Algebraic Effects and Handlers

Ningning Xie

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- > Lectures on Algebraic Effects, Gordon Plotkin, NII Shonan meeting No. 146, 2019
- ► Effect-Handler Oriented Programming, Sam Lindley, OPLSS'22
- My collaborators: Daan Leijen, Jonathan Brachthäuser, Daniel Hillerström, Philipp Schuster, Youyou Cong, Kazuki Ikemori, Daniel D. Johnson, Dougal Maclaurin, Adam Paszke, Gordon Plotkin

- ► Input/output
- ► Read/Write
- ► Exceptions
- ► Mutable states
- ► Concurrency
- ► Backtracking
- ≻ ...

Effects are everywhere

- ► Input/output
- ► Read/Write
- ► Exceptions
- ➤ Mutable states
- ► Concurrency
- ➤ Backtracking
- ≻ ...



Effects are often ad-hoc and hard-coded.

Algebraic effects and effect handlers

Composable and structured control-flow abstraction.







FoSSaCS'01

Adequacy for Algebraic Effects

Gordon Plotkin and John Power *

Division of Informatics, University of Edinburgh, King's Buildings, Edinburgh EH9 3JZ, Scotland

Abstract. Moggi proposed a monadic account of computational effects. He also presented the computational λ -aclcutu, λ_{α} , a core call-hy-value functional programming language for effects; the effects are obtained by adding appropriate operations. The question arises as to whether one can give a corresponding treatment of operational semantics. We do this in the case of algebraic effects where the operations are given by a single-sorted algebraic signature, and their semantics is supported by the monad, in a certain sense. We consider call-by-value PCP with and without—creation of λ_{α} with arithmetic. We prove general adequacy theorems, and illustrate these with two examples: nondeterminism and probabilistic nondeterminism.

ESOP'09

Handlers of Algebraic Effects

Gordon Plotkin * and Matija Pretnar **

Laboratory for Foundations of Computer Science, School of Informatics, University of Edinburgh, Scotland

Abstract. We present an algebraic treatment of exception handlers and, more generally, introduce handlers for other computational effects representable by an algebraic theory. These include nondeterminism, interactive input/output, concurrency, state, time, and their combinations; in all cases the computation mond is the free-model monad of the theory. Each such handler corresponds to a model of the theory for the effects at hand. The handling construct, which applies a handler to a computation, is based on the one introduced by Benton and Kennedy, and is interacted using the home membring induced by the number of the theory.



Leo White

Jane Street

London, UK

leo@lpw25.net

Anil Madhavapeddy

University of Cambridge and OCaml Labs

Cambridge UK

avsm2@cl.cam.ac.uk

Retrofitting Effect Handlers onto OCaml

- KC Sivaramakrishnan IIT Madras Chennai, India kcstk@cse iitm ac in
 - Tom Kelly OCaml Labs Cambridge, UK tom.kelly@cantab.net

Abstract

PLDI'21

Effect handlers have been gathering momentum as a mechanism for modular programming with user-defined effects. Effect handlers allow for non-local control flow mechanisms such as generators, async/await, lightweight threads and coroutines to be composably expressed. We present a design and evaluate a full-fledged efficient implementation of effect handlers for OCaml, an industrial-strength multi-paradigm programming language. Our implementation strives to maintain the backwards compatibility and performance profile of existing OCaml code. Retrofitting effect handlers onto OCaml is challenging since OCaml does not currently have any nonlocal control flow mechanisms other than exceptions. Our implementation of effect handlers for OCaml: (i) imposes a mean 1% overhead on a comprehensive macro benchmark suite that does not use effect handlers; (ii) remains compatible with program analysis tools that inspect the stack; and (iii) is efficient for new code that makes use of effect handlers.

CCS Concepts: • Software and its engineering → Runtime environments; Concurrent programming structures; Control structures; Parallel programming languages;

Stephen Dolan OCaml Labs Cambridge, UK stephen.dolan@cl.cam.ac.uk

Sadiq Jaffer Opsian and OCaml Labs Cambridge, UK sadiq@toao.com

1 Introduction

Effect handlers [45] provide a modular foundation for userdefined effects. The key idea is to separate the definition of the effectful operations from their interpretations, which are given by handlers of the effects. For example,

effect In_line : in_channel -> string

declares an effect to.line, which is parameterised with an input channel of type in.c.show, which when performed returns a string value. A computation can perform the in.line effect without knowing how the c.line effect is implemented. In this computation may be enclosed by different handlers that handle in.line differently. For example, in.line may be implemented by performing a blocking read on the input channel or performing the read synchronously by offloading it to an event loop such as ilow, without changing the computation. Thanks to the separation of effectful operations from their implementation, effect handlers can be new approaches to modular programming. Effect handlers are a generalisation of exception handlers, where, in addition to the effect being handled, the handler is provided with the delimited continuion [14] of the perform site. This continuation may be



ACM Reference Format:

CCS Concepts: • Soft

time environments

tures Control struct

Dan Ghica, Sam Lindley, Marcos Maroñas Bravo, and Maciej Piróg. 2022. High-Level Effect Handlers in C++. Proc. ACM Program. Lang. 6, OOPSLA2, Article 183 (October 2022), 29 pages. https://doi.org/10.1145/3563445





benchmarks.

time environments: tures Control struct Dan Ghica. Sam Lin Proc. ACM Program

We present Wasn via effect handlers, et

Growing interest in industry





ΡΥΡΟ

Python probabilistic programming

Fusing industry and academia at Github

ICFP'22

Fusing Industry and Academia at GitHub (Experience Report)

PATRICK THOMSON, GitHub, Inc., United States ROB RIX, GitHub, Inc., Canada NICOLAS WU, Imperial College London, United Kingdom TOM SCHRIJVERS, KU Leuven, Belgium

GitHub hosts hundreds of millions of code repositories written in hundreds of different programming languages. In addition to its hosting services, GitHub provides data and insights into code, such as vulnerability analysis and code navigation, with which users can improve and understand their software development process. GitHub has built SEMANTIC, a program analysis tool capable of parsing and extracting detailed information from source code. The development of SEMANTIC has relied extensively on the functional programming literature; this paper describes how connections to academic research inspired and informed the development of an industrial-scale program analysis toolkit.

CCS Concepts: • Software and its engineering \rightarrow General programming languages; • Social and professional topics \rightarrow History of programming languages.

Additional Key Words and Phrases: effects, Haskell, data types, industry

ACM Reference Format:

Patrick Thomson, Rob Rix, Nicolas Wu, and Tom Schrijvers. 2022. Fusing Industry and Academia at GitHub (Experience Report). Proc. ACM Program. Lang. 6, ICFP, Article 108 (August 2022), 16 pages. https://doi.org/10. 1145/3547639

1 INTRODUCTION

GitHub is a service that provides storage for repositories of source code tracked with the Git

Fusing industry and academia at Github

ICFP'22

Fusing Industry and Academia at GitHub (Experience Report)

PATRICK THOMSON CitHub Inc. United State

"An example of the utility and flexibility of algebraic effects is an effect we developed to extract telemetry data from our production Haskell systems."

" In a production context, we wanted these data to be uploaded to an aggregator; in a development context we wanted to see them reported on the command-line; and when running automated tests, we wanted to discard them entirely"

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1 INTRODUCTION

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Effect handler research languages



1. Algebraic effects

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1.1. Introduction

How do effects arise?

i.e., how do we "construct" them in a programming language?

Algebraic effects

An algebraic effect is given by

- ▶ operations (i.e. *effect constructors*) with signatures
- ► a set of axioms

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Example: one boolean location

signatures: $put_t : 1$, $put_f : 1$, get : 2

- > Read $put_b(m)$ as "put b, and continue with m".
- > Read get(m, n) as "get the boolean value, continue with m if true, and n otherwise".

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axioms: the set of axioms

- ▶ get(m, m) = m
- ► get(get(m, m'), get(n, n')) = get(m, n')
- $put_b(put_{b'}(m)) = put_{b'}(m)$

- ▶ $get(put_t(m), put_f(n)) = get(m, n)$
- ▶ $put_b(get(m_t, m_f)) = put_b(m_b)$

Interpretation $T_b(X) = B \rightarrow (X \times B)$ $\begin{bmatrix} c \end{bmatrix} = \lambda s. (c, s)$ $\begin{bmatrix} get(m, n) \end{bmatrix} = \lambda s. \text{ if } s \text{ then } \llbracket m \rrbracket s \text{ else } \llbracket n \rrbracket s$ $\llbracket put_b(m) \rrbracket = \lambda s. \llbracket m \rrbracket b$

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Sound and complete with respect to the equations:

 $m = n \Longleftrightarrow \llbracket m \rrbracket = \llbracket n \rrbracket$

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- $[[put_t(get(m_t, m_f))]] = \lambda s. [[get(m_t, m_f)]]t = \lambda s. (\lambda s. if s then [[m_t]]s else [[m_f]]s)t$ $= \lambda s. if t then [[m_t]]t else [[m_f]]t = \lambda s. [[m_t]]t$
- ▶ $\llbracket put_t(m_t) \rrbracket = \lambda s. \llbracket m_t \rrbracket t$

Exercise 1: Show other equations hold.

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Exercise 1: Show other equations hold.

Exercise 2: Show that the get-get equation is redundant.

A different interpretation: $T_{log}(X) = B \rightarrow (X \times List B)$

$$\begin{bmatrix} c \end{bmatrix} = \lambda s. (c, [s])$$

$$\begin{bmatrix} get(m, n) \end{bmatrix} = \lambda s. \text{ if } s \text{ then } \llbracket m \rrbracket s \text{ else } \llbracket n \rrbracket s$$

$$\llbracket put_b(m) \rrbracket = \lambda s. \text{ let } (n, s) \leftarrow \llbracket m \rrbracket b \text{ in } (n, b :: s)$$

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Complete with respect to the equations:

$$m = n \Leftarrow \llbracket m \rrbracket = \llbracket n \rrbracket$$

But not sound:

$$\llbracket \mathsf{put}_b(\mathsf{put}_{b'}(m)) \rrbracket
eq \llbracket \mathsf{put}_{b'}(m) \rrbracket$$

> the left hand side logs twice, while the right hand side only logs once

Another interpretation: $T_{discard}(X) = B \rightarrow X$

$$\begin{bmatrix} c \end{bmatrix} = \lambda s. c$$

$$\begin{bmatrix} get(m, n) \end{bmatrix} = \lambda s. \text{ if } s \text{ then } \llbracket m \rrbracket s \text{ else } \llbracket n \rrbracket s$$

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Sound with respect to the equations:

$$m = n \Longrightarrow \llbracket m \rrbracket = \llbracket n \rrbracket$$

But incomplete:

$$\llbracket put_b(m) \rrbracket = \llbracket m \rrbracket$$
 but $put_b(m) \neq m$

Example: exception

signatures: $raise_e : 0$ $(e \in E)$

axioms: none

interpretation: $T_{exc}(X) = X + E$

 $\llbracket c \rrbracket = inl(c)$ $\llbracket raise_e \rrbracket = inr(e)$

Yet another example: non-determinisim

Example: non-determinisim

signatures: or : 2

> Read or(m, n) as "non-deterministically runs m or n".

axioms:

- ► or(m, or(n, p)) = or(or(m, n), p)
- ► or(m, n) = or(n, m)
- ▶ or(m, m) = m

(associativity) (commutativity) (absorption)

interpretation: $T_{ndet}(X) = \mathcal{F}^+(X)$ collection of non-empty finite subsets of X

$$\llbracket c \rrbracket = \{c\}$$
$$\llbracket or(m,n) \rrbracket = \llbracket m \rrbracket \cup \llbracket n \rrbracket$$

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- ► a set of axioms

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Is a set of axioms the right set of axioms?

- > An equational theory is *equationally inconsistent* if it proves x = y.
- An equational theory is *Hilbert-Post complete* if adding an unprovable equation makes it equationally inconsistent.

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Different interpretations are useful in practice, so sometimes people use effects *without* equations.

Algebraicity

From the literature:

Fix a finitary equational axiomatic theory Ax. Then for any set X and operation symbol op : n we have the function:

$$T_{\mathrm{Ax}}(X)^n \stackrel{\mathrm{op}_{F_{\mathrm{Ax}}(X)}}{-\!-\!-\!-\!-\!-\!-\!-\!-\!-} T_{\mathrm{Ax}}(X)$$

Further for any function $f : X \to T_{Ax}(Y)$, f^{\dagger} is a homomorphism:

$$T_{Ax}(X)^{n} \xrightarrow{\operatorname{op}_{F_{Ax}}(X)} T_{Ax}(X)$$

$$(f^{\dagger})^{n} = \int_{T_{Ax}} f^{\dagger} f^{\dagger}$$

$$T_{Ax}(Y)^{n} \xrightarrow{\operatorname{op}_{F_{Ax}}(Y)} T_{Ax}(Y)$$

We call such a polymorphic family of functions $T_{Ax}(X)^n \xrightarrow{\varphi_X} T_{Ax}(X)$ algebraic.

Algebraicity

From the literature:



Evaluation context $E ::= \Box | E n | (\lambda x. m) E$

For any operation *op* : *n*, we have:

$$E[op(m_1,\ldots,m_n)] = op(E[m_1],\ldots,E[m_n])$$

Evaluation context $E ::= \Box \mid E \mid n \mid (\lambda x, m) \mid E$

For any operation *op* : *n*, we have:

$$E[op(m_1,\ldots,m_n)] = op(E[m_1],\ldots,E[m_n])$$

Example

- \rightarrow raise_e() $n = raise_e()$
- \rightarrow or(m, n) p = or(m p, n p)
- $\succ (\lambda x. m) raise_{e}() = raise_{e}() \qquad \succ (\lambda x. p) or(m, n) = or((\lambda x. p) m, (\lambda x. p) n)$

- ▶ operations (i.e. *effect constructors*) with signatures
- ► a set of axioms

Algebracity

► operations commute with evaluation contexts

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Algebracity

► operations commute with evaluation contexts

Next:

- ► computational trees and free monads
- ► generic effects

1. Algebraic effects

1.2. Computational trees and free monad

Recall the boolean location with signature

 $put_t : 1, put_f : 1, get : 2$

Recall the boolean location with signature

 $put_t : 1, put_f : 1, get : 2$

Consider a term $toggle = get(put_f(t), put_t(f))$

Question: What is this term doing?



Values

Operations

 A computational tree is a tree whose leaves are values, and internal nodes are operations.

Computational trees

 $toggle = get(put_f(t), put_t(f))$



Computational trees



Question: what is this program doing?

Computational trees



Question: what is this program doing?

 $get(or(raise, t), put_t(f))$

A computational tree is a tree whose leaves are values, and internal nodes are operations.

Computational trees as free monads

```
data Free f a = Pure a | Free (f (Free f a))
```

- > Pure a: Represents a pure value, effectively the return of a monad
- Free (f (Free f a)): Represents an operation that produces another Free f a computation.

The **bind** performs substitution at the leaves

return c >>= r = r c op(m1, ..., mn) >>= r = op (m1 >>=r, ..., mn >== r)