A Direct-Style Effect Notation for Sequential and Parallel Programs

David Richter **□ 0**

Technical University of Damstadt, Germany

Timon Böhler ⊠ •

Technical University of Damstadt, Germany

Pascal Weisenburger

□

□

University of St. Gallen, Switzerland

Mira Mezini **□ 0**

Technical University of Damstadt, Germany hessian.AI, Germany

- Abstract

Modeling sequential and parallel composition of effectful computations has been investigated in a variety of languages for a long time. In particular, the popular do-notation provides a lightweight effect embedding for any instance of a monad. Idiom bracket notation, on the other hand, provides an embedding for applicatives. First, while monads force effects to be executed sequentially, ignoring potential for parallelism, applicatives do not support sequential effects. Composing sequential with parallel effects remains an open problem. This is even more of an issue as real programs consist of a combination of both sequential and parallel segments. Second, common notations do not support invoking effects in direct-style, instead forcing a rigid structure upon the code.

In this paper, we propose a mixed applicative/monadic notation that retains parallelism where possible, but allows sequentiality where necessary. We leverage a direct-style notation where sequentiality or parallelism is derived from the structure of the code. We provide a mechanisation of our effectful language in Coq and prove that our compilation approach retains the parallelism of the source program.

2012 ACM Subject Classification Software and its engineering \rightarrow Domain specific languages; Software and its engineering \rightarrow Concurrent programming structures; Software and its engineering \rightarrow Parallel programming languages

Keywords and phrases do-notation, parallelism, concurrency, effects

Supplementary Material Software: https://github.com/stg-tud/parseq-notation

Funding David Richter: German Federal Ministry of Education and Research iBlockchain project (BMBF No. 16KIS0902)

Timon Böhler: Hessian Ministry of Higher Education, Research, Science and the Arts via the project 3rd Wave of AI (3AI)

Pascal Weisenburger: The University of St. Gallen (IPF, No. 1031569); Swiss National Science Foundation (SNSF, No. 200429)

Mira Mezini: Hessian Ministry of Higher Education, Research, Science and the Arts via the project 3rd Wave of AI (3AI); BMBF and the Hessian Ministry of Higher Education, Research, Science and the Arts within their joint support of the National Research Center for Applied Cybersecurity ATHENE; German Federal Ministry of Education and Research iBlockchain project (BMBF No. 16KIS0902)

1 Introduction

Programming language designers often select a few common effects (state, IO, network) and bake them into the language. It is, however, impossible to predict what effects developers

2 A Direct-Style Effect Notation for Sequential and Parallel Programs

will need in the future (as was the case with integrated queries [32, 30, 4], reactive programming [31], asynchronous programming [51, 5], multitier programming [36, 43], differentiable programming [23], etc). Thus, we argue that language designs should be equipped with support for developer-implementable effects.

Modeling effectful computations has long been the subject of investigation in the context of various languages. As a result, there exist different abstractions and notations with different properties. A prominent abstraction for modeling effectful computations are monads (e.g., known from Haskell) and the do-notation that emerged from monadic comprehensions [55] providing a lightweight way to embed monads into programs. But monads force effects to be executed sequentially, ignoring potential for parallelism. Notations for parallelism, such as idiom bracket notation for applicatives [29], on the other hand, do not support sequential effects. Yet, programs are rarely only parallel or only sequential; thus it is desirable to support both sequential and parallel composition of effectful operations.

To the best of our knowledge, there are no approaches that provide such support. The ApplicativeDo approach by Marlow et al. [27, 28] attempts to retrofit parallelism into the do-notation, i.e., with ApplicativeDo, developers write code using the do-notation and an optimising compiler tries to infer which computations are parallelizable. Yet, in the general case, it is not possible to decide statically whether two monadic operations are actually parallelizable or whether the result of one operation depends on the execution of the other. Hence, there is a danger that the compiler either incorrectly decides that two operations can be executed in parallel, which can lead to race conditions, or conservatively decides to not parallelize operations that could actually be parallelized, reducing the potential for improved performance. To counteract race conditions, the ApplicativeDo approach requires developers to adhere to specific coding conventions such as only using expressions which are either all read-only or write-only [27].

Another weak point of Haskell's do-notation (and thus also of the approach by Marlow et al.) is that it enforces a specific structure upon the code with strict adherence to one effect per line, which does not allow effects in arbitrary places. The do-notations in Idris [21] and Lean [25, 52] are less restrictive and support direct-style effect usage. Scala supports both structuring effectful code in do-notation via for-comprehensions and for in some cases in direct-style via async-await [44]; but, both are based on monads, thus force sequential execution. Although async-await was explicitly designed for concurrency, developers must be careful to start parallel execution before accessing their result to preserve parallelism.

In this paper, we propose a direct-style notation that enables sequential and parallel composition of effectful operations (using monads and applicatives, respectively) without forcing a specific structure of the code. We present a one-pass translation from direct-style to monadic effect combinators. Instead of trying to infer the potential for parallelism on top of sequential programs, our approach preserves parallelism that is inherent in the structure of the code thanks to direct style. This makes it easier to reason about the correctness of the proposed translation process and we present a correctness proof and its mechanization in Coq [9]. We conceptualize the preservation of parallelism as the span of a term (the length of the longest path of effectful operations) and the work of a term (the sum of all effectful operations therein). Our translation is span-preserving leveraging applicatives and monads. In contrast, notations based on monads alone are not span-preserving, as they have to chain all effectful operations into a single sequence.

Our compilation has an elegant description as a set of equations forming a structurally recursive function over the syntax, whose equations are the well-known monadic and applicative laws and free theorems. Implementations for do-notation are essentially compilers for

an effectful language. They can produce efficient code by avoiding administrative redexes and generating proper tail calls. Including this optimisation in standard effectful languages modeled by monads can be seen as performing partial evaluation of the code via the semantics, extended by the monad laws. In our case, we target mixed monadic and applicative code. Therefore, our optimised translation also combines the use of the monadic laws with the use of applicative laws.

Contributions. In summary, this paper makes the following contributions:

- We present the first mixed applicative/monadic direct-style effect notation.
- We formalize an optimised one-pass translation from direct-style to effect combinators.
- We prove that our translation preserves typability, semantics, and parallelism.
- We mechanize the proof using parametric higher order abstract syntax.
- We implement the proposed translation in the Scala programming language using Scala macros, which enables us to stay close to the formal development.

Structure. The remainder of the paper is structured as follows. Section 2 provides code examples and an intuitive overview of our approach. Section 3 formally defines the proposed translation and provides a proof that it preserves typability, semantics, and parallelism, which is mechanized using parametric higher order abstract syntax. Section 4 presents the implementation in Scala. Section 5 surveys related work. Section 6 concludes the paper and presents ideas for future work.

2 Overview

In this section, we (a) briefly discuss the difference between monadic, applicative, and mixed notations by examples in Scala, and (b) informally present our mixed direct notation and its implementation by translation to effect combinators.

2.1 Monadic, Applicative, Mixed and Direct Style Notations

Functors, Applicatives and Monads. A functor (in functional programming) for F: Type \rightarrow Type is a method map that turns a function on values into a function on values wrapped in the functor. Intuitively, a value of type F A represents an effectful computation of type A. An applicative for F is a functor and a method pure to wrap a value into the functor, and a method ap (which we occasionally also write $f \diamond x$ instead of ap f x) to apply an effectful computation returning a function, to an effectful computation returning an argument. A monad for F is an applicative for F and a method bind, which runs an effectful computation and feeds the resulting value to another effectful computation. Below we show the mathematical description and an encoding in Scala via traits:

```
\begin{array}{c} \text{trait Functor}[F[\_]]:\\ \text{def map}(f\colon A\Rightarrow B, \, a\colon F[A])\colon F[B]\\ \text{map: } (A \rightarrow B) \rightarrow (F \ A \rightarrow F \ B)\\ \text{pure: } A \rightarrow F \ A\\ \text{ap: } F \ (A \rightarrow B) \rightarrow (F \ A \rightarrow F \ B)\\ \text{bind: } (A \rightarrow F \ B) \rightarrow (F \ A \rightarrow F \ B)\\ \text{trait Monad}[F[\_]] \text{ extends Functor}[F]:\\ \text{def bind}(f\colon A\Rightarrow F[B], \, a\colon F[A])\colon F[B]\\ \text{Scala} \end{array}
```

For convenience, we will write pure(x), x.bind(f) and f.ap(x), so we define them in Scala as a extension methods for every object which has a corresponding instance, and pure(x) as

4 A Direct-Style Effect Notation for Sequential and Parallel Programs

a top-level function. Note that we swapped arguments for bind as a method x.bind(f) with regard to its type as a function bind(f)(x).

Monadic Notation. To illustrate monadic notations, consider the two lines of code below (left side) that use a for-comprehension for ... yield ¹ The programs execute two effectful statements fetchX and fetchY and bind the result in variables x and y, respectively, to be combined by a function call to f. The for-comprehension (monadic notation) is desugared into explicit use of monadic bind (right side).

Applicative Notation. In the programs above, x does not depend on y and vice versa. If all statements in the program of an applicative are independent from each other – e.g., none of the variables that are introduced in the for-comprehension are used in the for part, but only after the yield, which has access to all variables introduced above – we can interpret the for-comprehension as an applicative notation instead of monadic notation. Then, the program below on the left side would be translated into the program below on the right side, using applicative ap to encode actual parallelism, where ap is parallel execution followed by function application. In the example program, pure(f), x and y are executed in parallel, followed by the function application of the result of pure(f) to the result of x and the result of y:

```
 for \ x \leftarrow fetch X; \ y \leftarrow fetch Y \ \ yield \ f(x)(y) \\ \ \ \ Scala \\ \ \ Scala \\
```

Mixed Notation. To illustrate where these notations for effectful computations fall short, consider the following larger program that fetches four resources from the Internet. The program first fetches a resource urlXX, which contains another url urlX, and then fetches a resource from urlX and stores it in x. The program further fetches a resource urlYY, which contains another url urlY, and then fetches the resource from urlY and stores it in y. Finally, the program concatenates x and y:

Observe that urlXX needs to be fetched before urlX can be fetched and urlYY needs to be fetched before urlY can be fetched. But fetching urlXX and urlYY is independent from each other; and so is urlX and urlY (as illustrated in the diagram above). Thus, the example contains

¹ For-comprehensions for ... yield ... are Scala's equivalent of Haskell's do-notation do ...; return ... The main difference besides Scala's and Haskell's monadic notation is that every for-comprehension must end with a yield . Yet, this does not reduce expressive power, as any do-block without a final return can be expressed with an additional binding, e.g., do ...; e can be represented by for ...; tmp ← e yield tmp.

both parallel and sequential elements. However, if implemented via monadic notation, the program will run sequentially, fetching urlXX, then urlX, then urlYY, then urlY. The applicative notation, on the other hand, is not even possible because it would require all effects to be independent from each other.

Direct-Style Mixed Notation. In our direct-style notation, we combine the syntactic form for ... yield ... into a single instruction purify. Now, the program can be written to look like the following snippet, which reads *Concatenate (1)* the result of fetching the value pointed to by a URL by fetching urlXX with (2) the result of fetching the value pointed to by a URL by fetching urlYY:

The purify operation introduces an operation of type \downarrow : $F[X] \Rightarrow X$ used like \downarrow into the local scope, which represents direct-style effect execution. If the enclosed code does not make use of the \downarrow , the operation purify works exactly like pure. Otherwise, effect execution \downarrow is translated into proper use of bind and ap.

In direct style, potential for parallelism is implicitly defined by the structure of the code. In particular, the function arguments of concat ++ naturally have no dependency on each other, and can therefore be executed in parallel. The corresponding program with explicit mixed monadic/applicative combinators is:

```
pure(x \Rightarrow y \Rightarrow x + + y).ap(\ fetch(urlXX).bind(fetch)\ ).ap(\ fetch(urlYY).bind(fetch)\ )
```

The approach we propose in this paper exploits the information encoded in our direct-style notation to define a compositional (e.g., structurally recursive) and provably correct compiler that transforms such direct-style programs into semantically equivalent mixed applicative/monadic programs.

2.2 Discussion

We discuss the similarities and differences between different notations. For illustration, consider that monadic code in the for/yield notation can be easily refactored into direct style, roughly by replacing \leftarrow with = \downarrow . In turn, monadic code is compiled into explicit use of monadic operators by calling bind on each value and calling map on the last:

Scaling. A benefit of direct-style code is that it "scales" better for larger programs in the sense that it integrates well with common language constructs. In particular, direct style composes better with branching. Consider the following versions of the same program. On the left, the program is written in monadic notation, implemented in pure Scala, which requires us to leave and enter monadic notation a second time. The program fetches the time of the last change and the last caching of a certain request. If the resource has been updated since the last caching, we count the cache miss for statistics, request the resource freshly, pass it to the cache and return it. Otherwise, we count the cache hit for statistics, and return

the answer from the cache. Now, compare the program on the left with a clearer direct-style representation on the right, which is implemented using our approach (code on the right).

```
for freshtime ← fetch (freshtimeUrl )
     result
                                                                purify:
        \quad \text{if} \quad \text{freshtime} \quad > \quad \text{cachetime} \quad
                                                                   if fetch (freshtimeUrl ). \downarrow >
                                                                       fetch (cachetimeUrl ).↓
        then for
                            ← countFresh
                     tmp1 \leftarrow fetchFresh
                     tmp2 ← writeCache (tmp1)
                                                                      countFresh .↓
                     yield tmp2
                                                                      parseAndCache(fetchFresh .\downarrow). \downarrow
                     \underline{\hspace{0.5cm}}\leftarrow \mathsf{countCache}
                                                                   else
                     \mathsf{tmp} \; \leftarrow \; \mathsf{readCache}
                                                                      countCache. J
                     yield tmp
                                                                      readCache. \downarrow
     yield result
                                                        Scala
                                                                                                                              Scala
```

Sub-notations. Direct-style notation subsumes three different explicit effect notations (Table 1). First, if a purify expression contains exactly one down arrow \downarrow as a mark for effect execution (Row 1), then the notation translates to solely using the Functor interface. This case corresponds to a standard map operation.

Second, if a purify expression contains multiple such marks, which are "parallel" with regard to each other (Row 2) – i.e., when they are side-by-side inside different arguments to a function – then the expression translates to solely using the Applicative interface. Crucially, in this case, different effect executions cannot depend on each other. We call these effect executions "parallel" as contrasted with "sequential" code, where a statement can depend on the previous one. Such parallel composition enables parallel execution of effects at run time.

Third, if the expression makes use of nested marks (Row 3) – or equivalently of marks which make use of previously bound variables which contained marks (Row 4) – then the expression translates to using the full Monad interface, which models sequential code.

Direct-style enables to define parallelism naturally by structuring code such that the execution of effects are independent, which gives rise to parallel execution of code where this is possible and using sequential execution where necessary.

2.3 From Laws to a Rewrite System

We refresh the laws of functors, applicatives, and monads and give an intuition how they can be used to optimise effectful programs. Then we state a completion of the laws into a rewrite system. We use the symbol \circ for function composition as in $f \circ g$, and use the symbol (\circ) as the name of function composition, when not used as an infix operator, i.e., $(\circ) f g v := f (g v)$.

Table 1 Subnotations.

Scheme	Description	Typeclass
$\begin{array}{c} \\ \text{purify} \{ \ \ \downarrow \ \ \} \\ \text{purify} \{ \ \ \downarrow \ \ \downarrow \ \ \} \end{array}$	one mark multiple marks	Functor map Applicative ap
purify{ (↓).↓ }	nested marks	Monad bind
purify $\{; val x = \downarrow; \downarrow \}$	consecutive marks	Monad bind

Laws. Typically, the coherence laws are formulated as follows [29, 26].

For Functors, map preserves identity and composition, i.e., applying the identity function to an effectful computation is the same as not doing anything; and applying two function in sequence to an effectful value is the same as applying the composite once.

For Applicatives, pure creates a effect-free, i.e., pure value from a value. The homomorphism law states that, applying a pure function to a pure argument is pure. The identity law states that, if the function is just pure, then there is nothing to do. The interchange law states that, if the argument is pure, then we can swap the pure argument with the effectful function.

For Monads, the first and second laws state that executing a pure computation amounts to not having to execute any effect at all, allowing us to eliminate the bind. The third law states that bind is associative, i.e., applying two effectful functions in sequence is the same as applying the effectful composite of the two functions once.

```
leftunit : bind f (pure v) = f v
rightunit : bind pure v = v
associativity : bind g (bind f v) = bind (bind g \circ f) v
```

Free theorems. The laws are phrased as an equational theory – to create a compiler from the laws, we need to rephrase them as a terminating rewrite system. To do so, we first complete our set of equations with the following free theorems. Free theorems hold in programming languages with parametric polymorphism by parametricity for free [54, 53], therefore they are often not stated specifically in the laws, because there is no additional effort required to make them hold. On the other hand, as we are interested in making use of laws for optimisation purposes, we are allowed to make use of the free theorems as well.

Consider the function pure: \forall A, A \rightarrow F A. Because it must work over all A it cannot change or create new elements of type A, but only duplicate or forget values of type A. Therefore, it does not matter whether we apply a function g to change the As into Bs before or after applying pure. On the left we apply f on the argument of pure, on the right we apply f on the result:

```
free\_pure: map f (pure v) = pure (f v)
```

Similarly, consider the function ap: \forall A B, F (A \rightarrow B) \rightarrow F A \rightarrow F B and bind: \forall A B, (A \rightarrow F B) \rightarrow (F A \rightarrow F B). On the left we apply f on the argument of ap and bind, on the right we apply f on the result, where (f \circ) stands for λ g, f \circ g:

```
free_ap : ap (map (f \circ) g) v = map f (ap g v)
free_bind : bind (map f \circ g) v = map f (bind g v)
```

We instantiate g with pure id in the applicative case and with pure in the monadic case, then we can extend the equation chain to the left by the free theorem of pure (map $f \circ pure =$ pure \circ f), and to the right by the identity applicative law (ap (pure id) v = v) respectively the left-unit monad law (bind pure v = v):

```
= ap (map (f\circ) (pure id)) v = map f (ap (pure id) v) = map f v
*free_ap : ap (pure f) v
                                                                      = map f (bind pure v)
*free_bind : bind (pure \circ f) v = bind (map f <math>\circ pure) v = bind (map f \circ pure)
                                                                                                       = map f v
```

In fact, these two equation share a common right-hand side, and thus we can combine them to get a connection between applicative ap and monadic bind:

```
ap (pure f) v = bind (pure \circ f) v
ap_bind:
```

Completion. We can use the free theorems to complete the functor, applicative and monad laws into a more suitable form. In particular, we replace the identity law of the applicative with their generalization derived above. Similarly, the right hand side of the interchange law contained the left hand side of the identity law, therefore we simplify it by composition with the identity law. Further, observe that the homomorphism law becomes superflous, as it can be constructed by applying the identity law (or equivalently by the interchange law) followed by the free theorem of pure; however we will still make use of it in swapped direction, such that reading the laws from left to righ, it does not overlap with the other applicative laws. The complete set of equations is now:

```
identity
               : map id v
                                       = map (f \circ g) v
composition
               : map f (map g v)
homomorphism : pure (f v)
                                       = pure f \diamond pure v
                                                                          — swapped
                                       = bind (\lambda v', pure (f v')) v -- generalised by ap_bind
identity
               : pure f ⋄ v
                                       = bind (\lambda f', pure (f' v)) f -- combined with identity
interchange
               : f ⋄ pure v
                                                                          -- combined with identity
composition
               : u ◊ (v ◊ w)
                                       = map (\circ) u \diamond v \diamond w
                                       = f v
leftunit
               : bind f (pure v)
rightunit
               : bind pure v
               : bind g (bind f v) = bind (bind g \circ f) v
associativity
```

Looking at the equations above, we see that the identity and interchange law show that a non-pure argument to ap on the left and on the right can each be represented by a bind, so one might think both laws can be unified by a single law, using two binds like fs \diamond xs = bind (λ f, bind (λ x, pure (f x)) xs) fs. However, it is not valid to assume this equation. Actually, there are at least two possible trivial instances of an applicative for any monad, the left-to-right applicative above, but also the right-to-left applicative: $fs \diamond xs = bind(\lambda x)$ bind $(\lambda f, pure(f x))$ fs) xs. There is no reason to prefer one over the other, and, in general, the assumption of either of these equations is too strong; committing to one such equation would allow elimination of all aps into binds, and thus implies full sequentiality. To support parallelism, we have to make neither assumption and only rely on the equations derived from the applicative laws.

2.4 **Translation**

We present a rewrite system based on the laws, and prove its terminating by phrasing it as a structurally recursive function.

We distinguish between a source language and a target language below. The source language consists of term formers for variables, function application, and the direct-style effect execution \downarrow represented as Each. The target language consists of term formers for variables, function application, and effect combinators Pure, Bind and Ap; and parallelism is explicitly structured by those combinators.

The source language uses direct style. In programs written in the source language, parallelism is implicitly defined by the structure of the code. In particular, function arguments naturally have no dependency on each other, and can therefore be executed in parallel. Our compiler translates direct style into monadic and applicative combinators. The essence of our compilation strategy is to use the monadic and applicative laws directly as the actual transformation rules.

Basic Translation. The translation starts with the PURE expression, which is implemented as a structurally recursive function over syntax, expanding the direct-style use of effects \leftarrow into the effect operation Bind, while variables are wrapped in a PURE, and function application is translated to applicative Ap, realising that function arguments can be executed in parallel.

```
PURE: Src \rightarrow Tgt

PURE (Var x) = Pure (Var x)

PURE (Each e) = Bind (PURE e) id

PURE (App f e) = Ap (PURE f) (PURE e)
```

Optimising Translation. If we only cared about a correct translation from the direct-style notation to the pure calculus with explicit combinators, then the translation we discussed so far is sufficient. Yet, we consider an optimising translation (Figure 1), where instead of term using the constructors Bind and Ap (capitalized) directly, we use the smart constructors AP and BIND (all capitals) instead. Both the constructor and the smart constructor of a term do construct terms that are semantically indistinguishable, i.e., AP f x \approx Ap f x. Smart constructors, however, internalize the optimisation by reducing to a simpler term if possible. The translation PURE we have described earlier can be seen as such a smart constructor for the Pure term constructor. It also preserves the semantics, i.e., PURE x \approx Pure x.

The only difference between the basic and the optimised translation, is that the optimised smart constructor PURE calls to the smart constructor AP instead of using the term constructor Ap directly, which can lead to further optimisations. In this way, we can leverage smart constructors to integrate the translation with an optimisation into a one-pass optimised translation. For the optimisation, the smart constructors apply the monadic and applicative laws, only in the other direction than the translation, i.e., bubbling up Pure in a structurally recursive way through the term, and thereby removing superflous effect combinators in the generated code.

In particular, AP (Figure 1) will reduce the applicative application of a pure function to a pure argument back into the pure function application with only the result wrapped into Pure (which is simply the reverse rule of the homomorphism law we used above). Similarly, if either side of AP is pure, there are no two effects to be executed in parallel but just a single effect. Hence, we can reduce the term to a single monadic bind. Finally, if neither argument to AP is marked as pure, then we simply return the actual term former Ap and retain the

```
(Src) e, f ::= Var \times | App f e | Each e
                                                                         PURE: Src → Tgt
(Tgt) g, h ::= Var \times | App g h
                                                                                  Tgt \ \rightarrow \ Tgt \ \rightarrow \ Tgt
                | Pure e | Apgh | Bindgh
                                                                         BIND: Tgt \rightarrow Tgt \rightarrow Tgt
         PURE (Var x)
                                = Pure (Var x)
                                                                             -- indistinguishable
         PURE (Each e)
                                = BIND id (PURE e)
                                                                             — effect translation
         PURE (App f e)
                                = AP (PURE f) (PURE e)
                                                                             -- homomorphism law
         AP (Pure f) e
                                = BIND (\lambda x, Pure (App f x)) e
                                                                            -- identity law
         AP f (Pure e)
                                = BIND (\lambda \times, Pure (App x e)) f
                                                                             -- interchange law
         AP f e
                                = Apfe
                                                                             -- indistinguishable
         \mathsf{BIND}\;\mathsf{g}\;(\mathsf{Bind}\;\mathsf{f}\;\;\mathsf{e})\;=\;\;\mathsf{BIND}\;(\mathsf{Bind}\;\mathsf{g}\;\circ\;\mathsf{App}\;\mathsf{f}))\;\;\mathsf{e}
                                                                             — associativity law
         BIND f (Pure e) = App f e
                                                                             -- left unit law
         BIND Pure e
                                                                             -- right unit law
```

Figure 1 Optimised Translation.

parallelism. The optimisation rules that apply to BIND (Figure 1) are similar. If either of its arguments is marked as pure, we can avoid performing effects at all. If we have nested binds, we can apply the associativity rule to generate a chain of binds.

Overall, seven of the ten equations above come from our generalized laws; two hold by semantic indistinguishability, and one is the basis for our $effect\ translation$, namely the translation of the imperative \leftarrow to an explicit bind.

In the following section, we extend the language, formalize the language and the translation using a Coq mechanisation, and prove correctness.

3 Mechanisation

We define the source language that features our effect notation and a translation to a target language which is the subset of the source language that does not include the effect notation. We prove that our translation preserves typability, semantics, and parallel execution, which we measure through the program's span and work. We have mechanized our language and proofs in Coq.

3.1 Definitions

We use (parametric) higher-order abstract syntax (PHOAS) [40, 8], which enables us to reuse the binders of the host language as binders of the guest language. PHOAS avoids the need to define first-order syntax, an operational semantics and capture-avoiding substitution, thereby removing intricate lemmas regarding substitution and hundreds of lines of code from the mechanisation, bringing the proof more in line with a more legible pen-and-paper formalisation.

Further, we use intrinsically typed terms [11, 3, 1, 2], and a type-theoretic semantics [17]. Using intrinsically typed terms together with dependent pattern matching allows us to define total evaluation (in contrast to using untyped terms or simple pattern matching where we

Listing 1 Lawful Monad.

```
Class Monad F := \{
  map \{A B\}: (A \rightarrow B) \rightarrow F A \rightarrow F B;
  pure \{A\} : A \rightarrow F A;
  ap \{A B\}: F (A \rightarrow B) \rightarrow F A \rightarrow F B;
  bind \{A B\}: (A \rightarrow F B) \rightarrow F A \rightarrow F B;
Class LawfulMonad F := \{
  monad :> Monad F;
  idl \{A B\} (f: A \rightarrow F B)
                                                        \{x\}: bind f (pure x)
  idr \{A B\} (f: A \rightarrow B)
                                                        \{x\}: bind (pure \circ f) x = map f x;
  asc \{A B C\} (f: A \rightarrow F B) (g: B \rightarrow F C) \{x\}: bind g (bind f x) = bind (bind g \circ f) x;
         \{A B\} (f: A \rightarrow B)
                                                        \{x\}: ap (pure f) x
                                                                                            = map (\lambda x^{I}, f x^{I}) x;
                                                         \{x\}: ap f (pure x)
         \{A B\} (f: F (A \rightarrow B))
                                                                                            = map (\lambda f', f' \times) f;
  aplr \{A B\} \{f: A \rightarrow B\}
                                                         \{x\}: map f (pure x)
                                                                                            = pure (f x);
  map_map \{A \ B \ C\} \{g: A \rightarrow B\} \{f: B \rightarrow C\} \{x\}: map \{f: B \rightarrow C\}
                                                                                            = map (\lambda x, f(g x)) x;
                                                                                                                              Cog
```

could just define partial evaluation). The reason is that such an approach only needs to consider well-formed terms that *don't go wrong* [33].

The common strategy behind all these approaches is to carve out a subset of the host language, that is the language we want to define (the guest language), and then reusing all the power of the host language to define the guest language, avoiding having to reimplement tedious implementation details: The guest types simply mirror the host types, the guest terms mirror the host terms, and the evaluation function maps guest terms to host terms.

Lawful monads. For brevity, we do not define Functor, Applicative and Monad separately. We define a class Monad and a class LawfulMonad (Listing 1). Monad contains the functions map, pure, ap, and bind. LawfulMonad extends Monad and further contains idl, idr, asc, apl, apr, apl, and map_map, corresponding to the left and right unit law, and the associativity law of the monad, and the identity and interchange law of the applicative, the free theorem of pure, and the composition law of the functor.

Static semantics. From Coq, we use use units (tt: Unit), products ((a,b): $A \times B$), functions ((\(\lambda_a, b\)): A + B). Mirroring the data types of the host language, we define the types for unit (\(\Pi\)), sums ($s \vee t$), products ($s \wedge t$), functions ($s \sim t$) and effects (M) in the guest language (Listing 2a). We define a data type of to label terms with, as belonging to the source language src, the target language tgt, or the either language com (common) (Listing 2c). Label denotation EF m: of (Type + Type) assigns each functor in the host language. Concretely, the target and common label is assigned the identity effect functor (e.g. no offect), and the source language is assigned the effect m given as an argument.

We define a data type $tm \Gamma B t$ for the syntax of our guest language (Listing 2d). The terms are parametrized by a type denotation Γ , a language label B and a type t. The common term formers are abstraction Lam e, application App e f and variables Var v to represent functions; unit Unt e, tuple Prd (e, f) and projections Fst e and Snd e to represent products.

The source language has an additional term former $Each\ e$, which represents the direct-style effect application \downarrow from above. The target language has additional term formers $Pure\ e$, $Ap\ e$, $Map\ f\ e$, and $Join\ e$ representing the effect combinators.

The term former Lam binds variables. In PHOAS, guest-level bindings are represented using the host language's bindings. This is why this constructs takes as an argument a function which binds a variable, represented as a value of type Γ t.

Example. In our encoding, the terms of the guest language can be written similarly to the terms of the host language where each term former of the host language is wrapped by a term former of the guest language.

For example, the identity function $(\lambda \times, \times)$ can be encoded in the guest language as Lam $(\lambda \times, \text{Var }x)$. A term $(\lambda \times y, \text{add} \times y)$ a b – an eta-expanded addition function applied to some arguments – can be expressed as Lam $(\lambda \times, (\text{Lam }(\lambda y, \text{add `App` (Var y) `App` (Var x)))) `App` (Var a) `App` (Var b), writing application <math>\times$ `App` y infix for convenience. Constructing a term of unit type tt is written in the guest language as Unt tt. Similarly, projection on a pair (a,b).1 is written in the guest language as Fst (Prd (a,b)).

Dynamic semantics. Next, we define the dynamic semantics corresponding to the static semantics. The static semantics has three parts: the types, the language labels and the terms. Therefore, the dynamic semantics also defines three parts.

The denotation of a type $EVAL\ m:\ ty \to Type$ (Listing 2b) maps each guest type to its corresponding host type, and is parametrized by a type constructor m, corresponding to the monad we evaluate in.

The denotation of a term with regard to the previously defined type denotation eval \dots : tm (EVAL m) B t \rightarrow EF m B (EVAL m t)) (Listing 2d) interprets the terms in a specific monad depending on which language the terms are labeled from. More concretely it takes a term of type t and of label B to be evaluated in monad m, and returns a value of the denotation of the type EVAL m t wrapped in the denotation of the label EF m B. The evaluation for terms from the source language implicitly have effects and can therefore only be interpreted in a monadic interpreter. For the common and the target language, we define an evaluation as simply the mapping of guest term formers to their corresponding host expressions, while mapping variables to variables.

The decision of which monad to use is governed by the label denotation EF m: ef \rightarrow ty \rightarrow ty (Listing 2c) mapping the target and the common language (whose terms do not have implicitly any effects) to the identity effect, e.g., no effect, while the src language is mapped to the effect M.

Note the way we defined the common, source and target terms, we can relable common terms into source or target terms, e.g., into any other language label relabel: $T \Gamma com t \rightarrow T \Gamma e t$.

Example. Consider the evaluation of the following term, which constructs and then destructs a pair of units, which is equal to unit: eval com (Fst (Prd (Unt tt, Unt tt))) = tt.

Translation. The compilation from the target into the source language is performed by the smart constructor PURE, i.e., we compile from an effectful language into a pure language that uses monadic effect combinators. We formally define PURE (Listing 3) that performs both the action of a normal pure, e.g., wraps the argument into an additional effect tm Γ src t \rightarrow tm Γ tgt (M t), and additionally performs a translation from terms form the source language with effect application Each to terms of the target language using combinators Pure, Map, Ap

Listing 2 Syntax and semantics.

(a) Types. **(b)** Type denotation. (c) Labels and denotation. Inductive Equations Inductive $\mathsf{ef} \; := \mathsf{src} \; | \; \; \mathsf{tgt} \; \; | \; \; \mathsf{com}.$ $\mathsf{ty}\colon \mathsf{\ Type} :=$ EVAL (m: Type \rightarrow Type): ty \rightarrow Type := $\mid \mathbb{T}$: ty $\mid m, \mathbb{T} \Rightarrow Unit$ Equations \mid m, s \lor t \Rightarrow EVAL m s + EVAL m t $| \lor : ty \rightarrow ty \rightarrow ty$ EF m: ef → Type → Type := $| \wedge : ty \rightarrow ty \rightarrow ty$ $| m, s \wedge t \Rightarrow EVAL m s \times EVAL m t$ $| m, src, t \Rightarrow mt$ $| \sim : ty \rightarrow ty \rightarrow ty$ $| m, s \rightsquigarrow t \Rightarrow EVAL m s \rightarrow EVAL m t$ | m,com, t \Rightarrow t $| M: ty \rightarrow ty.$ $\mid m, M t \Rightarrow m \text{ (EVAL m t)}.$ | m,tgt, t \Rightarrow t. Coq

(d) Term and their denotation.

```
Inductive tm \{\Gamma: \mathsf{ty} \to \mathsf{Type}\}: \mathsf{ef} \to \mathsf{ty} \to \mathsf{Type}:=
| Var \{B t\}: \Gamma t
                                           \rightarrow tm B t
 | Unt {B}:
                             Unit
                                                              \rightarrow tm B \mathbb{T}
| \ \mathsf{Prd} \ \{ \mathsf{B} \ \mathsf{s} \ \mathsf{t} \} \text{:} \ \mathsf{tm} \ \mathsf{B} \ \mathsf{s} \ \times \ \mathsf{tm} \ \mathsf{B} \ \mathsf{t} \ \to \ \mathsf{tm} \ \mathsf{B} \ \big( \mathsf{s} \ \wedge \ \mathsf{t} \big)
| \ \mathsf{Fst} \ \{\mathsf{B} \ \mathsf{s} \ \mathsf{t}\} \!\! : \ \mathsf{tm} \ \mathsf{B} \ (\mathsf{s} \ \land \mathsf{t}) \qquad \tiny \rightarrow \ \mathsf{tm} \ \mathsf{B} \ \mathsf{s}
                                                              \rightarrow tm B t
| Snd \{B s t\}: tm B (s \wedge t)
  App \{B s t\}: tm B (s \rightsquigarrow t)
                                                           → (tm B s → tm B t)
| Lam \{B s t\}: (\Gamma s \rightarrow tm com t) \rightarrow tm B (s \leftrightarrow t)
| Each {t}:
                             tm src (M t) \rightarrow tm src t
| Pure {t}:
                             tm com t
                                                      → tm tgt (M t)
                             tm\ tgt\ (\mathbb{M}\ (\mathbb{M}\ t))\ \rightarrow\ tm\ tgt\ (\mathbb{M}\ t)
| Join {t}:
|\hspace{.1cm}\mathsf{Map}\hspace{.1cm} \{s\hspace{.1cm} t\}\colon \hspace{.1cm} \mathsf{tm}\hspace{.1cm}\mathsf{tgt}\hspace{.1cm} (s\hspace{.1cm}\rightsquigarrow\hspace{.1cm} t) \hspace{1.5cm} \rightarrow \hspace{.1cm} (\mathsf{tm}\hspace{.1cm}\mathsf{tgt}\hspace{.1cm} (\mathbb{M}\hspace{.1cm}s) \hspace{.1cm} \rightarrow \hspace{.1cm} \mathsf{tm}\hspace{.1cm}\mathsf{tgt}\hspace{.1cm} (\mathbb{M}\hspace{.1cm}t))
                            tm tgt (M (s \rightsquigarrow t)) \rightarrow (tm tgt (M s) \rightarrow tm tgt (M t)).
| Ap {s t}:
Equations eval \{t \ m\} \{M: Monad \ m\} B: tm (EVAL \ m) B t \rightarrow EF m B (EVAL \ m t) :=
src , Var i
                              \Rightarrow M.(pure) i
                                                                                                                           (* src *)
                                    \Rightarrow M.(pure) (eval \circ k)
src , Lam k
src , Unt tt
                                 \Rightarrow M.(pure) tt
src , Fst e
                                  \Rightarrow M.(map) (\lambda e', e'.1) (eval e)
\mid src , Snd e
                                    \Rightarrow M.(map) (\lambda e<sup>1</sup>, e<sup>1</sup>.2) (eval e)
                                    \Rightarrow M.(ap) (eval e) (eval f)
src, Appef
| \ \mathsf{src} \ , \ \mathsf{Prd} \ (\mathsf{e}, \ \mathsf{f}) \ \Rightarrow \ \mathsf{M}.(\mathsf{ap}) \ (\mathsf{M}.(\mathsf{map}) \ (\lambda \ \mathsf{a}^\mathsf{l} \ \mathsf{b}^\mathsf{l}, \ (\mathsf{a}^\mathsf{l}, \ \mathsf{b}^\mathsf{l}) \ ) \ (\mathsf{eval} \ \mathsf{e})) \ (\mathsf{eval} \ \mathsf{f})
                                     \Rightarrow M.(bind) id (eval e)
src , Each e
             Var i
                                     \Rightarrow i
                                                                                                                           (* com or tgt *)
             Lam k
                                     \Rightarrow eval \circ k
             Fst e
                                     \Rightarrow (eval e).1
            Snd e
                                     \Rightarrow (eval e).2
             App e f
                                     \Rightarrow (eval e) (eval f)
             Prd(e, f) \Rightarrow (eval e, eval f)
             Unt tt
                                     \Rightarrow tt
  tgt, Mapfe
                                     \Rightarrow M.(map) (eval f) (eval e)
                                                                                                                        (* only tgt *)
 tgt, Apfe
                                    \Rightarrow M.(ap) (eval f) (eval e)
tgt , Pure e
                              \Rightarrow M.(pure) (eval e)
tgt , Join e
                                    \Rightarrow M.(bind) id (eval e).
                                                                                                                                                                                Coq
```

Listing 3 Translation.

```
Notation "f AP = (AP f e) (at level 20).
Equations PURE \{\Gamma \times X\} (e: tm \Gamma src \times): tm \Gamma tgt (\mathbb{M} \times) :=
   Var i
                        ⇒ Pure (Var i)
                        ⇒ Pure (Unt tt)
   Unt tt
                        ⇒ Pure (Lam j)
   Lam j
                        \Rightarrow Pure (\Lambda e<sup>I</sup>, Fst (Var e<sup>I</sup>)) `AP` PURE e
   Fst e
                         \Rightarrow Pure (\Lambda e', Snd (Var e')) `AP` PURE e
   Snd e
   \mathsf{Prd} \ (\mathsf{e}, \ \mathsf{f}) \ \Rightarrow \mathsf{Pure} \ (\Lambda \ \mathsf{e}^\mathsf{l} \ \mathsf{f}^\mathsf{l}, \ \mathsf{Prd} \ (\mathsf{Var} \ \mathsf{e}^\mathsf{l}, \ \mathsf{Var} \ \mathsf{f}^\mathsf{l}) \ ) \ `\mathsf{AP}` \ \mathsf{PURE} \ \mathsf{e} \ \mathsf{`AP}` \ \mathsf{PURE} \ \mathsf{f}
                        ⇒ PURE e `AP` PURE f
   App e f
  Each e
                        ⇒ JOIN (PURE e).
Equations AP \{\Gamma \text{ s t}\}\ (f: \text{ tm } \Gamma \text{ tgt } (\mathbb{M} \text{ (s} \leadsto \text{t)})) \text{ (e: tm } \Gamma \text{ tgt } (\mathbb{M} \text{ s})): \text{ tm } \Gamma \text{ tgt } (\mathbb{M} \text{ t}) :=
   Pure f, Pure e \Rightarrow Pure (App f e)
                          e \Rightarrow Map (Lam (\lambda x, App f (Var x))) e
            f, Pure e \Rightarrow Map (Lam (\lambda x, App (Var x) e)) f
                          e \Rightarrow Ap f e.
            f,
Equations JOIN \{\Gamma t\} (e: tm \Gamma tgt (M (M t))): tm \Gamma tgt (M t) :=
   Pure e \Rightarrow to e
            e \Rightarrow Join e.
                                                                                                                                                              Coq
```

and Bind. This translation makes use of the smart constructors AP and JOIN, that perform optimisations.

The Var, App and Each cases were discussed in Section 2.4: The direct-style use of effects Each is expanded into effect operation Bind, while variables are wrapped in PURE, and function application is translated to applicative Ap. The lambda and empty terms describe values and are simply wrapped into a pure as well.

In the case of projections and the case of tuples, we follow the general pattern of the homomorphism law, e.g., we map both the function (projection, tuple) into a Pure and we wrap all arguments in a PURE, and we apply them applicatively.

Example. Assume our language contains an effectful operation fetch. Then, translating the term e := Prd (Each (fetch "foo"), Each (fetch "bar")) yields PURE e = Pure (Lam (λ e', (Lam (λ f', Prd (Var e', Var f'))))) `AP` (fetch "foo") `AP` (fetch "bar").

Span and Work. We define span and work (Listing 4), which we use to express the degree of parallelism. Span is the length of the longest chain of unhandled effectful operations, i.e., the longer the path, the more operations need to run sequentially. Hence, a shorter span for the same number of operations means a higher amount of parallelism. Work is the sum of all unhandled effectful operations. Just like evaluation interprets the value of a term, span and work are interpretations to a numeric value of a term.

As our syntax is defined from types, label and terms, we define these new interpretations as a type denotation, an effect denotation and a term denotation as well. The effect denotation for span and work is the identity function, and the type denotation is the constant function mapping all guest types to the type of natural numbers (SPAN, WORK).

More formally, we define the span of an expression to be zero for variables and values, such as empty and lambda, and for pure expressions. The span of Join and direct-style effect

Listing 4 Span and Work.

```
(a) Span.
                                                             (b) Work.
Equations SPAN: ty \rightarrow Type := |\_ \Rightarrow nat.
                                                             Equations WORK: ty \rightarrow Type := |\_ \Rightarrow nat.
Equations
                                                             Equations
span \{B x\} (e: tm SPAN B x): nat :=
                                                             work \{B x\} (e: tm WORK B x): nat :=
                                                               Var i \Rightarrow 0 | Lam e \Rightarrow 0
  Var i \Rightarrow 0 | Lam e \Rightarrow 0
  Unt tt \Rightarrow 0 | Pure e \Rightarrow 0
                                                               Unt tt \Rightarrow 0 | Pure e \Rightarrow 0
  Fst
       е
                ⇒ span e
                                                               Fst e
                                                                                ⇒ work e
  Snd e
                                                               Snd e
                                                                                ⇒ work e
                ⇒ span e
  Prd (e, f) \Rightarrow max (span e) (span f)
                                                               Prd (e, f)
                                                                                \Rightarrow work e + work f
                ⇒ max (span e) (span f)
                                                                                \Rightarrow work e + work f
                                                               App e f
  Ap e f
                ⇒ max (span e) (span f)
                                                               Ap e f
                                                                                \Rightarrow work e + work f
  Map e f
                ⇒ max (span e) (span f)
                                                               Map e f
                                                                                \Rightarrow work e + work f
                                                                                \Rightarrow S (work e)
  Join e
                \Rightarrow S (span e)
                                                               Join e
                                                                                \Rightarrow S (work e).
  Each e
                \Rightarrow S (span e).
                                                               Each e
                                                      Coa
                                                                                                                   Coq
```

application Each is one more (successor S) than the span of their argument. For assertion and projection (access to first and second component), the span is simply the span of its argument, while the span of a tuple is the maximum of its left or right branch. The span for function application, applicative application and mapping is the maximum of the span of its arguments as well, plus the span of the execution of the specified function on the argument. However, we defined our static semantics such that direct-style effect application cannot be performed under a lambda, therefore the span of the execution of any function is zero.

Analogously, we define the work of an expression to be zero for variables, values, and pure expressions. Similar to the span, the work of Join and direct-style effect application Each is one more (successor S) than the work of their argument. The work of assertion and projection is the work of its argument. Other than span (which takes the maximum), the work of a tuple is the sum of both arguments. The work for function application, applicative application and mapping is the sum of the work of its arguments, plus the work of the execution of the specified function on the argument, which is zero, because lambdas cannot contain Join or Each.

Example. Assume our language contains an effectful operation fetch. We calculate the span and work of a term in the source language e := Prd (Each (fetch "foo"), Each (fetch "bar")) as follows: span e = 1 and work e = 2. This expresses the fact that the two effects can be performed in parallel. The corresponding target language term is $e^t := Pure (Lam (\lambda e^t, (Lam (\lambda f^t, Prd (Var e^t, Var f^t))))) `AP` (fetch "foo") `AP` (fetch "bar"). We get the same results for this term: span <math>e^t = 1$ and work $e^t = 2$.

3.2 Proof

Our translation should only change the encoding from direct-style to effect combinators, while the semantics, typability and parallelism of the term should be preserved. We prove that our translation preserves typability, semantics, span and work. Intuitively, the theorems hold, because our translation performed by PURE, AP, and JOIN are the functor, monad and applicative laws.

▶ Theorem 3.1 (PURE preserves types). The translation function takes a well-typed term and produces a well-typed term, i.e., PURE: \forall t, tm Γ src t \rightarrow tm Γ tgt (\mathbb{M} t)

Proof. Using intrinsically-typed representation of terms, the well-typedness of the translated term is guaranteed by the fact that the definition of the translation function PURE is itself well-typed in Coq.

We now consider the preservation of semantics. First, we show that the semantics of the smart constructors is equal to that of the normal constructors, so that they merely represent optimizations of those.

- **Lemma 3.2** (AP respects semantics). \forall f e, eval tgt (AP f e) = eval tgt (Ap f e)
- ▶ Lemma 3.3 (JOIN respects semantics). ∀ f e, eval tgt (JOIN e) = eval tgt (Join e)

Proof. By case distinction on the term structure of the arguments, using the functor, monad and applicative laws.

Next, we see that embedding the pure com sublanguage in the target language preserves the semantics:

▶ Lemma 3.4 (relabel preserves semantics). ∀ e, eval tgt (relabel e) = eval com e

Proof. By induction on the structure of e.

From this, we can deduce that the PURE transformation preserves the semantics of the source program.

▶ **Theorem 3.5** (PURE preserves semantics). For all lawful monads M to be evaluated in, \forall e, eval tgt (PURE e) = eval src e

Proof. By induction on the structure of e, using Lemmas 3.2–3.4.

We now want to show that PURE preserves the work and span of the program. This is similar to semantics preservation, except that the functions we consider map to a monoid (the natural numbers with addition and maximum, respectively) rather than a monad.

We show that AP and JOIN do not increase the span and work of a term, compared to the normal constructors

▶ **Lemma 3.6** (AP respects span and work).

```
\forall f e, span tgt (AP f e) \leq span tgt (Ap f e) and work tgt (AP f e) \leq work tgt (Ap f e)
```

▶ Lemma 3.7 (JOIN respects span and work).

```
\forall e, span tgt (JOIN e) \leq span tgt (Join e) and work tgt (JOIN e) \leq work tgt (Join e)
```

Proof. By case distinction on the term structure of the arguments, using the monoid laws.

The pure terms in the com sublanguage are effect-free; therefore, their span and work is equal to 0.

▶ **Lemma 3.8** (com is effect-free). \forall e, span com e = 0 and work com e = 0

Proof. By induction on the term structure of e.

Embedding pure terms into the targe language produces a term that does not perform any effects, either.

```
▶ Lemma 3.9 (relabeled terms remain effect-free).
```

```
\forall e, span tgt (relabel e) = 0 and work tgt (relabel e) = 0
```

Proof. By induction on the term structure of e.

We can then show that the translation PURE does not increase the span or work of the source program, thereby demonstrating that it is parallelism-preserving.

```
▶ Theorem 3.10 (PURE preserves span and work). 
 \forall e, span tgt (PURE e) \leq span src e and work tgt (PURE e) \leq work src e
```

Proof. By induction on the term structure of e, using the monoid laws of addition and maximum as well as Lemmas 3.6–3.9.

4 Implementation

In this section, we describe the differences and similarities between the mechanisation in Coq and the implementation in Scala built on a macro-based AST transformation.

Structural Recursion. We keep our implementation in a general-purpose language as close to the formal model of our core calculus as possible. To this end, our implementation follows the formal translation as a structurally recursive function over the terms where possible. We use Scala macros to get access to code as AST data type, similar to the tm data type in the formalization.

Type-preserving Compilation. In Scala, we process the untyped AST for fine-grained detailed manipulations. Knowing that the translation is typability-preserving by our Coq proof, increases confidence in the implementation.

Exhaustiveness Checks. A difference between the Coq and the Scala implementation is that Bind, Ap and Pure are not syntax forms in Scala but represented by variable and function application in the embedding. Still, we can treat them as syntax forms to construct and destruct by defining custom patterns for pattern matching. Further, Scala macros do not define the Scala syntax as an algebraic data type (to hide compiler internals), and therefore do not offer exhaustiveness checks. Yet, by the fact that the Coq implementation is total, the Scala implementation can be expected to be as well.

Custom Effects. In the formalization, we have only a single effect, while, in the implementation, we allow every use of the notation to be instantiated with a different effect, based on the type of the expression. Our macro inspects the expression's type and, based on this type, picks the corresponding generated combinators bind/ap/pure of the respective effect.

Arity. In Scala, functions may take multiple arguments. Generally, we can model functions taking multiple arguments as functions taking a single argument of a tuple with multiple fields with appropriate currying and uncurrying. Functions with multiple arguments make the compiler no longer structurally recursive over terms because, besides terms, the compiler additionally needs to mutually recurse over the list of arguments, which would complicate the proof, but is necessary for our implementation.

5

Related work

Do-Notation. Do-notations have been popular for studying a variety of styles for writing effectful code: Wadler extends list-comprehension syntax [55] to monadic comprehensions, from which modern do-notation sprung, and McBride introduced applicatives and idiom brackets as a notation for applicatives [29]. To the best of our knowledge, the only support for mixed sequential and parallel programming was introduced as a Haskell extension [27, 28] to optimise do-notation into mixed monadic/applicative operations (ApplicativeDo). In contrast, our notation preserves the parallelism inherent in the structure of the program, thereby allowing sequentiality where necessary and giving parallelism where possible.

Implementations. Besides theory, implementations for effectful guest language notations are a popular endeavor, for example: In Scala, we can find projects to supports effectful programs through compiler plugins such as coroutines [47], Scala async [44], Monadless [7], Effectfull [10], Scala Workflow [49], Scala ContextWorkflow [22], Scala Computation Expressions [46], Dsl.scala [57], Dotty CPS [50]. In other languages we have: F# computation expressions [39], In particular proof-assistants and dependently typed languages have an interest for good support of notations for guest languages, which we can see in Idris' [6, 21] Lean's [52, 25], and Kind's [24] notation. None of them support parallelism.

Further, the following approaches are similar to ApplicativeDo: OCaml's monadic and applicative let [37], Scala avocADO [45], and Scala parallel-for [48]. But these do not support direct-style effect usage, and do not preserve parallelism.

CPS Translations. In general, effects are implemented by translating to other already known effects. In particular, all effects can be represented by the continuation effect [14], and thus, by translating to continuation passing style (CPS) [42, 15]. However, naive CPS translations introduce so called administrative redexes, e.g., expressions containing subexpressions which do not need to be evaluated at run-time, but can already be optimised by a partial evaluation pass at compile-time. Eventually, Danvy and Nielsen [12] optimised the CPS-translation into a first-order, one-pass, compositional translation.

Their trick for achieving an optimal result in one pass is to build optimisations into the definitions of their translation functions. We use a similar approach in our translation through the definition of smart constructors which simplify terms using monad and applicative laws when called.

Host supporting effects. Because effects can be implemented by translation to equally or more powerful effects, besides giving a denotational semantics modelling a compiler, there is another approach – that we did not follow – by forwarding effects to the host language as well. Then, compile-time translations like ours can be avoided and effects can be implemented in languages as a library, given the host languages has sufficient powerful effects. Filinski [14] studied the implementation of effects in languages with delimited continuations (e.g. shift and reset). In such an impure language it is possible to implement so called monadic reflection – a function taking an effectful function and returning a "pure" function. This is of course only possible by exploiting the impurity of the host language to implement the effect using delimited continuation. Later, Forster [16] studied the translations between monadic reflection, effect handlers and delimited control. The approach to extend the underlying virtual machine by support for delimited continuations, which are sufficiently efficient for

then implementing effects as normal libraries is followed by: the JVM proposal for delimited continuations [41], the Haskell proposal for continuation marks [18] and multicore-ocaml [35].

We are looking for a more general solution for compiling a language, that works independent of whether the runtime already supports delimited continuations or not.

Formalisation Techniques. To focus on the interesting parts of our formalisation, we used modern techniques to define features of the guest language in terms of features of the host language: In particular, we use parametric higher order abstract syntax (PHOAS) [40, 19, 8] to inherit binders and capture-avoiding substitution from the host language, and intrinsically-typed syntax [11, 3, 1, 2] to inherit type checking. The choice of PHOAS implies a limitation of our work, namely that we can formally only prove theorems about closed terms. Yet, this is a common restriction and lifting it is subject to future work.

6 Conclusion

Existing notations for composing effectful computations fall short on providing both sequential and parallel composition of effects at the same time. In this paper, we proposed a notation for mixed sequential/parallel code. Our notation allows direct-style effects, a feature that enables the sequentiality or parallelism of the effects to be determined by the structure of the code. We proved that our compilation preserves the parallelism of the source program and mechanized the proof in Coq.

An interesting next step for this line of research on direct-style notations for effects is to investigate how to cover more programming language features such as loops and branches, to integrate effects more seamlessly into the language. Besides monad and applicative functors, other effect functors, such as selectives [34, 56], comonads [38], and the theory behind effectful recursion [13] and generalizations such as arrows [20, 26] are promising possibilities.

- References

- 1 Thorsten Altenkirch, James Chapman, and Tarmo Uustalu. Relative monads formalised. Journal of Formalized Reasoning, 7(1):1–43, 2014. doi:10.6092/issn.1972-5787/4389.
- Thorsten Altenkirch, James Chapman, and Tarmo Uustalu. Monads need not be endofunctors. Logical Methods in Computer Science, 11(1), 2015. doi:10.2168/LMCS-11(1:3)2015.
- Nick Benton, Chung-Kil Hur, Andrew Kennedy, and Conor McBride. Strongly typed term representations in Coq. J. Autom. Reason., 49(2):141–159, 2012. doi:10.1007/s10817-011-9219-0.
- 4 Gavin M. Bierman, Erik Meijer, and Mads Torgersen. Lost in translation: formalizing proposed extensions to C#. In Richard P. Gabriel, David F. Bacon, Cristina Videira Lopes, and Guy L. Steele Jr., editors, Proceedings of the 22nd Annual ACM SIGPLAN Conference on Object-Oriented Programming, Systems, Languages, and Applications, OOPSLA 2007, October 21-25, 2007, Montreal, Quebec, Canada, pages 479-498. ACM, 2007. doi:10.1145/1297027.1297063.
- 5 Gavin M. Bierman, Claudio V. Russo, Geoffrey Mainland, Erik Meijer, and Mads Torgersen. Pause 'n' play: Formalizing asynchronous C#. In James Noble, editor, ECOOP 2012 Object-Oriented Programming 26th European Conference, Beijing, China, June 11-16, 2012. Proceedings, volume 7313 of Lecture Notes in Computer Science, pages 233–257. Springer, 2012. doi:10.1007/978-3-642-31057-7_12.
- 6 Edwin C. Brady. Resource-dependent algebraic effects. In Jurriaan Hage and Jay McCarthy, editors, Trends in Functional Programming 15th International Symposium, TFP 2014, Soesterberg, The Netherlands, May 26-28, 2014. Revised Selected Papers, volume 8843 of Lecture Notes in Computer Science, pages 18–33. Springer, 2014. doi:10.1007/978-3-319-14675-1\
 _2.

- Flavio W. Brasil and Sameer Brenn. Monadless syntactic sugar for monad composition in Scala. https://github.com/monadless/monadless.
- Adam Chlipala. Parametric higher-order abstract syntax for mechanized semantics. In James Hook and Peter Thiemann, editors, Proceeding of the 13th ACM SIGPLAN international conference on Functional programming, ICFP 2008, Victoria, BC, Canada, September 20-28, 2008, pages 143-156. ACM, 2008. doi:10.1145/1411204.1411226.
- Coq 8.16 reference manual. https://coq.github.io/doc/v8.16/refman/.
- 10 Tom Crockett. Effectful: A syntax for typeful effectful computations in Scala. https: //github.com/pelotom/effectful#effects-within-conditionals. Accessed 20-11-2020.
- 11 Nils Anders Danielsson. A formalisation of a dependently typed language as an inductiverecursive family. In Thorsten Altenkirch and Conor McBride, editors, Types for Proofs and Programs, International Workshop, TYPES 2006, Nottingham, UK, April 18-21, 2006, Revised Selected Papers, volume 4502 of Lecture Notes in Computer Science, pages 93–109. Springer, $2006. \ doi:10.1007/978-3-540-74464-1_7.$
- 12 Olivier Danvy and Lasse R. Nielsen. A first-order one-pass CPS transformation. Theor. Comput. Sci., 308(1-3):239-257, 2003. doi:10.1016/S0304-3975(02)00733-8.
- Levent Erkök and John Launchbury. A recursive do for Haskell. In Manuel M. T. Chakravarty, editor, Proceedings of the 2002 ACM SIGPLAN Workshop on Haskell, Haskell 2002, Pittsburgh, Pennsylvania, USA, October 3, 2002, pages 29-37. ACM, 2002. doi:10.1145/581690.581693.
- Andrzej Filinski. Representing monads. In Hans-Juergen Boehm, Bernard Lang, and Daniel M. Yellin, editors, Conference Record of POPL'94: 21st ACM SIGPLAN-SIGACT Symposium on Principles of Programming Languages, Portland, Oregon, USA, January 17-21, 1994, pages 446-457. ACM Press, 1994. doi:10.1145/174675.178047.
- Michael J. Fischer. Lambda calculus schemata. In Proceedings of ACM Conference on Proving 15 Assertions About Programs, Las Cruces, New Mexico, USA, January 6-7, 1972, pages 104-109. ACM, 1972. doi:10.1145/800235.807077.
- Yannick Forster, Ohad Kammar, Sam Lindley, and Matija Pretnar. On the expressive power of user-defined effects: Effect handlers, monadic reflection, delimited control. Journal of Functional Programming, 29:e15, 2019. doi:10.1017/S0956796819000121.
- Robert Harper and Christopher A. Stone. A type-theoretic interpretation of Standard ML. In Gordon D. Plotkin, Colin Stirling, and Mads Tofte, editors, Proof, Language, and Interaction, Essays in Honour of Robin Milner, pages 341–388. The MIT Press, 2000.
- 18 Haskell Proposals. Delimited continuation primops. https://github.com/ghc-proposals/ ghc-proposals/blob/master/proposals/0313-delimited-continuation-primops.rst.
- 19 Martin Hofmann. Semantical analysis of higher-order abstract syntax. In 14th Annual IEEE Symposium on Logic in Computer Science, Trento, Italy, July 2-5, 1999, pages 204-213. IEEE Computer Society, 1999. doi:10.1109/LICS.1999.782616.
- John Hughes. Generalising monads to arrows. Science of Computer Programming, 37(1-3):67-111, 2000. doi:10.1016/S0167-6423(99)00023-4.
- 21 The Idris Tutorial. Interfaces. Monads and do-notation. !-notation. http://docs.idris-lang. org/en/latest/tutorial/interfaces.html#notation. Accessed 14-11-2020.
- 22 Hiroaki Inoue, Tomoyuki Aotani, and Atsushi Igarashi. Contextworkflow: A monadic DSL for compensable and interruptible executions. In Todd D. Millstein, editor, 32nd European Conference on Object-Oriented Programming, ECOOP 2018, July 16-21, 2018, Amsterdam, The Netherlands, volume 109 of LIPIcs, pages 2:1-2:33. Schloss Dagstuhl - Leibniz-Zentrum für Informatik, 2018. doi:10.4230/LIPIcs.ECOOP.2018.2.
- Jerzy Karczmarczuk. Functional differentiation of computer programs. In Matthias Felleisen, Paul Hudak, and Christian Queinnec, editors, Proceedings of the third ACM SIGPLAN International Conference on Functional Programming (ICFP '98), Baltimore, Maryland, USA, September 27-29, 1998, pages 195-203. ACM, 1998. doi:10.1145/289423.289442.
- Github. Kind2. A next-gen functional language. https://github.com/Kindelia/Kind2. Accessed 29-11-2022.

- 25 Lean Manual. The do notation. Nested actions. https://leanprover.github.io/lean4/doc/do.html#nested-actions. Accessed 29-11-2022.
- Sam Lindley, Philip Wadler, and Jeremy Yallop. Idioms are oblivious, arrows are meticulous, monads are promiscuous. Electronic Notes in Theoretical Computer Science, 229(5):97–117, 2011. doi:10.1016/j.entcs.2011.02.018.
- 27 Simon Marlow, Louis Brandy, Jonathan Coens, and Jon Purdy. There is no fork: an abstraction for efficient, concurrent, and concise data access. In Johan Jeuring and Manuel M. T. Chakravarty, editors, Proceedings of the 19th ACM SIGPLAN international conference on Functional programming, Gothenburg, Sweden, September 1-3, 2014, pages 325–337. ACM, 2014. doi:10.1145/2628136.2628144.
- 28 Simon Marlow, Simon Peyton Jones, Edward Kmett, and Andrey Mokhov. Desugaring Haskell's do-notation into applicative operations. In Geoffrey Mainland, editor, *Proceedings of the 9th International Symposium on Haskell, Haskell 2016, Nara, Japan, September 22-23, 2016*, pages 92–104. ACM, 2016. doi:10.1145/2976002.2976007.
- 29 Conor McBride and Ross Paterson. Applicative programming with effects. *Journal of Functional Programming*, 18(1):1–13, 2008. doi:10.1017/S0956796807006326.
- 30 Erik Meijer. Confessions of a used programming language salesman. In Richard P. Gabriel, David F. Bacon, Cristina Videira Lopes, and Guy L. Steele Jr., editors, Proceedings of the 22nd Annual ACM SIGPLAN Conference on Object-Oriented Programming, Systems, Languages, and Applications, OOPSLA 2007, October 21-25, 2007, Montreal, Quebec, Canada, pages 677-694. ACM, 2007. doi:10.1145/1297027.1297078.
- 31 Erik Meijer. Your mouse is a database. Communications of the ACM, 55(5):66–73, 2012. doi:10.1145/2160718.2160735.
- 32 Erik Meijer, Brian Beckman, and Gavin M. Bierman. LINQ: reconciling object, relations and XML in the .NET framework. In Surajit Chaudhuri, Vagelis Hristidis, and Neoklis Polyzotis, editors, *Proceedings of the ACM SIGMOD International Conference on Management of Data, Chicago, Illinois, USA, June 27-29, 2006*, page 706. ACM, 2006. doi:10.1145/1142473.1142552.
- Robin Milner. A theory of type polymorphism in programming. *Journal of Computer and System Sciences*, 17(3):348–375, 1978. doi:10.1016/0022-0000(78)90014-4.
- Andrey Mokhov, Georgy Lukyanov, Simon Marlow, and Jerémie Dimino. Selective applicative functors. *Proceedings of the ACM on Programming Languages*, 3(ICFP):90:1–90:29, 2019. doi:10.1145/3341694.
- 35 Multicore OCaml. https://github.com/ocaml-multicore/ocaml-multicore.
- 36 Matthias Neubauer and Peter Thiemann. From sequential programs to multi-tier applications by program transformation. In Jens Palsberg and Martín Abadi, editors, *Proceedings of the 32nd ACM SIGPLAN-SIGACT Symposium on Principles of Programming Languages*, *POPL 2005*, *Long Beach*, *California*, *USA*, *January 12-14*, 2005, pages 221–232. ACM, 2005. doi:10.1145/1040305.1040324.
- OCaml: Add "monadic" let operators. https://github.com/ocaml/ocaml/pull/1947, 2018.
- 38 Dominic A. Orchard and Alan Mycroft. A notation for comonads. In Ralf Hinze, editor, Implementation and Application of Functional Languages 24th International Symposium, IFL 2012, Oxford, UK, August 30 September 1, 2012, Revised Selected Papers, volume 8241 of Lecture Notes in Computer Science, pages 1-17. Springer, 2012. doi:10.1007/978-3-642-41582-1_1.
- 39 Tomas Petricek and Don Syme. The F# computation expression zoo. In PADL, volume 8324 of Lecture Notes in Computer Science, pages 33–48. Springer, 2014.
- 40 Frank Pfenning and Conal Elliott. Higher-order abstract syntax. In Richard L. Wexelblat, editor, Proceedings of the ACM SIGPLAN'88 Conference on Programming Language Design and Implementation (PLDI), Atlanta, Georgia, USA, June 22-24, 1988, pages 199–208. ACM, 1988. doi:10.1145/53990.54010.

- 41 Project Loom: Fibers and Continuations for the Java Virtual Machine. https://cr.openjdk.java.net/~rpressler/loom/Loom-Proposal.html.
- John C. Reynolds. Definitional interpreters for higher-order programming languages. In John J. Donovan and Rosemary Shields, editors, *Proceedings of the ACM annual conference, ACM 1972, 1972, Volume 2*, pages 717–740. ACM, 1972. doi:10.1145/800194.805852.
- David Richter, David Kretzler, Pascal Weisenburger, Guido Salvaneschi, Sebastian Faust, and Mira Mezini. Prisma: A tierless language for enforcing contract-client protocols in decentralized applications (extended version). CoRR, abs/2205.07780, 2022. arXiv:2205.07780, doi: 10.48550/arXiv.2205.07780.
- 44 Scala async rfc. http://docs.scala-lang.org/sips/pending/async.html.
- 45 avocADO. Safe compile-time parallelization of for-comprehensions for Scala 3 . https://github.com/kitlangton/parallel-for.
- 46 Scala Computation Expressions. An implementation of Computation Expressions in Scala. https://github.com/jedesah/computation-expressions.
- 47 Coroutines is a library-level extension for the Scala programming language that introduces first-class coroutines. https://github.com/storm-enroute/coroutines, 2015.
- parallel-for. Automatically parallelize your for-comprehensions at compile time. https://github.com/kitlangton/parallel-for.
- 49 Scala workflow. Boilerplate-free syntax for computations with effects. https://github.com/aztek/scala-workflow.
- Ruslan Shevchenko. dotty-cps-async experimental CPS transformer for dotty. https://github.com/rssh/dotty-cps-async.
- 51 Don Syme, Tomas Petricek, and Dmitry Lomov. The F# asynchronous programming model. In Ricardo Rocha and John Launchbury, editors, Practical Aspects of Declarative Languages 13th International Symposium, PADL 2011, Austin, TX, USA, January 24-25, 2011. Proceedings, volume 6539 of Lecture Notes in Computer Science, pages 175–189. Springer, 2011. doi: 10.1007/978-3-642-18378-2_15.
- 52 Sebastian Ullrich and Leonardo de Moura. 'do' unchained: embracing local imperativity in a purely functional language (functional pearl). *Proceedings of the ACM on Programming Languages*, 6(ICFP):512–539, 2022. doi:10.1145/3547640.
- Janis Voigtländer. Free theorems simply, via dinaturality. In Petra Hofstedt, Salvador Abreu, Ulrich John, Herbert Kuchen, and Dietmar Seipel, editors, Declarative Programming and Knowledge Management Conference on Declarative Programming, DECLARE 2019, Unifying INAP, WLP, and WFLP, Cottbus, Germany, September 9-12, 2019, Revised Selected Papers, volume 12057 of Lecture Notes in Computer Science, pages 247–267. Springer, 2019. doi:10.1007/978-3-030-46714-2\16.
- Philip Wadler. Theorems for free! In Joseph E. Stoy, editor, Proceedings of the fourth international conference on Functional programming languages and computer architecture, FPCA 1989, London, UK, September 11-13, 1989, pages 347-359. ACM, 1989. doi:10.1145/ 99370.99404.
- Philip Wadler. Comprehending monads. *Mathematical Structures in Computer Science*, 2(4):461–493, 1992. doi:10.1017/S0960129500001560.
- Jamie Willis, Nicolas Wu, and Matthew Pickering. Staged selective parser combinators. Proceedings of the ACM on Programming Languages, 4(ICFP):120:1–120:30, 2020. doi: 10.1145/3409002.
- 57 Bo Yang. Dsl.scala a framework to create embedded domain-specific languages in Scala. https://github.com/ThoughtWorksInc/Dsl.scala.