and summarize the importance and challenges. § b.5 summarizes the organization of the research tracks and § b.6 provides concluding remarks.

b.1 Research Track I: Certified Refinement Types

In this research track we develop CRT, a certified refinement typed language that replaces the SMT solver with certified terms (Task I.1). The certificates are validated in Task I.2 and tested in Task I.3.

Task I.1: Certificate Generation

In this task, we will define a program transformation that introduces (trusted) certificates to replace SMT invocations during refinement type checking. For example, consider the `test` definition below:

```
test :: xs:[a] → i:{ℕ | i < len xs - 1} → a
test xs i = get xs (i + 1)
```

Typechecking of `test` will first introduce `test`'s two arguments into the typing environment $\Gamma \doteq \{\dots, xs : [a], i : \{i : \mathbb{N} \mid i < \text{len } xs - 1\}\}$ and then will check the below function application rule.

$$\frac{\Gamma \vdash \text{get } xs : \{v : \mathbb{N} \mid v < \text{len } xs\} \rightarrow a \quad \Gamma \vdash i + 1 : \{v : \mathbb{N} \mid v < \text{len } xs\}}{\Gamma \vdash \text{get } xs (i + 1) : a}$$

To decide that the index `i+1` is a good index for `get`, i.e., it satisfies `get`'s precondition from § a.1, typechecking will generate a subtyping rule, that will get validated by the SMT solver.

$$\frac{\Gamma \vdash i + 1 : \{v : \text{Int} \mid v = i + 1\} \quad \frac{\text{SMTValid}(0 \leq i < \text{len } xs - 1 \Rightarrow v = i + 1 \Rightarrow 0 \leq v < \text{len } xs)}{\Gamma \vdash \{v : \text{Int} \mid v = i + 1\} \preceq \{v : \mathbb{N} \mid v < \text{len } xs\}}}{\Gamma \vdash i + 1 : \{v : \mathbb{N} \mid v < \text{len } xs\}}$$

The safety and soundness of this derivation depends on the language representation of `Int` and its encoding to SMT terms. For example, in F^* type checking will soundly succeed, since `Int` denotes unbounded integers but would fail if the base integer type was of fixed precision (e.g., `UInt32.t` represented as bit vector in SMT). In Liquid Haskell, `Int` is fixed-precision, but for precise verification it gets represented to SMT unbounded integers, thus type checking will unsoundly succeed. In short, the encoding of language to SMT expressions is difficult and should not be trusted.

In this task, we will use the type derivation tree to replace the (untrusted) SMT invocations by an (again untrusted) certificate. So, in our example, we generate the below certified derivation tree.

$$\frac{\dots \quad \Gamma \vdash_{\text{CRT}} \text{cert}(i + 1, \{v : \text{Int} \mid 0 \leq v < \text{len } xs\}, \Gamma) : \{v : \text{Int} \mid 0 \leq v < \text{len } xs\}}{\Gamma \vdash_{\text{CRT}} \text{get } xs \text{ cert}(i + 1, \{v : \text{Int} \mid 0 \leq v < \text{len } xs\}, \Gamma) : a}$$

That is, the certificate will replace the subtyping rule and will get propagated in the original expression, leading to the following transformed expression, that can now be type-checked without the SMT.

$$\lambda xs, i. \text{get } xs (i + 1) \hookrightarrow \lambda xs, i. \text{get } xs \text{ cert}(i + 1, \{v : \text{Int} \mid 0 \leq v < \text{len } xs\}, \Gamma)$$

To generalize, we will define the CRT variant of an original refinement typed language RT by extending RT's expressions to include the *trusted* primitive `cert`(e, τ, Γ) and by modifying RT's typing rules to replace SMT invocations with the below trusted T-Cert rule.

$$\frac{}{\Gamma \vdash_{\text{CRT}} \text{cert}(e, \tau, \Gamma) : \tau} \text{ T-Cert}$$

The goal is to define the type-preserving transformation $\bullet \hookrightarrow \bullet$ from RT to CRT terms:

Goal 1 If $\Gamma \vdash e : \tau$ and $e \hookrightarrow e'$, then $\Gamma \vdash_{\text{CRT}} e' : \tau$.

The definition of the translation will be directed by the original type derivation, following the techniques of hybrid and gradual types [32, 84, 9, 28, 2]. Unlike these systems that convert the certificates into runtime casts, which unavoidably slows down runtime [74], our certificates will explicitly carry the typing environment Γ , to permit static certificate validation and testing.

Task I.2: Certificate Validation

In this task we will validate the explicit certificates using the proof certificate generation and validation technology [54, 15] provided by the SMTs, under various program-to-SMT encodings.

For example, the certificate validation of the example in Task I.1 will generate the following error.

- Error when `Int` is encoded as `(_ BitVec 64)` in CVC4 and Z3
(Change `Int` to `Integer` or enable `UnsafeNoOverflows` to suppress this error)

```
test xs i = get xs (i + 1)
          ~~~~~
```

The generated certificate will be validated by both CVC4 and Z3 under two different encodings that map `Int` to SMT `Int` and `BitVec`. Since validation failed only on the fixed-precision encoding the system will infer potential solutions and let the user decide if the runtime efficiency offered by fixed-precision `Int` is more important than the lack of overflows offered by `Integers`.

To generalize, we will implement certificate validation with three features. First, the certificates can be validated under different encodings of the CRT to SMT language (that will be designed by the developers). Second, validation will use more than one SMT solvers, which has shown (by Sledgehammer [14]) to be extremely useful in cases where solvers diverge. Third, and most importantly, we will generate and externally validate SMT proof certificates (e.g., CVC4 generates proof certificates that are checked in the logical framework LFSC [71]), thus drastically reducing the trusted code base.

Task I.3: Certificate Testing

In this task we will use property based testing [21] to test, instead of validating, the generated certificates. In our example, the certificate will be falsified with the $\text{maxBound} = 2^{63} - 1$ as a counterexample.

To do so, we will design custom test generators that properly cover the derived certificates. For instance, a random generator for `Ints` will not find the `maxBound`, corner case counter-example. Instead, we need to design a custom generator that favors tests close to the maximum and minimum corners. To design such generators we will use coverage guided test generation techniques [46] combined with techniques to generate tests for function and polymorphic [20, 11] certificates.

Importance & Challenges

This research track addresses two key problems. First, it reduces the trusted components of refinement type checkers by external certificate validation. Second, it addresses the language-to-SMT correspondence problem by the provision of multiple encodings and by testing the certificates. Even though our overflow example is trivial and has a known solution, as noted in the *Stainless* documentation³, the definition of a “precise correspondence between runtime execution semantics and the semantics used in verification” is a difficult problem, that only gets worse in the presence of limited memory, equality, and higher-order features [76]. Testing the certificates will not only bypass the potential unsoundness of this difficult encoding, but will also generate counterexamples that the user can much easier understand compared to verification errors.

There are three main challenges in this track. First, practical refinement type systems incorporate various sources of automation on top of SMT solvers (e.g., inference or evaluations) that are expected to complicate the certificate derivation. The PI has many years of experience on building and understanding such automations, thus she is one of the few experts that is capable to isolate them in explicit certificates. The second challenge is how to expose to the user the various certificate validation and testing options in a user-friendly way. To address this challenge, we plan to follow the paradigm of Isabelle/HOL and build an editor integrated user interface that presents the validation options and results. The PI plans to hire a research programmer that will help with the development and maintenance of this interface. The final challenge is the development of a customized testing suite for each certified expression. The PI has experience on the relevant fields of test generation [67] and gradual types [82], but is not an expert in the area of custom test generation. For this task, the PI will collaborate with Leonidas Lampropoulos who is an expert in the field of testing.

b.2 Research Track II: Translation of CRT to Type Theory

In this research track we will define a translation of CRT to type theory, with the goal to attain sound, machine-checked proofs of the original CRT program. Concretely, we will define the translation as a (partial) function $\bullet \rightsquigarrow \bullet$ from CRT to Coq (distinguished using *red* and *green* color when required).

We describe the translation on data types (Task II.1), specifications (Task II.2), and terms (Task II.3) and aim to produce correct-by-construction Coq programs (Goal 2).

Task II.1: Refined to Inductive Data Types

In this task we translate refined data types to Coq's inductive definitions. For example, lists refined to capture their length will get translated into inductive vectors.

<pre>data [a] where ([]) :: {l:[a] len l = 0 } (:) :: a → xs:[a] → {l:[a] len l = len xs + 1}</pre>	<pre>Inductive vec (A:Type) : ℕ → Type := nil : vec A 0 cons : ∀ len, A → vec A len → vec A (S len).</pre>
--	---

On the left, the list algebraic data type (ADT) is refined to axiomatize its length, i.e., the length of `[]` is zero, while the length of `(x:xs)` is one plus the length of `xs`. List's translation on the right returns a vector which is indexed by a natural number `len` so that the index on `nil` is zero, while the index on `cons x xs` is the successor of the index on `xs`.

With this definition, the translation will turn lists $x : [a]$ into vectors $x : \text{vec } A \text{ len}_x$ and calls to lengths `len x` into x 's index `lenx`:

<i>Refined List Translation</i>	<i>General ADT Translation</i>
$x : [a] \rightsquigarrow x : \text{vec } A \text{ len}_x$	$x : T a_1 \dots a_n \rightsquigarrow T A_1 \dots A_n f_{1x} \dots f_{nx}$
$\text{len } x \rightsquigarrow \text{len}_x$	$f_i x \rightsquigarrow f_{ix}$

This behavior naturally generalizes (above; on the right) to ADTs T with n type parameters (namely $a_1 \dots a_n$) that are refined with m inductive functions (namely $f_1 \dots f_m$).

The translation will fail on various not inductively defined data types. For example, in data definitions with negative recursive definitions, the translation will fail with a descriptive error message.

<pre>data Evil a where Very :: (Evil a → a) → Evil a</pre>	<pre>Error: Evil doesn't have a strictly positive occurrence</pre>
--	--

The definition of `Evil` in a refined program can lead to unsoundness (§ a.2), thus failures of the translation (with descriptive failing messages) already signal potential inconsistencies.

A translation between refined and inductive data types is an active research area. For example, [5] studies this systematic translation via categorically-theoretic perspectives and [68] compares the two representations to conclude that both are equally expressive while each requires different proving techniques. Yet, both approaches focus on small examples. In practical applications multiple properties can refine the same ADT (e.g., lists can be refined with length and nullity properties) while the same ADT can satisfy different refinements (e.g., [77] lets you treat the same list as either increasing or decreasing). More interestingly, refinement types let you freely refine codata. The goal of this task is, based on the existing work, to implement a systematic translation for refined ADTs of real-world code (e.g., the benchmarks of [77]) and address the challenges and requirements of practical applications.

Task II.2: Classical Refinement Types to Constructive Subset Types

In this task we will translate refinement type specifications to Coq specifications using subset types. For example, the specification of `get` from § a.1 will be translated as follows.

<pre>get :: xs:[a] → i:{ℕ i < len xs} → a</pre>	<pre>get : ∀ A len_{xs}, vec A len_{xs} → {i: ℕ i < len_{xs}} → A</pre>
--	--

Translation of the list and length follows Task II.1, while refinement types turn into subset types.

Subset types [17, 26] in Coq contain a value x combined with a predicate P that x satisfies.

```
Inductive sig (A : Type) (P : A → Prop) : Type := exist : ∀ x : A, P x → sig P
```

Coq actually comes with defined notation of subset as “refinement” types.

```
Notation "{ x : A | P }" := sig (fun x : A => P)
```


So, the type $\{i : \mathbb{N} \mid i < \text{len}_{xs}\}$ used to index `get` is notation for `sig (fun i : \mathbb{N} => $i < \text{len}_{xs}$)`.

Inhabiting subset types is not trivial. The constructor `exist` needs three components: a predicate P , an expression x , and a proof that $P \ x$ holds. The requirement of an explicit proof term is the critical difference between inhabitants of refinement and subset types, while in Task II.3 we discuss how the former can be converted into the latter using the explicit certificates.

Subset types are not commonly used in Coq because the inhabitant generation is complicated. For instance, [69] specifies `get` using an inductive predicate `less lenxs` that captures all natural numbers less than `lenxs`. Such an alternative encoding would complicate program transformation. The term `i : less lenxs` declares the existence of an in-bounds i , but (unlike subset types) does not carry the concrete value for i , thus the translation would need to reconstruct such concrete values when used by the CRT original program.

Both approaches share the challenge that the logical connectives have different semantics in the two systems. Concretely, implication and negation are classical in the refinement types but intuitionistic in dependent types. To address this challenge we will use the CPS translation of classical to intuitionistic logic [36] to translate the classical connectives of the refinements into the constructive ones in Coq.

Task II.3: Certified to Proof Terms

In this task we will translate the CRT into Coq terms. For example, the certified `test` function of Task II.1, will get translated as follows (for brevity we write `_` instead of the certificate's environment):

```
test :: xs:[a] → i:{N | i < len xs - 1} → a
test xs i = get xs (cert (i + 1) {v:N | v < len xs} _)
```

\rightsquigarrow

```
Lemma lemma : ∀ (i : N) (n : N), (i < n - 1) → (i + 1 < n).
Proof. smt. Qed. ; or Proof. lia. Qed.
```

```
Definition test {A lenxs} (xs:vec A lenxs) (r:{i : N | i < lenxs - 1}) : A :=
  match r with
  | exist _ i pf => get xs (exist (fun v : N => (v < lenxs)) (i + 1) (lemma i lenxs pf))
  end.
```

The type of `test` is translated following Task II.2. Here we describe the translation of `test`'s definition. Originally, the translation follows the CRT definition, until the certificate is found, i.e., bidirectionally. At that point the certificate `cert (i + 1) {v:N | v < len xs} _` gets converted into the subset term `exist pred e proof` and translation reduces to the derivation of the three components `pred`, `e`, and `proof`. The expression `e` exactly matches the certified expression `i+1`. The predicate `pred` is simply derived by turning the refinement type of the certificate $\{v:N \mid v < \text{len}_{xs}\}$ into the predicate `fun v : N => (v < lenxs)`. This step clarifies the importance of certified expressions in this research track: if the translation was attempted directly from refinement types to Coq, the derivation of such valid (intermediate) predicates would be challenging. Instead, now the main challenge is to derive adequate proof terms. Again, directed by the certificate, we seek the proof that $(i + 1 < \text{len}_{xs})$. The translation derives a lemma that $(i < n - 1) \rightarrow (i + 1 < n)$. To call the `lemma` we need the proof that $(i < \text{len}_{xs} - 1)$ which exists in the subset argument `pf`, thus the whole definition is wrapped in a pattern match. To prove the `lemma` we use `lia` or `SMTCoq` [31] that allows verified SMT tactics within Coq.

The crux of this task is the systematic extraction of proof terms that validate the CRT certificates. Essentially, each certificate will get translated to a subset term as follows

$$\text{cert}(e, \{v:t \mid p\}, \Gamma) \rightsquigarrow \text{exist } (\text{fun } v : t' \Rightarrow p') \ e' \ (\text{make-proof } e' \ p' \ \Gamma')$$

where $e \rightsquigarrow e'$, $t \rightsquigarrow t'$, $p \rightsquigarrow p'$, and $\Gamma \rightsquigarrow \Gamma'$. The challenge in this task is to systematically generate proof terms for the type $p' \ e'$. Since the certificates were generated (in Task I.1) based on SMT proofs then using `SMTCoq` (as in the `test` example), it will always be possible to systematically reconstruct the proofs. To do so, we will define the metafunction `make-proof e p Γ` that systematically constructs the proof that $p \ e$ directed by the environment Γ .

In short, the goal of the task is to translate CRT into correct-by-construction Coq programs. If P is a program that type checks in CRT, i.e., $\vdash_{\text{CRT}} P$, and the translation succeeds, i.e., $P \rightsquigarrow P'$, then the derived program should be accepted by Coq:

Goal 2 If $\vdash_{CRT} P$ and $P \rightsquigarrow P'$, then $\vdash_{Coq} P'$.

The translation will combine bidirectional program synthesis [34] with the SMTCoq [31] generation of set type inhabitants, as described in the `test` example. As part of the research track IV, we will implement the translation and evaluate it in real world applications.

Importance & Challenges

This research track is important for both the theory and practice of refinement types. Our translation will formalize the relation between classical refinement types and constructive type theory, that until now has been a frequent question answered only by case-study comparisons (from the PI [80] and various master thesis projects [59, 85]). In practise, in this track we will translate programs verified using *practical*, SMT-automated refinement types into the *sound*, mechanically-checked Coq proofs.

The challenge of this research track depends on the complexity of CRT programs we will target. Some programs will just be impossible to translate, e.g., programs that contain non-positive data types like `Evil` of Task II.1. We will gradually increase the complexity of the target programs and ensure that the translation provides accurate failure messages, so it is usable from the early stages. Based on the `hs-to-coq` [16] project that translates significant portions of Haskell's real-world libraries into Coq, we expect our translation to be applicable to real code. Of course, in `hs-to-coq` the Coq proofs are performed manually, but in this research track the proof derivation is directed by the CRT certificates and is automated by SMTCoq. The PI plans to collaborate on this track with Joachim Breitner, lead contributor of `hs-to-coq`, and Aleksander Nanevski, both Coq experts.

b.3 Research Track III: Logic of Refinement Types

In this research track we will define LRT, the logic for refinement types. In Task III.1 we present an LCF-style, extensible methodology that consistently defines LRT. We discuss extensions of our methodology to ADTs (Task II.2) and eventually System F_ω (Task II.3).

Task III.1: Definition of a consistent LRT

Figure 2 summarizes our methodology to define LRT, the logic of refinement types. We begin with an existing programming language PL with expressions e , (unrefined) types t and a typing relation $\Gamma \vdash_{PL} e : t$. In this task we pick PL to be simply typed lambda calculus (STLC) and later extend it. We define LRT on top of PL (à la LCF [66]), that is, the syntax of propositions ϕ in LRT includes *boolean* expressions of PL and quantifiers over these expressions:

$$\phi \doteq \forall_{x \in PL} \phi \mid \exists_{x \in PL} \phi \mid e$$

We define the judgement $\Gamma \vdash_{LRT} \phi$ that, following inference rules of HOL, decides the validity of ϕ based on the assumptions captured by the environment Γ . We use this judgement to define REF, a refinement type system that relies on LRT to refine types with predicates. That is, an expression e gets a type refined by a predicate ϕ when the predicate $\phi[e/v]$ is decided valid by LRT, as in rule T-REF below.

$$\frac{\Gamma \vdash_{PL} e : t \quad \Gamma \vdash_{LRT} \phi[e/v]}{\Gamma \vdash_{REF} e : \{v : t \mid \phi\}} \text{ T-REF} \quad \frac{\Gamma \vdash \tau_l \preceq \tau_r \quad \Gamma \vdash \{v : \tau_l \mid \phi\}}{\Gamma \vdash \{v : \tau_l \mid \phi\} \preceq \tau_r} \text{ T-LREF} \quad \frac{\Gamma \vdash \tau_l \preceq \tau_r \quad \Gamma, v : \tau_l \vdash_{LRT} \phi}{\Gamma \vdash \tau_l \preceq \{v : \tau_r \mid \phi\}} \text{ T-RREF}$$

The left subtyping rule T-LREF allows weakening, i.e., the refinement ϕ can be ignored as long as it is well-formed, while the right subtyping rule T-RREF allows strengthening using LRT to decide validity. These rules (that are similar to RCF [37]) come with the benefit that the logic of REF is LRT which

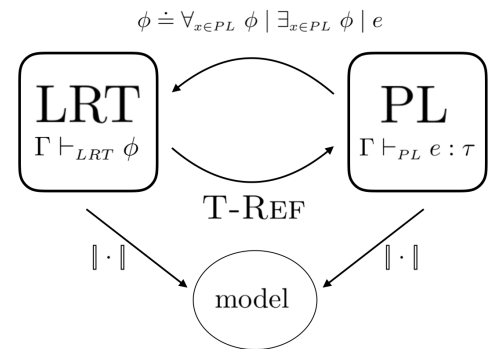


Figure 2: Definition of the logic of refinement types LRT with respect to the programming language PL.

is a variant of HOL and, as such, provides an ideal framework to study the metatheoretical properties of refinement types. Yet, in REF all refinements are decided solely using higher order inference rules of quantified expressions and without following the structure of the expressions. Thus, type checking in REF (as in RCF [37]) is undecidable and, as such, cannot be used to define a practical system.

The first goal of this task is to define REF as a sound approximation of the refinement type system CRT. That is, type checking in CRT implies type checking in REF.

Goal 3 (Sound Approximation) *If $\Gamma \vdash_{CRT} e : \tau$, then $\Gamma \vdash_{REF} e : \tau$.*

To prove this goal we need to carefully define the inference rules and axioms of LRT to sufficiently encode the reasoning of the (expression-directed) typing rules of CRT. As in research track II, the explicit certificates of CRT will help clarify where the calls to LRT are required.

The second goal of this task is to show that the inference rules of LRT we defined are consistent.

Goal 4 (Consistency of LRT) *There is no proof of $\emptyset \vdash_{LRT} \text{false}$.*

To show consistency we will follow the technique of [66, 41] and interpret both LRT and PL to the same consistent model, i.e., some appropriate consistent cartesian closed category. Next, we will show that each element of the model satisfies the inference rules and axioms of LRT. These two steps, combined with the known consistency of the mathematical model, show that LRT is consistent.

The Goals 3 and 4 combined imply consistency of the CRT typing rules.

Task III.2: Extension of LRT with Refined Data Types

In this task we will extend LRT with refined ADTs. As explained in Task II.1, ADT definitions can be refined to express invariants of data types. These invariants are checked at construction and assumed at destruction of the data type. The checking is easy, data constructors are (injective) functions with the refined types provided at the data definition. The destruction is more complicated. The typing rule for case analysis of monomorphic lists in practical refined systems, like CRT, is the following.

$$\frac{\begin{array}{l} \Gamma \vdash l : \{l : [\text{Int}] \mid p\} \quad \Gamma, l : \{l : [\text{Int}] \mid p \wedge p_{nil}\} \vdash e_{nil} : \tau \\ \Gamma, x : \{x : \text{Int} \mid p_x\}, xs : \{xs : [\text{Int}] \mid p_{xs}\}, l : \{l : [\text{Int}] \mid p \wedge p_{cons}\} \vdash e_{cons} : \tau \\ \Gamma \vdash [] : \{l : [\text{Int}] \mid p_{nil}\} \quad \Gamma \vdash (:) : \{x : \text{Int} \mid p_x\} \rightarrow \{xs : [\text{Int}] \mid p_{xs}\} \rightarrow \{l : [\text{Int}] \mid p_{cons}\} \end{array}}{\Gamma \vdash \text{case } l \text{ of } \{ [] \rightarrow e_{nil}; x : xs \rightarrow e_{cons} \} : \tau} \quad \text{T-Case}$$

The rule performs case analysis on l to return e_{nil} if l is $[]$ and e_{cons} otherwise. Each subexpression is checked in an environment that is appropriately strengthened both by the refinement of l and also by the refinements of the constructors (i.e., p_{nil} and p_{cons}) as retrieved by the environment. This strengthening permits *case sensitivity*, a critical feature to practical refinement types. For instance, in the below (left) definition of `head`, type checking will deduce that the call to `error` is provably dead code, because it is checked under an environment where `xs` has length both positive (by the precondition) and zero (by the strengthening on the case subexpression).

<code>head :: xs:[Int] 0 < len xs } → Int</code>	<code>induction :: l:[Int] → {v:() 0 ≤ len l }</code>
<code>head [] = error "provable dead code"</code>	<code>induction [] = ()</code>
<code>head (x:_) = x</code>	<code>induction (_,xs) = ()</code>

The T-Case rule combines two more features. First, it permits type weakening at merging points, i.e., the types of the two branches can be different as long as they are both subtypes of the type that `case` returns. Second, it encodes the induction principle on lists. For example, the `induction` function on the right above provides a proof that the length of every list is not negative: the proof goes by case splitting and each case is checked in a strengthened environment.

The goal of this task is to extend the LRT with refined data types so that the practical aspects of the rule T-Case are preserved while the induction principle consistently extends the logic. That is, our extension should preserve the two Goals of Task II.1.

Task III.3: Extension of LRT to System F_ω

The ultimate goal of this task is to extend LRT with type polymorphism (setting PL to System F) and type operators (setting PL to System F_ω) while preserving semantic subtyping and consistency. This goal is very ambitious but it is the only way to define and understand the principle logic of practical refinement type systems that support these advanced polymorphic features, like Liquid Haskell.

The scene for System F is challenging but approachable. System FR [39] of **Stainless** formalizes a refined System F, but it does not serve our purposes because the formalization is with respect to evaluation (à la **SAGE**; see a.2). Further, **Stainless** by design does not support semantic subtyping and does not permit refinement of type variables, i.e., $\{v:\alpha \mid \phi\}$. As [9] highlights refinement of type variables is a common source of unsoundness: if type variables are refined, then any type that can instantiate them should also be refined. Otherwise, after instantiation, the refinement held by the type variable would get ignored, leading to unsoundness. To circumvent this unsoundness there are three alternatives: 1. no refinements are allowed to type variables [79], which leads to unpractical refinement type systems; 2. all types are refined [9], which opens up interesting metatheoretical questions about the meaning of refinements in functions; and 3. the development of a kind system that separates the type variables that can and cannot be refined. The last approach was proposed by the PI in [42] but has not yet been formalized. In this task we aim to formalize this approach using the technique of Task II.1. To show consistency (Goal 4) we will experiment with variants of Plotkin and Abadi's logic for parametric polymorphism [61] and its proposed model [13].

The scene for System F_ω is less explored. A refined system for System F_ω and semantic subtyping requires reasoning about polarities as, currently unsoundly, implemented in Liquid Haskell ² by the PI, but never formalized. Our sky-high goal is to define the REF rules that use LRT to reason about type operations (Goal 3) and show consistency (Goal 4) using System F_ω 's categorical model [41].

Importance & Challenges

The formalization of the LRT is of high importance for both the theory and the practice of refinement types. On the theoretical side, it will define the principles of refinement types using higher order logics and classic semantic techniques that have been studied since the '70s and are well understood. Our methodology serves a different purpose than the soundness with respect to operational semantics approach that is now commonly used to formalize practical refinement type systems. It aims to define a consistent, mathematical model for refinement types that would clarify which axioms are consistent with the underlying logic. So, on the practical side, it would prevent inconsistencies that currently exist on practical refinement type checkers and jeopardize all the verification user effort.

The application of our methodology to polymorphic systems is very challenging, since both refinement types and higher order logics for polymorphic systems are currently under active research. Yet, the PI has extensive experience and a deep understanding of polymorphism under practical refinement type systems and, after facing various unsoundness on these systems, is convinced that the route of classic program logics is a one-way street to set the foundations of refinement types. To conduct this research track the PI will collaborate with Michael Greenberg and Alex Kavvos, who are experts in the theory and semantics of programming languages.

b.4 Research Track IV: Implementation and Evaluation on Applications

In this research track we will implement certificate generation in refinement type checkers of Haskell to verify web applications (Task IV.1) and Rust to verify cryptographic protocols (Task IV.2).

Task IV.1: Certified Liquid Haskell for Secure Web Applications

In this task we will implement the CRT certificate generation as a back-end to Liquid Haskell and use it to target existing Haskell code. Liquid Haskell is a practical refinement type checker that verifies CoreSyn, GHC's intermediate representation that is a variant of System F_ω . The goal of this task is to extend Liquid Haskell's implementation with the sufficient book-keeping required to generate the certificates of CRT. This extension will be activated using a Liquid Haskell language pragma:

```
{-@ LIQUID "--certified:option" @-}
```

The option will determine if the certificates are validated or tested, as described in research track 1, or a complete translation to Coq is attempted, following research track 2. Importantly, when the extension is not activated, there should be no effect in the efficiency of Liquid Haskell.

The extension will be developed early and serve as the play ground to quickly prototype and gradually extend all the research ideas of the proposal. This way all the developed ideas can get immediately applied in real-world Haskell code. At the beginning, we plan to target Haskell’s `containers` libraries. These libraries have already been verified by Liquid Haskell [77] and translated to Coq via `hs-to-coq` [16], giving us confidence that the certificate generation for these libraries is feasible and also providing a reference against which we can compare our translated Coq code.

Secure Web Applications `STORM` [47] is a web framework, verified in Liquid Haskell, that allows developers to build model-view-controller applications with compile-time enforcement of centrally specified data-dependent security policies. `STORM` has been used to develop secure web implementations of real applications including `DISCO` for video conferences and `VOLTRON` for in-class collaborative programming. Yet, the Liquid Haskell verification of `STORM` is flirting with unsoundness. It uses sophisticated, unformalized features (e.g., contravariant type checking of higher ranked type constructors) that the PI implemented to accommodate `STORM` verification, but are not formalized. The generation of a formal, i.e., certified, verification of `STORM` while keeping all the user-end automation is the goal of this task. On the pursuit of this goal we will apply the Coq generation of track 2 and the semantic understanding of track 3 to derive a sound verification of the `STORM` and similar web frameworks.

Task IV.2: Certified Liquid Rust for Secure Cryptographic Protocols

In this task we will implement certificate generation as a back-end of Liquid Rust, a refinement type checker for Rust programs that the PI has recently started developing with her PhD student, following the design principles of practical refinement types described in § a.2. At this early stage, refinement type checking rules are still being developed to accommodate Rust specific features, including memory management, aliasing and sharing. We expect that the certificate generation can also be adjusted to accommodate these features, yet the concrete adjustments require careful design. In the duration of this proposal, the certificate generation and Liquid Rust projects will, in parallel mature and integrate. This integration plan is important to direct a certificate generation methodology that is general and flexible enough to be used by multiple refinement type checkers.

Secure Cryptographic Protocols Rust combines memory and type safety, reasoning about over- and underflows, and generation of efficient and predictable LLVM code. This unique combination renders Rust the language that cryptographers choose to implement protocols that are not vulnerable to side channel (e.g., time and memory) attacks. For example, `RustCrypto` [89] is a suite of cryptographic algorithms carefully implemented in Rust that is trusted and used for industrial development. But, Rust’s type system is not expressive enough to enforce functional safety of the protocols, thus the implementations rely on various runtime assertions. The first milestone of this task is to employ Liquid Rust to statically verify (and thus eliminate) the assertions on `RustCrypto`. The long term goal is to develop formal cryptographic proofs for the `RustCrypto` implementation: the certificate generation back-end of Liquid Rust will generate concrete proof obligations that can be proved employing existing crypto formal proofs (e.g., from `CertiCrypt` [8]). The achievement of this goal would lead to efficient and formally verified cryptographic protocols that are easy to develop.

Importance & Challenges

This research track is critical to ensure that the theoretical developments of the first three tracks are applicable to real software. Task IV.1 will ensure, from the early stages, the usefulness of our methodology, while Task IV.2 will ensure generality. Importantly, this task implements a verification framework where the user develops real world applications that are automatically verified using SMT and gets formal, machine-checked proofs, delivering both practical and sound software verification.

The two tasks come with different sets of challenges. The first challenge of Task IV.1 arises from our choice to directly incorporate our novel developments in Liquid Haskell instead of a prototype implementation. Both the maintenance cost and the entry cost of new students into a big codebase are challenging. The PI has already collaborated with many students and has the experience of developing herself the proper interfaces to minimize the entry costs. Further, she will hire a research

Research Tracks	Year 1				Year 2				Year 3				Year 4				Year 5			
	1	2	3	4	1	2	3	4	1	2	3	4	1	2	3	4	1	2	3	4
I: CRT	Task I.1																			
II: TT																				
III: LRT																				
IV.1: CLHaskell																				
IV.2: CLRust																				

Figure 3: Gantt chart of CRETE.

programmer to help with the maintenance requirements of this task. The second challenge of Task IV.1 is that certificate generation for the complete calculus of Liquid Haskell might not be impossible. To ameliorate this challenge, from the early stages, our implementation will emit descriptive feedback in case of failure helping both the developers and the users to understand whether failure is due to implementation errors or due to inherent limitations of the system and thus potential unsoundness.

Task IV.2 is challenging because Liquid Rust is still in a developing stage, thus the certificate generation requires careful design. The synergetic development of these projects will foster the generality of certificate generation and the development of Liquid Rust under novel sound foundations. Further, this task is challenging because it requires deep understanding of refinement types, the Rust compiler internals, and cryptography. The PI has started this project with her PhD student, who is an active Rust developer, and Gilles Barthe and Dario Fiore, both cryptography experts.

b.5 Organization

Figure 3 summarizes the Gantt chart of CRETE. All the research tracks rely on the development of the certified terms (Task I.1) and will be prototyped as a back-end to Liquid Haskell (Task IV.1), so in the first year we will focus on the proper design and immediate implementation of CRT. The remainder of research track I will start in the second year and continue until the forth. The research tracks II and III will start after the first year and will last at least four years. The Liquid Rust project (Task IV.2) has already been initiated and will be developed using the CRETE’s sound foundations.

b.6 Conclusion

In summary, CRETE will elaborate programs that refinement type check with explicit proof certificates. These certificates will be independently validated and tested or used to derive sound Coq proofs for the original program. Further, CRETE will define a HOL-style logic that approximates reasoning of refined System F_ω with semantic subtyping, setting the principles of refinement type checking. Finally, our approach will be applied to reason about cryptographic protocols in Rust and secure web applications in Haskell, evaluating the claim that it achieves both practical and sound verification.

High Risk CRETE is high risk because the derivation of Coq proofs will require careful engineering and potentially critical restrictions on the original system. Similarly, the definition of the logic for refined System F_ω is challenging given the complexity of the system. To ameliorate the risk we can restrict the system to a calculus that is consistent but expressive enough to address the practical applications studied in CRETE. The PI has been an active developer of Liquid Haskell for nine years and has extensive experience with the design and implementation of practical refinement types, and the soundness limitations involved. Finally, IMDEA, without any teaching obligations and with expert colleagues, provides the perfect work environment to carry out such a risky experiment.

High Impact CRETE will impact both the academic and industrial communities. We believe that, in the future, the deeper understanding attained by the development of the logic of refinement types, combined with the explicit certificates, will shed new light in open research problems in the area of refinement types, e.g., error reporting and inference of type specifications, both critical for usable verification. Importantly, CRETE, via the front-end of automated, practical refinement types, makes sound verification accessible to industrial developers. This low-cost, high-profit approach will encourage further adoption of formal verification and potentially refinement types will, by design, be integrated in future mainstream programming languages.

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