Implementation of static and dynamic semantics for a calculus with algebraic effects and handlers using PLT Redex

(Implementacja statycznej i dynamicznej semantyki rachunku z efektami algebraicznymi i ich obsługą z pomocą biblioteki PLT Redex)

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 ${\bf English~abstract}$

Abstrakt w języku polskim

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Chapter 1

Introduction

Algebraic effects [11] are an increasingly popular technique of structuring computational effects. They allow for seamless composition of multiple effects, while retaining (unlike monads) applicative style of programs. Coupled with handlers [12] which give programmers ability to interpret effects, they provide a disciplined and flexible tool for abstracting over a set of operations which a program may perform and for separating this interface from the semantics of those operations, defined as effect handlers.

As composability and separation of concerns are often sought after, many calculi and languages have been developed in order to get algebraic effects just right; most notable of them being: Koka [8] (featuring type inference, effect polymorphism with row-types and JavaScript-like syntax), Links [5] (featuring ML-like syntax, row-typed effect polymorphism and ad-hoc effects), Helium [2] (with abstract and local effects, ML-style module system and principled approach to effect polymorphism), Eff [1] (with implicit effect checking and recent work on direct compilation to OCaml [6]) and Frank [9] (with bidirectional type and effect system requiring minimal amount of effect variables, and shallow effect handlers).

On a more theoretical side, various approaches to semantics of algebraic effects can be spotted in the literature, both with respect to type systems and run-time semantics. Although most calculi use some form of row-types (with notable exception of Frank [9]) to track effects, there are differences in permitted shapes (at most one effect [5] of given type or many effects [3, 8], whether effects must be defined before use [3, 9, 8, 1] or not [5]) and how effects interact with polymorphism and abstraction. At run-time handlers can wrap the captured continuation (giving so-called deep handlers [3, 5, 8, 1]) or not (shallow handlers [9]) and the very act of finding the right handler can be implemented in various ways, mainly depending on some constructs which skip handlers [3].

All this variety naturally invites us to experiment with different features and components of a calculus. An executable model would be excellent for everyone interested in understanding inner workings of algebraic effects. In particular, the ability to perform and visualize reductions would be very helpful for understanding of the dynamic semantics of operations and handlers. Such model should also contain a type system complementing the dynamic semantics and guiding the programmer with usage of effects. In this thesis I will build such a calculus, describing my choices and discussing the trade-offs I faced.

The first goal of this thesis is the design of the calculus with effects and handlers, and its dynamic semantics. Its implementation should be executable and allow for step-by-step reduction of calculus terms by a computer program.

The second goal is the design and implementation of a sound type system for the calculus, preferably with type inference. The implementation should be able to type-check examples with minimal additional context and boilerplate.

The third goal is the design and implementation of abstract machine, which preserves the dynamic semantics of the calculus, yet is easier to translate into low-level virtual machine. It could also be used as a basis for compilation to native code.

In order to rapidly iterate on the design and test the calculus, I decided to use the PLT Redex library which allows for building language model with executable type system judgments and reduction relation. It also provides facilities for visualizing rewriting of terms and typesetting all components of the development.

The calculus is designed to be small enough to be easily understood, yet have general language features to allow experimentation with reasonably complex programs. The programmer can use λ -abstractions and recursive functions, numbers with addition, subtraction, multiplication and comparisons, booleans with conditional expressions and lists. The algebraic effects are implemented with ad-hoc operations which take one parameter and return a value, handlers which can handle multiple (different) operations at once and lifts which allow operations to skip handlers. The type system for calculus is presented in Curry style, with the implementation inferring simple types for unannotated terms using unification algorithm. Although there is no way to create and bind polymorphic values, the system infers most general (simple) type for an expression which may contain unsolved variables. The abstract machine is implemented with explicit stack of continuations and value environment. It is given deterministic transition system using PLT Redex's reduction relation and meta-function transforming a calculus expression into initial configuration. Additionally to ease experimentation I implemented a language front-end which translates human-friendly programs to calculus terms, integrated with Racket environment.

In brief summary, the development consists of:

• Executable reduction semantics most similar to the system of [3].

- Curry style type system with ad-hoc effects in the style of *Links*, effect rows based on *Koka* and *lift* construct of [3], implemented as a unification-based type inference algorithm.
- CEK style abstract machine with stack and *meta*-stack of handlers, based on [5]

The rest of this thesis is structured as follows: in the remainder of this chapter I introduce the main topics of this thesis, in chapter 2 I describe the calculus in greater detail, in chapter 3 I discuss technicalities of implementation and integration with the Racket environment and chapter 4 is user's manual.

1.1 Algebraic effects and handlers

Algebraic effects and handlers are a language level framework which allow for coherent presentation, abstraction, composition and reasoning about computational effects. The key idea is to separate invocation of an effectful operation in an expression from the meaning of such an operation. When one invokes an operation, current continuation (up to the nearest handler) is captured and passed along with the operation's argument to the nearest handler. The handler in turn may execute arbitrary expression, using the continuation once, twice, returning a function which calls the continuation or simply ignoring it. This way many control structures can be modeled and generalized by algebraic effects and appropriate handlers. For example, in the following listing, function exists returns true when the list contains an element that satisfies predicate p.

```
let exists = \lambda p \lambda xs
let f = \lambda x if p x then Break true else x end in handle map f xs with
| Break x r -> true
| return x -> false
end in
exists (\lambda x ==(x, 3)) (fromTo 0 10)
```

Listing 1: Exception-like usage of algebraic effects

It is implemented in terms of map and a helper function f which Breaks normal control flow when the predicate returns true. This map is then invoked inside the handler that returns true on Break and false otherwise. This usage of operation and its handler is similar to exceptions, as the resumption is discarded. Another example, with a handler for the state-like operations is presented in Listing 2 in the next section.

From the language design standpoint algebraic effects provide single implementation of various phenomena which may happen during execution of a program, for example mutable state, I/O, environment lookup, exceptions, etc., in a sense that every effect is treated the same, the typing rules are defined for invocation of any operation, and handling of any operation. Similarly the operational semantics is also quite simple and succinct thanks to uniform treatment of various effects. This framework is also extendable. With small extension it can handle built-in effects in addition to user-defined ones.

From the language user perspective algebraic effects provide means of abstraction over effects used in a program. Thanks to easy creation of new effects, one can define special purpose operations and their handlers to better represent domain specific problems while simultaneously using well known effects, defined in the standard library. With effects being tracked by the type system, programmers can enforce purity or specific set of used effects at compile-time, or using effect polymorphism they can write reusable functions that abstract over effects which may happen. The separation of definition and implementation of effects allows for various interpretations of operations, for example simulating a database connection or file-system during testing.

1.2 Types and type inference

The most common approach to giving an effectful computation a type uses a type-level data-structure known as a row. Initially developed in order to structurally type records, rows come in two flavors: Remy-style[13] where they are treated as (finite) sets of label-type pairs, and Leijen-style[7] where rows are treated as (finite) lists of label-type pairs that are equivalent up to permutation of different labels. When polymorphism is present a row may have concrete prefix (possibly empty) and polymorphic tail denoted by a type variable. In effectful setting, the type system usually keeps a row of effects which an expression may perform, and suspended computations e.g. functions must have types decorated with a row of operations that may be invoked when their body is evaluated. In the following listing, the function add loads a number, sums it with the argument x and sets this sum, returning unit value.

```
let add = λ x Set +(Get (), x) in
let comp =
  handle add 5 with
  | Set x r -> λ _ r () x
  | Get _ r -> λ s r s s
  | return _ -> λ s s
  end in
comp 37
```

Listing 2: Stateful computation

It contains two effectful sub-expressions: $Get: Unit \Rightarrow Num$ and $Set Num \Rightarrow Unit$. As this function uses both operations, their effects must be combined, giving add following type: $Num \to (Get: Unit \Rightarrow Num, Set: Num \Rightarrow Unit)$ Unit where Num is the type of input, Unit is the type of output and (Get...) is the effect row. The handler which interprets the operations is implemented to return a state transforming function. When the Set operation is invoked, the handler returns a function which will ignore its argument and first resume the computation with unit value, that will return a state transformation and then pass it the new state x. The Get operation handler returns a function which awaits for a state s with which it resumes the continuation and then applies returned function to s. The return clause returns identity state transformation. The type system requires all handler bodies to be of the same type: $Num \to ()Num$ which guides implementation and ensures that operations do not escape the handler.

Type inference is a technique of algorithmic reconstruction of types for various constructions used in a language. It allows programmers to write programs with no type annotations, that often feel redundant and obfuscate the meaning of a program. The most well known type system with inference is a system for ML family of languages[10] – Haskell, OCaml, SML which infers the types with no annotations whatsoever. A formal type system defines grammar of types consisting of base types (int, bool etc.), type constructors (arrows, algebraic data types) and type variables. The typing rules require types which should be compatible (e.g. formal parameter and argument types) to unify. The key feature of this system is the so-called let-polymorphism – generalization of types of let-bound variables. This way code reuse can be accomplished without complicating the type system and compromising type safety. The basis of implementation of this system is first order unification algorithm[10], which syntactically decomposes types and builds a substitution from type variables to types.

```
x ::= variable-not-otherwise-mentioned
n ::= number
v ::= (\lambda x e) | n
e ::= v | (e e) | x
K ::= [] | (K e) | (v K)
```

Figure 1.1: λ -calculus abstract syntax

```
K[((\lambda x e) v)] \longrightarrow K[\text{substitute}[e, x, v]] [\beta]
```

Figure 1.2: λ -calculus reduction relation

1.3 Reduction semantics and abstract machines

Reduction semantics[4] is a format for specifying dynamic semantics of a calculus in an operational style. The basic idea is to first define redexes – expressions which can be reduced, and contexts in which the reduction can happen. Taking λ -calculus extended with numbers (Figure 1.1) and with call-by-value reduction order as an example, the only redex is application of a function to value $(\lambda x.e)v$ as shown in Figure 1.2. The possible contexts are: empty context \square or evaluation of operator part of application Ke or evaluation of operand vK when left part has already been evaluated to a value. With these possibilities in mind, we will define binary relation \longrightarrow which describes single step of reduction. Such relation can be thought of as a transition system, rewriting terms into 'simpler' ones step by step. There usually are two approaches to definition of such relation:

• Definition of primitive reduction $(\lambda x.e)v \longrightarrow_p e\{v/x\}$ which operates only on redexes and giving it a closure with the following inference rule:

$$\frac{e \longrightarrow_p e'}{K[e] \longrightarrow K[e']}$$

which says that if we can primitively reduce some expression, then we can do it in any context.

• Or definition of \longrightarrow directly, with decomposition of terms on both sides: $K[(\lambda x.e)v] \longrightarrow K[e\{v/x\}]$

where the syntax $e\{v/x\}$ means term e with value v substituted for variable x, and K[e] means some context K with expression e inserted into the hole. For both approaches it is important, that any term can be uniquely decomposed into redex and context, because when it is the case, then the relation is deterministic and gives good basis for formulation of abstract machines, interpreters or transformations to some other intermediate representations.

Abstract machine is a mathematical construction, usually defined as a set of

```
\lambda-calculus reduction example
```

Figure 1.3: λ -calculus example reduction sequence

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CEK-machine for λ -calculus

Figure 1.4: λ -calculus abstract machine

configurations with deterministic transformations, which are computationally simple. The goal for formulation of an abstract machine is to mechanize evaluation of terms while retaining semantics given in a more abstract format, e.g. reduction semantics, with the correspondence being provable[4]. As an example, Figure 1.4 shows a CEK-machine for the λ -calculus defined earlier. The name CEK comes from C ommand, E nvironment and E on the machine configuration is a triple (e, ρ, κ) where E is an expression which is decomposed or reduced, E is an environment mapping variables to values, and the last component E is a continuation stack, which determines what will happen with value, to which first component eventually reduces. Thanks to the environment we no longer have to explicitly perform substitution, leading to more machine friendly and efficient implementation. Given an initial state, the machine can then repeatedly apply transformation relation, either looping, arriving at a final value, or getting stuck.

1.4 PLT Redex

The PLT Redex[4] library provides a comprehensive set of tools for the development of various calculi and language-like artifacts. The work begins with the definition of a language using a familiar BNF-like syntax. The library provides many options for defining patterns which describe the abstract syntax of the language, among them: meta-variables, symbols – playing the role of markers, numbers, object language variables, repetitions of patterns using ellipsis and nonlinear patterns which can for example enforce that all variables in a binding are different. Besides the syntax, the language definition allows for specifying the variable binding structure of the object language, which will be used by built-in meta-functions for substitution. The following Listing 3 shows code extending λ -calculus defined earlier in Figure 1.1 with typed terms E, along with types t and typing contexts Γ .

```
(define-extended-language LC-typed LC (E ::= (\lambda [x t] E) n (E E) x) (t ::= num (t \rightarrow t)) (\Gamma ::= \cdot (x t \Gamma)) #:binding-forms (\lambda [x t] E \#:refers-to x))
```

Listing 3: Typed λ -calculus with numbers in PLT Redex

Second feature of the PLT Redex library are meta-functions which can pattern

match on terms and return other terms. They may use full power of complex and non-linear patterns which the library exposes, additional side conditions and even escape to Racket – host language in which the PLT Redex is defined.

Listing 4: Type system for λ -calculus in PLT Redex

The third aspect of this library are judgment forms which encode inductively defined judgments (e.g. type systems) with a syntax similar to pen-and-paper rules. Listing 4 shows example code, defining a simple type system for annotated λ -calculus with numbers. These rules can use patterns, meta-functions, other judgments and also escape to Racket. When defining a judgment, the programmer must specify which parameters are to be treated as inputs and which as outputs using #:mode keyword. The library enforces an invariant that inputs I of a judgment form must be concrete terms and outputs 0 may be variables. Under the hood the PLT Redex library will resolve the rules in depth-first order backtracking on failures and multiple pattern matches.

The last component of language modeled using PLT Redex are reduction relations, usually used for specifying semantics. They are defined as a set of clauses, which should rewrite an input term into other term of same syntactic category. In order to find redex, the programmer can define evaluation contexts, and then the library will decompose the terms using (in-hole K e) pattern, as in Listing 5.

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Listing 5: Reduction relation for λ -calculus in PLT Redex

Finally PLT Redex provides features for automatic testing via term generation facilities and has ability to typeset every component of calculus development. Every figure in this thesis, which shows language grammar, reduction relation, metafunction or judgment has been generated using PLT Redex.

Chapter 2

The calculus

The calculus implemented in this thesis is based on λ -calculus with call-by-value semantics. It's abstract syntax is presented in Figure 2.1. Meta-variable x ranges over variables used in value binders and their references, while op ranges over operation names, which are distinct from normal variables. Meta-variable v ranges over values, which are one of: boolean b, number m, λ -abstraction ($\lambda x e$) or recursive function (rec x x e). Meta-variable e ranges over expressions, which include values v, forms standard to λ -calculus – variables x, function applications (ee), conditionals (if ee e) and primitive operations ($prim e \dots$); expressions also include three constructs specific to effects – operation invocations (op e), lifts (lift op e) and handlers (handle e hs ret) where ret is return expression (return x e) and hs is a list of handler clauses.

To achieve call-by-value, left-to-right reduction order I use evaluation contexts E; this choice follows other calculi which allow for computational effects [3, 8, 5]. One interesting aspect of these contexts is notion of freeness [3], defined in Figure 2.2. The judgment free[op, E, n] asserts that operation op is n-free in evaluation context E, meaning that it will be handled by (n + 1)st handler for op outside the context E.

The syntax of types, ranged over by meta-variable t, comprises of base types (Int, Bool), arrow types $(t \to row t)$, operation types $(t \Rightarrow t)$, rows and type variables a. Rows are defined inductively as either empty row \cdot , variable a or extension $(op\ t\ row)$ of a row row with type t assigned to operation label op, and are ranged over by meta-variable row. Finally, meta-variable Γ ranges over typing contexts, S over type substitutions and SN denotes pair of substitution and name supply.

2.1 Dynamic semantics

The dynamic semantics for a calculus with algebraic effects defines, besides the standard reductions known from λ -calculus, the control structure of operations and handlers. Intuitively, when an operation op is invoked, it will be handled by dynam-

```
b ::= true \mid false
     m ::= number
     v := m | b | (\lambda x e) | (rec x x e) | (v ...)
 prim ::= + | - | * | == | <= | >= | cons | nil | cons? | nil? | hd | tl
     e ::= v | x | (app e e) | (if e e e) | (prim e ...)
           |(op e)| (handle e hs ret) |(lift op e)|
    hs ::= ((op_{!1} hexpr) ...)
hexpr ::= (x_{!\_1} \ x_{!\_1} \ e)
   ret ::= (return x e)
     h := (op \ hexpr)
      t ::= Int | Bool | (t \rightarrow row \ t) \ | \ (List \ t) \ | \ (t \Rightarrow t) \ | \ row \ | \ a
  row ::= (op \ t \ row) \mid a \mid \cdot
      x ::= (variable-prefix v:)
     a ::= (variable-prefix t:)
    op ::= (variable-prefix op:)
     \Gamma ::= (x t \Gamma) \mid \cdot
     E ::= [] | (app E e) | (app v E) | (prim v ... E e ...) | (if E e e)
           |(op E)| (handle E hs ret) | (lift op E)
     S ::= (a t S) | \cdot
 N, n ::= natural
   SN ::= (S N)
```

Figure 2.1: Abstract syntax

ically closest handler, with a caveat that for each lift passed in search of handler, it must skip one handler. Formally, when an operation op is invoked, it will be handled by lexically enclosing handler $(handle\ E[op\ e]\ hs\ ret)$ if and only if the intermediate context E is 0-free[3].

The dynamic semantics is defined in the format of contextual reduction semantics in Figure 2.3. All rules perform reduction in a context E leaving it unchanged. First rule describes standard β -reduction via substitution of argument value for variable in function body, while the second is the β -reduction of recursive function, where first we substitute the function for function variable and then substitute the argument. Next rule deals with built-in primitive operations, delegating to auxiliary function prim-apply which pattern matches on prim and performs appropriate operation. Next two rules perform choice of correct branch in conditional expression depending on value of condition. The rule lift-compat returns value from lift expression, leaving it unchanged. The rule handle-return handles the case when inner expression of handle expression evaluates to a value, which means we have to evaluate return clause by substituting the result value for x, and plugging this expression into evaluation context E. The last rule handle-op describes the behavior when an expression calls some operation. To handle an operation we must find 0-free inner context E_2 which is directly surrounded by handle expression which has a case for op. Then we substitute value v for first variable of operation handler and the inner context E_2 surrounded with the very same handler (the continuation delimited by the handler) closed in a lambda for the second argument. This way the operation handler can resume the evaluation of expression which invoked the handled operation.

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```
free[op, [], 0]
             free[op, E, n]
    free[op, (lift op E), (+ n 1)]
               op = op_{!_{-1}}
             free[op, E, n]
        free\llbracket op, (lift op_{!\_1} E), n \rrbracket
             in[op, ops[hs]]
             free[op, E, n]
free[op, (handle E hs ret), (-n 1)]
           not-in[op, ops[hs]]
              free[op, E, n]
     free[op, (handle E hs ret), n]
             free[op, E, n]
         free[op, (app E e), n]
             free[op, E, n]
         free[op, (app v E), n]
              free[op, E, n]
    free[op, (prim v ... E e ...), n]
             free[op_1, E, n]
          free[op_1, (op_2 E), n]
              free[op, E, n]
         free[op, (if E e_1 e_2), n]
```

Figure 2.2: Context freeness

```
E[(app (\lambda x e) v)] \longrightarrow E[substitute[e, x, v]]
                                                                                                                                         [β-λ]
           E[(\text{app (rec } x_f x_a e) v)] \longrightarrow E[\text{substitute}[\text{substitute}[e, x_f, (\text{rec } x_f x_a e)]], x_a, v]] [\beta-\text{rec}]
                        E[(prim \ v \ ...)] \longrightarrow E[prim-apply[prim, v, ...]]
                                                                                                                                         [prim-op]
                      E[(\text{if true } e_1 \ e_2)] \longrightarrow E[e_1]
                                                                                                                                         [if-true]
                     E[(\text{if false } e_1 \ e_2)] \longrightarrow E[e_2]
                                                                                                                                         [if-false]
                            E[(\text{lift } op \ v)] \longrightarrow E[v]
                                                                                                                                         [lift-compat]
  E[(\text{handle } v \text{ } hs \text{ } (\text{return } x \text{ } e))] \longrightarrow E[\text{substitute}[e, x, v]]
                                                                                                                                         [handle-return]
E_1[(\text{handle } E_2[(op \ v)] \ hs \ ret)] \longrightarrow E_1[\text{substitute}[\text{substitute}[e, x_1, v]],
                                                                                                                                         [handle-op]
                                                                                x_2, (\lambda v:z (handle E_2[v:z] hs ret))
                                   where free [op, E_2, 0], get-handler [op, hs, (x_1 x_2 e)], v:z fresh
```

Figure 2.3: Reduction relation

2.2 Static semantics

The type system is based on Koka[8] (Leijen's style of row types[7]), Links[5] (ad-hoc operations) and Biernacki et al. [3] (lift construct) systems. Initially I implemented a variant of System-F extended with row-types but it proved to be a bit of a mouthful to write even simplest programs. Additionally the Redex's facilities for automatic testing were not able to generate sufficiently many well typed terms, so some type inference was inevitable. To limit the amount of work I decided to present the calculus in Curry style, with typing relation inferring the type for unannotated terms.

Building on well known foundations[10], types are inferred via first order unification. While exact algorithm is presented in section 3.1, the notion of unification is used extensively in the remainder of this chapter and as such I will present intuitive definition here. Two types t_1 and t_2 unify (written $t_1 \sim t_2$) if they are structurally the same, where variables can be substituted with any type. Two rows unify, if they are the same list of operation-type pairs, up to permutation of different operations.

The system does not feature polymorphism in first class fashion, as there is no rule where types are generalized, but I believe it to be a straightforward addition, following the Koka[8] calculus. Still, after inferring type of an expression, we can see which unification variables are left abstract and could be generalized. There are two main features differentiating this system from Koka's; firstly effects need not be defined before use, their signature is inferred the same way as any other construction; secondly the system is algorithmic, with rules explicitly encoding a recursive function which can infer the type of an expression.

2.2.1 Type inference

The judgment $\Gamma \mid [S_1 \ N_1] \vdash e : t! row \mid [S_2 \ N_2]$ asserts that in typing context Γ under type substitution S_1 , with name supply state N_1 expression e has type t with effects row under type substitution S_2 and with name supply state N_2 . Algorithmically this judgment infers a type and an effect row, and calculates new substitution, given typing environment, current substitution and an expression. As in ML languages only simple types can be inferred, along with effect rows.

Base rules for constants and variable lookup are straightforward, each introducing fresh effect row variable. To check λ expression, we first introduce fresh type variable, and then check the body in extended environment. The arrow gets annotated with effects which may occur during evaluation of the body and the λ abstraction itself is returned with fresh effect row. The recursive function checking is similar to normal functions. First variable denotes function itself, while second its argument. Accordingly, the environment gets extended with functional type $t_1 \to row_1 t_2$ and argument type t_1 , to check the body of the function, and afterwards the result type of body t gets unified with the result type of function t_2 , same with effect row. Whole function, as it is a value, is returned with fresh effect row. The application requires expression at function position to be of functional type and parameter type to unify with argument type. All effect rows (from evaluation of function value, argument value and function body) must unify as well. Inference for primitive operation call is deferred to auxiliary judgment, which checks arity and argument types, returning result type and usually fresh effect row. Conditional expression requires the condition to be of type Bool and types of two branches to unify. As usual all effect rows must also unify. Operation invocation requires the effect row to contain operation op with type $(t_1 \Rightarrow t_2)$ where input type t_1 is the inferred type for e and output type t_2 is fresh. Operation lifting prepends fresh op to the effect row of e. Finally, to check handle expression we first infer the type of enclosed expression e, then in environment extended with e's type t_1 we infer return expression's type t_{ret} . Helper judgment infer-handlers returns the result effect row of handlers row_{out} and row marking handled effects $row_{handled}$ whose tail is the same as result's. By unifying result row with return row and handled row with row_1 we ensure that effects which may occur during handling of operations, evaluation of return clause and leftovers from the inner expression are all accounted for.

2.2.2 Inference for effect handlers

List of effect handlers hs is processed right-to-left by judgment

$$infer-handlers[\Gamma, SN_{in}, t_{ret}, hs, row_{out}, row_{handled}, SN_{out}]$$

The t_{ret} is the type of return clause, row_{out} is the combined row of effects which may occur in any handler and $row_{handled}$ is the row of handled operations, with

```
fresh-row[N_1, row, N_2]
                                                                              \Gamma \mid [S N_1] \vdash b : \mathsf{Bool} ! row \mid [S N_2]
                                                                                                    fresh-row[N_1, row, N_2]
                                                                                \Gamma \mid [S N_1] \vdash m : Int ! row \mid [S N_2]
                                                                       lookup[\Gamma, x, t] fresh-row[N_1, row, N_2]
                                                                                    \Gamma \mid [S N_1] \vdash x : t ! row \mid [S N_2]
                                                            fresh-var[N_1, t_1, N_2] fresh-row[N_2, row_2, N_3]
                                                                            (x t_1 \Gamma) | [S_1 N_3] \vdash e : t_2 ! row_1 | SN
                                                        \Gamma \mid [S_1 N_1] \vdash (\lambda \times e) : (t_1 \rightarrow row_1 t_2) ! row_2 \mid SN
                                        fresh-arr[N_1, t_1, ->, row_1, t_2, N_2]
                                                                                                                                                          fresh-row\llbracket N_2, row_2, N_3 
rbracket
                                             (x_f(t_1 \to row_1 t_2) (x_a t_1 \Gamma)) | [S_1 N_3] \vdash e : t ! row | SN_1
                                                                      SN_1 row_1 \sim row SN_2
                                                                                                                                                          SN_2 t_2 \sim t SN_3
                                               \Gamma \mid [S_1 N_1] \vdash (\operatorname{rec} x_f x_a e) : (t_1 \rightarrow row_1 t_2) ! row_2 \mid SN_3
                   \Gamma \mid SN_1 \vdash e_1 : t_a ! row_a \mid SN_2
                                                                                                                             unify-arr[SN_2, t_a, t_1, -\rangle, row_1, t_2, SN_3]
                                                                                         \Gamma \mid SN_3 \vdash e_2 : t_3 ! row_2 \mid SN_4
                      SN_4 t_1 \sim t_3 SN_5
                                                                                    SN_5 row_1 \sim row_2 SN_6 \qquad SN_6 row_1 \sim row_a SN_7
                                                                          \Gamma \mid SN_1 \vdash (app \ e_1 \ e_2) : t_2 ! \ row_2 \mid SN_7
                                                              check-prim[\Gamma, SN_1, prim, (e...), t, row, SN_2]
                                                                          \Gamma \mid SN_1 \vdash (prim \ e \ ...) : t ! row \mid SN_2
                                     \Gamma \mid SN_1 \vdash e_{\textit{cond}} : t_{\textit{cond}} ! row_{\textit{cond}} \mid SN_2 \quad SN_2 t_{\textit{cond}} \sim \mathsf{Bool} \ SN_3
             \Gamma \mid SN_3 \vdash e_{\textit{then}} : t_{\textit{then}} ! \; row_{\textit{then}} \mid SN_4 \qquad \Gamma \mid SN_4 \vdash e_{\textit{else}} : t_{\textit{else}} ! \; row_{\textit{else}} \mid SN_5 
     SN_5 t_{then} \sim t_{else} SN_6 \quad SN_6 row_{cond} \sim row_{then} SN_7 \quad SN_7 row_{then} \sim row_{else} SN_8
                                                         \Gamma \mid SN_1 \vdash (\text{if } e_{cond} \ e_{then} \ e_{else}) : t_{then} \ ! \ row_{then} \mid SN_8
\Gamma \mid SN_1 \vdash e : t_1 ! row_1 \mid [S_1 N_1] fresh-row[N_1, row_2, N_2]
                                                                                                                                                                                                                  fresh-var[N_2, t_2, N_3]
                                                                       [S_1 N_3] (op (t_1 \Rightarrow t_2) row<sub>2</sub>) ~ row<sub>1</sub> SN_2
                                                                                 \Gamma \mid SN_1 \vdash (op e) : t_2 ! row_1 \mid SN_2
                                                \Gamma \mid SN_1 \vdash e : t \mid row \mid [S_1 N_1] fresh-var[N_1, a, N_2]
                                                              \Gamma \mid SN_1 \vdash (\text{lift op } e) : t ! (op a row) \mid [S_1 N_2]
                  \Gamma \mid SN_1 \vdash e: t_1 ! row_1 \mid SN_2 \quad (x \ t_1 \ \Gamma) \mid SN_2 \vdash e_{ret} : t_{ret} ! row_{ret} \mid SN_3
   infer-handlers \llbracket \Gamma, SN_3, t_{ret}, hs, row_{out}, row_{handled}, SN_4 \rrbracket = SN_4 row_{out} \sim row_{ret} SN_5
                                                                                             SN_5 row_1 \sim row_{handled} SN_6
                                           \Gamma \mid SN_1 \vdash (\text{handle } e \text{ } hs \text{ (return } x e_{ret})) : t_{ret} ! row_{out} \mid SN_6
```

Figure 2.4: Type system

Figure 2.5: Handlers type inference

```
C ::= (e \ \rho \ \Sigma \ \phi \ K) \ | \ (\text{val} \ V \ \rho \ \Sigma \ \phi \ K) \ | \ (op \ V \ n \ K \ K) \ | \ V
V ::= (\lambda \ \rho \ x \ e) \ | \ (\text{rec} \ \rho \ x \ x \ e) \ | \ m \ | \ b \ | \ (V \ ...) \ | \ K
\rho ::= ([x \ V] \ ...)
\sigma ::= (\text{arg} \ e \ \rho) \ | \ (\text{app} \ V) \ | \ (\text{do} \ op) \ | \ (prim \ \rho \ V \ ... \ / \ e \ ...) \ | \ (\text{if} \ e \ e \ \rho)
\Sigma ::= (\sigma \ ...)
\phi ::= (\text{handle} \ hs \ ret \ \rho) \ | \ (\text{lift} \ op) \ | \ done
\kappa ::= (\Sigma \ \phi)
K ::= (\kappa \ ...)
```

Figure 2.6: Abstract machine configurations

appropriate types. The base case of empty list initializes both rows with the same type variable, this way $row_{handled}$ returned by infer-handlers judgment will consist of all handled operations and its tail will be row_{out} . The inductive case first calculates row_{out} and $row_{handled}$ for the tail of the list. Then, two new fresh variables are created: t_v for the type of value passed to handler and t_r for type of resumption parameter. Resumption's result type is the result type of return clause as it should eventually evaluate to a value, which will be transformed by that clause. It's effect row is the same as the result row of whole handle expression, which means that any subsequent uses of operations will be handled by this handler. With environment extended with t_v for first parameter – an argument to handler expression and $t_r \to row_{out} t_{ret}$ for second parameter – the resumption, we check the handler expression e. We then unify the effects of evaluating e with all effects of handlers, and result type t_h with return type t_{ret} . Finally we extend handled row with current operation $(op(t_v \Rightarrow t_r))$

2.3 Abstract machine

Abstract machine is based on *CEK*-machine of Hillerström and Lindley[5], with the difference that during the search for operation handler, machine must count handlers and lifts it passes.

Possible configurations are given in Figure 2.6. Meta-variable C ranges over shapes of machine configurations, meta-variable V ranges over machine values, which

initial-conf
$$[e] = (e()) \pmod{n}$$

Figure 2.7: Abstract machine – initial configuration

are distinct from calculus value, e.g. function values must now keep their environment ρ which maps variables to machine values. Additionally one of possible values is a meta-stack which one may think of as a continuation captured during operation invocation. Meta-variable σ defines normal (or pure) continuation frames and Σ denotes pure continuation stack, while ϕ ranges over effect frames – handle, lift and done token which marks final continuation. Meta-variable κ denotes meta-frame which consists of pure stack and one effect frame. Finally K ranges over stacks of meta-frames, which I will call meta-stacks. Meta-function initial-conf in Figure 2.7 transforms an expression into initial configuration – initializing machine with empty stack, 'done' effect frame and empty meta-stack.

```
((\lambda \times e) \rho \Sigma \phi K) \longrightarrow (\text{val } (\lambda \rho \times e) \rho \Sigma \phi K)
((\text{rec } x_f x_a e) \rho \Sigma \phi K) \longrightarrow (\text{val } (\text{rec } \rho x_f x_a e) \rho \Sigma \phi K)
(m \rho \Sigma \phi K) \longrightarrow (\text{val } m \rho \Sigma \phi K)
(b \rho \Sigma \phi K) \longrightarrow (\text{val } b \rho \Sigma \phi K)
((prim) \rho \Sigma \phi K) \longrightarrow (\text{val } prim-apply \llbracket prim \rrbracket \rho \Sigma \phi K)
(\text{val } V \rho_1 ([\text{arg } e \rho_2] \sigma ...) \phi K) \longrightarrow (e \rho_2 ([\text{app } V] \sigma ...) \phi K)
(\text{val } V \rho_1 ([\text{prim } \rho_2 V_1 ... / e e_1 ...] \sigma ...) \phi K) \longrightarrow (e \rho_2 ([\text{prim } \rho_2 V_1 ... V / e_1 ...] \sigma ...) \phi K)
(\text{val } V \rho ([\text{do } op] \sigma ...) \phi (K ...)) \longrightarrow (op V 0 ([(\sigma ...) \phi] K ...) ())
(\text{val } V \rho () \text{ done } ()) \longrightarrow V
```

Figure 2.8: Abstract machine – administrative transitions

The first group of transitions depicted in Figure 2.8 performs mostly administrative functions – capturing environment for functional values, transforming from value terms to machine values, sequencing binary operations, switching to special configuration for search of handler and a transition for returning final value.

```
((\operatorname{app} e_1 e_2) \rho (\sigma ...) \phi K) \longrightarrow (e_1 \rho ([\operatorname{arg} e_2 \rho] \sigma ...) \phi K)
((\operatorname{op} e) \rho (\sigma ...) \phi K) \longrightarrow (e \rho ([\operatorname{do} \operatorname{op}] \sigma ...) \phi K)
((\operatorname{prim} e e_1 ...) \rho (\sigma ...) \phi K) \longrightarrow (e \rho ([\operatorname{prim} \rho / e_1 ...] \sigma ...) \phi K)
((\operatorname{if} e_{\operatorname{cond}} e_{\operatorname{then}} e_{\operatorname{else}}) \rho (\sigma ...) \phi K) \longrightarrow (e_{\operatorname{cond}} \rho ([\operatorname{if} e_{\operatorname{then}} e_{\operatorname{else}} \rho] \sigma ...) \phi K)
((\operatorname{handle} e \operatorname{hs} \operatorname{ret}) \rho \Sigma \phi (\kappa ...)) \longrightarrow (e \rho () (\operatorname{handle} \operatorname{hs} \operatorname{ret} \rho) ([\Sigma \phi] \kappa ...))
((\operatorname{lift} \operatorname{op} e) \rho \Sigma \phi (\kappa ...)) \longrightarrow (e \rho () (\operatorname{lift} \operatorname{op}) ([\Sigma \phi] \kappa ...))
```

Figure 2.9: Abstract machine – continuation building

Second group of transitions (Figure 2.9) decomposes current expression and

builds continuation by growing either stack or meta-stack. First four rules – for function application, operation invocation, primitive operation call and conditional expression – all create a new pure frame and push it onto stack. Last two transitions deal with effectful operations – handle and lift; they build meta-stack by bundling previous effect frame with current stack into meta-frame, pushing it onto meta-stack and then installing fresh stack and new effect frame into machine configuration.

```
(x \rho \Sigma \phi K) \longrightarrow
(\text{val lookup-}\rho\llbracket\rho, x\rrbracket \rho \Sigma \phi K)
(\text{val } V \rho_2 \text{ ([app (}\lambda \rho_1 x e)] \sigma \dots) \phi K) \longrightarrow
(e \text{ extend}\llbracket\rho_1, x, V\rrbracket \text{ (}\sigma \dots) \phi K)
(\text{val } V \rho_2 \text{ ([app (rec }\rho_1 x_f x_a e)] \sigma \dots) \phi K) \longrightarrow
(e \text{ extend}\llbracket\text{extend}\llbracket\rho_1, x_f, \text{ (rec }\rho_1 x_f x_a e)\rrbracket, x_a, V\rrbracket \text{ (}\sigma \dots) \phi K)
(\text{val } V \rho \text{ ([app (}[\Sigma \phi_1] \kappa_1 \dots)] \sigma \dots) \phi_2 \text{ (}\kappa_2 \dots)) \longrightarrow
(\text{val } V \rho \Sigma \phi_1 \text{ (}\kappa_1 \dots \text{ [}(\sigma \dots) \phi_2] \kappa_2 \dots))
(\text{val } V \rho_1 \text{ ([prim }\rho_2 V_1 \dots /] \sigma \dots) \phi K) \longrightarrow
(\text{val prim-apply}\llbracket\text{prim, } V_1, \dots, V\rrbracket \rho_2 \text{ (}\sigma \dots) \phi K)
(\text{val true }\rho_1 \text{ ([if }e \text{ any }\rho] \sigma \dots) \phi K) \longrightarrow
(e \rho (\sigma \dots) \phi K)
(\text{val false }\rho_1 \text{ ([if }any e \rho] \sigma \dots) \phi K) \longrightarrow
(e \rho (\sigma \dots) \phi K)
```

Figure 2.10: Abstract machine – contractions

Third group of transitions (Figure 2.10) perform various reductions. First rule looks up value of a variable in current environment, second rule performs contraction of normal function, by extending the environment with mapping from function's formal parameter x to calculated value V. Third rule reduces recursive function, extending environment with argument value V and function value, allowing for recursive calls. Last rule handling application deals with continuation resumption, by pushing current stack and effect frame ($[(\sigma ...) \phi_1]$) onto meta-stack, installing the top ($[\Sigma \phi_2]$) of captured meta-stack and prepending its tail ($(\kappa_1 ...)$) to meta-stack.

Transitions in last group (Figure 2.11) form essence of this machine, performing all tasks related to effect handling. First four rules search for appropriate handler for op by maintaining a counter n which is incremented by every lift for op and decremented by every handler for op. Fifth rule matches when the counter is 0 and handler has a case for operation which was invoked. In this situation, the machine must begin evaluation of handling expression, first extending environment with passed argument and captured continuation with current meta-frame appended. Two last rules deal with returning values – in case of handler the return clause is installed, and in case of lift its frame is simply discarded.

```
(op\ V\ n\ ([\Sigma\ (lift\ op)]\ \kappa_1\ ...)\ (\kappa_2\ ...)) \longrightarrow
(op\ V\ (+\ n\ 1)\ (\kappa_1\ ...)\ (\kappa_2\ ...\ [\Sigma\ (lift\ op)]))
(op_1 \ V \ n \ ([\Sigma \ (lift \ op_2)] \ \kappa_1 \ldots) \ (\kappa_2 \ldots)) \longrightarrow
(op\ V\ (+\ n\ 1)\ (\kappa_1\ ...)\ (\kappa_2\ ...\ [\Sigma\ (lift\ op)]))
                                                                     where op_1 = op_{!_1}, op_2 = op_{!_1}
(op\ V\ n\ ([\Sigma\ (handle\ hs\ ret\ \rho)]\ \kappa_1\ ...)\ (\kappa_2\ ...)) \longrightarrow
(op\ V\ (-n\ 1)\ (\kappa_1\ ...)\ (\kappa_2\ ...\ [\Sigma\ (handle\ hs\ ret\ 
ho)]))
                                                                where \inf[op, ops[hs]], (> n = 0)
(op\ V\ n\ ([\Sigma\ (handle\ hs\ ret\ \rho)]\ \kappa_1\ ...)\ (\kappa_2\ ...))\longrightarrow
(op V n (\kappa_1 ...) (\kappa_2 ... [\Sigma (handle hs ret \rho)]))
                                                                              where not-in [op, ops[hs]]
(op\ V\ 0\ ([\Sigma\ (handle\ hs\ ret\ 
ho)]\ [\Sigma_2\ \phi]\ \kappa_1\ ...)\ (\kappa_2\ ...)) \longrightarrow
(e extend[[extend[[\rho, x_1, V]], x_2, (\kappa_2 ... [\Sigma (handle hs\ ret\ 
ho)])]] \Sigma_2 \phi (\kappa_1 ...))
                                                             where get-handler [op, hs, (x_1 x_2 e)]
(val V \rho_1 () (handle hs (return x e) \rho) ([\Sigma \phi] \kappa ...)) \longrightarrow
(e \; \mathsf{extend}[\![ \rho, \, x, \, V]\!] \; \Sigma \; \phi \; (\kappa \; \ldots))
(val V \rho () (lift op) ([\Sigma \phi] \kappa ...)) \longrightarrow
(val V \rho \Sigma \phi (\kappa ...))
```

Figure 2.11: Abstract machine – effect handling

Chapter 3

Implementation

3.1 Unification

The unification algorithm is loosely based on [10], but instead of keeping a set of constraints to be solved, it solves sub-problems recursively. It is implemented as a PLT Redex judgment, which takes two types, the initial substitution and returns the substitution extended with their unifier. This judgment must also pass around the name supply token – a natural number which is incremented every time a new type variable is created. Variables in types are substituted lazily – whenever algorithm encounters variable which is in domain of the substitution, it looks it up and continues unification. The Figure 3.1 shows the unification algorithm.

Terminal rules refl-var and refl-const handle unification of equal variables and constants respectively. In a special case refl-var-lookup, when both types are variables, the left variable a_1 is not in the domain of substitution and the right variable a_2 is mapped to a_3 which is equal to a_1 , then they are in fact the same variable and should unify. This corner-case arises due to lazy application of substitution to types.

The rule ext extends substitution, when the left-hand-side type is a variable which is not in the domain of substitution. It is important to note, that the type which is inserted into substitution is fully substituted. This way we can maintain an invariant, that every type in the substitution has only type variables which are not in the domain of the substitution. The last side condition, that a is not a free type variable in t is the occurs-check, which ensures that algorithm doesn't try to unify cyclic types, which would loop.

When the left type is a variable, in the domain of substitution, rule lookup looks it up, and continues unification. When the left type is not a variable, and right type is, rule flip flips them around and continues unification. This rule is needed because the judgment performs extension and lookup only on left variable. The next three rules ->, => and List decompose the type constructor and unify all

respective sub-types.

The last rule row unifies two rows. It requires the left row to be non empty, and the right row not to be a variable (to ensure determinism with respect to the rule flip). Then it uses helper judgment unify-row which rewrites row_2 such that its head is $op\ t_2$ and rest is bound row_r . The side condition, requiring the variable at the end of (substituted) row_1 not to be in domain of substitution which was build by the rewriting ensures that algorithm does not try to unify rows with different labels, but same type variable in the tail (similar to occurs-check in rule ext).

The helper judgment unify-row, shown in Figure 3.2 rewrites the row such that it begins with desired label op. It is based on similar judgment in [7]. There are two base cases: either the row already begins with op (rule row-head) and is decomposed and returned or the row is already a variable which is not bound by substitution (rule row-var). In this case the substitution is extended with a row (optrow) where both t and row are fresh variables.

The third rule row-lookup handles variables which are bound by the substitution, looking up the appropriate row and continuing row rewriting. The last rule row-swap matches rows that have a label o1 different to desired label o. In this case, the rest of the row must rewritten recursively yielding type t_2 for o and new tail. The type is returned and the tail is extended with original head.

3.2 Automatic testing

3.3 The Racket environment

Figure 3.1: Unification algorithm

Figure 3.2: Row unification algorithm

Chapter 4

User's manual

Bibliography

- [1] Andrej Bauer and Matija Pretnar. ?Programming with Algebraic Effects and Handlers? In: CoRR abs/1203.1539 (2012). arXiv: 1203.1539. URL: http://arxiv.org/abs/1203.1539.
- [2] Dariusz Biernacki et al. ?Abstracting Algebraic Effects? In: *Proc. ACM Program. Lang.* 3.POPL (Jan. 2019), 6:1–6:28. ISSN: 2475-1421. DOI: 10.1145/3290319. URL: http://doi.acm.org/10.1145/3290319.
- [3] Dariusz Biernacki et al. ?Handle with Care: Relational Interpretation of Algebraic Effects and Handlers? In: *Proc. ACM Program. Lang.* 2.POPL (Dec. 2017), 8:1–8:30. ISSN: 2475-1421. DOI: 10.1145/3158096. URL: http://doi.acm.org/10.1145/3158096.
- [4] Matthias Felleisen, Robert Bruce Findler, and Matthew Flatt. Semantics Engineering with PLT Redex. 1st. The MIT Press, 2009. ISBN: 0262062755, 9780262062756.
- [5] Daniel Hillerström and Sam Lindley. ?Liberating Effects with Rows and Handlers? In: Proceedings of the 1st International Workshop on Type-Driven Development. TyDe 2016. Nara, Japan: ACM, 2016, pp. 15–27. ISBN: 978-1-4503-4435-7. DOI: 10.1145/2976022.2976033. URL: http://doi.acm.org/10.1145/2976022.2976033.
- [6] Oleg Kiselyov and KC Sivaramakrishnan. ?Eff Directly in OCaml? In: arXiv e-prints, arXiv:1812.11664 (Dec. 2018), arXiv:1812.11664. arXiv: 1812.11664 [cs.PL].
- [7] Daan Leijen. ?Extensible records with scoped labels? In: Proceedings of the 2005 Symposium on Trends in Functional Programming (TFP'05), Tallin, Estonia. Sept. 2005. URL: https://www.microsoft.com/en-us/research/publication/extensible-records-with-scoped-labels/.
- [8] Daan Leijen. ?Koka: Programming with Row Polymorphic Effect Types? In: Mathematically Structured Functional Programming 2014. EPTCS, Mar. 2014. URL: https://www.microsoft.com/en-us/research/publication/koka-programming-with-row-polymorphic-effect-types-2/.
- [9] Sam Lindley, Conor McBride, and Craig McLaughlin. ?Do Be Do Be Do? In: SIGPLAN Not. 52.1 (Jan. 2017), pp. 500-514. ISSN: 0362-1340. DOI: 10.1145/3093333.3009897. URL: http://doi.acm.org/10.1145/3093333.3009897.

34 BIBLIOGRAPHY

[10] Benjamin C. Pierce. Types and Programming Languages. 1st. The MIT Press, 2002. ISBN: 0262162091, 9780262162098.

- [11] Gordon Plotkin and John Power. ?Algebraic Operations and Generic Effects?
 In: Applied Categorical Structures 11.1 (Feb. 2003), pp. 69-94. ISSN: 1572-9095. DOI: 10.1023/A:1023064908962. URL: https://doi.org/10.1023/A:1023064908962.
- [12] Gordon Plotkin and Matija Pretnar. ?Handling Algebraic Effects? In: Logical Methods in Computer Science 9.4 (Dec. 2013). Ed. by Andrzej Tarlecki. ISSN: 1860-5974. DOI: 10.2168/lmcs-9(4:23)2013. URL: http://dx.doi.org/10.2168/LMCS-9(4:23)2013.
- [13] Didier Rémy. ?Theoretical Aspects of Object-oriented Programming? In: ed. by Carl A. Gunter and John C. Mitchell. Cambridge, MA, USA: MIT Press, 1994. Chap. Type Inference for Records in Natural Extension of ML, pp. 67–95. ISBN: 0-262-07155-X. URL: http://dl.acm.org/citation.cfm?id=186677.186689.