Computational Effects:

A Story of Categories and Algebras

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Computational Effects: cory of Categories and Algebras What the heck is this?

# We want to interact with the world ...in a functional taste!

# We want to interact with the world ...in a functional taste!





All the way – from the tiniest bits to the big components.





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All the way – from the tiniest bits to the big components.

# We love modularity!





All the way – from the tiniest bits to the big components.

# Well... Yes... But...

Consider an annoying example...



#### def f(x):

#### return x

They return the same thing, Shouldn't they be the same function?





## Some Common Computational Effects

- Input / Output
- Error Handling and Exceptions
- Mutable State
- Logging
- Concurrency
- Generating Random Values



# We want to interact with the world ...in a functional taste!

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Categories 101



Categories 101

#### Monads

Categories 101

Monads



Categories 101

Monads (Categories for Computational Effects)



Categories 101

Monads (Categories for Computational Effects)

Lawvere Theories



Categories 101

Monads (Categories for Computational Effects)

Lawvere Theories (Categories of Operations and Equations)



Categories 101

Monads (Categories for Computational Effects)

Lawvere Theories (Categories of Operations and Equations

**A Comparison** 





#### Functions

A function, e.g.  $f(x) = x^3 - 9x + 7$ 

comes with specified sets of "possible input values" and "potential output values."  $f: I \rightarrow R$ 

We write

$$I \xrightarrow{f} O$$

to indicate f has source I and target O.

## Functions Compose!

- So why bother with source and targets?
- They indicate when are two functions composable:

$$A \xrightarrow{f} B$$
 and  $B \xrightarrow{g} C$ 

- Are composable:
- just when the <u>target</u> of **f** equals the <u>source</u> of **g**.

## What is a category?

- A category is a two-sorted structure encoding the algebra of composition.
- It has:
  - Objects: A, B, C, ...and
  - Morphisms:  $A \xrightarrow{f} B$ ,  $B \xrightarrow{g} C$ , each specified with source and target
- So that,
  - each pair of composable arrows f and g
     will have a composite arrow f g





• for which the composition operation is associative and unital.

### Isomorphisms

• An **isomorphism** consists of:



- So that:
- $g \circ f = id_A$  and  $f \circ g = id_B$
- If A and B are isomorphic
- then every category theoretic property of A is also true of B.

#### Functors

- Given categories **C** and **D**, a functor  $F : C \rightarrow D$  is specified by:
  - A mapping obj  $C \rightarrow \text{obj } D$  whose value at X is written FX
  - For all  $X, Y \in C$ , a function  $Hom_C(X, Y) \to Hom_D(FX, FY)$  whose value at  $f: X \to Y$  is written  $Ff: FX \to FY$
  - ...which is required to preserve composition and identity morphisms:
    - $F(g \circ f) = F(g) \circ F(f)$
    - $F(\operatorname{id}_X) = \operatorname{id}_{F(X)}$



## Exemplar Categories

- In the category Set, the
  - Objects are (finite) sets X, Y, ...
  - Arrows are functions  $X \xrightarrow{f} Y_{\dots}$
- In the syntactic category for some programming language, the
  - Objects are types X, Y, ...
  - Arrows are programs  $X \xrightarrow{f} Y$
- The precise ontology of the objects and arrows won't matter much.

# Categories for Computational Effects (Monads!)

Computational lambda-calculus and monads Notions of computation and monads Lab. for Found. of Comp. Sci. Eugenio Moggi\* University of Edinburgh The 4-calculus is considered an useful mathematical tool in the study of programming anaxuaes, since programs can be identified with  $\lambda$ -terms. However, if one goes further and EH9 3JZ Edinburgh, UK The  $\lambda$ -calculus is considered an useful mathematical tool in the study of programming languages, since programs can be identified with  $\lambda$ -terms. However, if one fores further and uses  $\beta p$ -conversion to prove equivalence of programs, then a gross simplification is introduced On leave from Univ. di Pisa languages, since programs can be identified with  $\lambda$ -terms. However, if one goes further such uses  $\beta p_{c}$  conversion to prove equivalence of programs, then a gross samplification is introduced (programs are identified with total functions from values to values), that may jeopartise the uses phy-conversion to prove equivalence of programs, then a gross simplification is introduced (Programs are identified with total functions from subus to totales), that may journable associability of theoretical results. In this paper we introduce calcul based on a categoride (programs are identified with total functions from values to values), that may joopardise the applicability of theoretical results. In this paper we introduce calcult based on a categorical semantics for computations, that provide a correct basis for proving equivalence of programs. • The logical approach gives a applicability of theoretical results. In this paper we introduce calculi based on a categorical for a wide range of notions of computation. ne togical approach gives a models for the language. The prove that two terms denotes all possible models. Introduction An Abstract View of Programming Languages The A-calculus is considered an useful mathematical The operational and denotational This paper is about logics for reasoning about programs, in particular for proving equivalence of conservans. Following a consolidated tradition in theoretical computer science we identify mourname The Acalculus is considered an useful mathematical tool in the study of programming languages. However, a theory (the operational equival This paper is about logics for reasoning about programs, in particular for proving equivalence of programs. Following a consolidated tradition in theoretical computer science we identify programs with the closed  $\lambda$ -terms. nossibly containing extra constants, corresponding to some features of the science of the science is the science of the science of the science is the science of the scien toot in the study of programming languages. However, if one uses /9+conversion to prove equivalence of pro-programs. Following a consolidated tradition in theoretical computer science we identify programs, with the closed *i*-terms, possibly containing extra constants, corresponding to some features of the nonramming language under consideration. There are three semantic-based approaches to If one uses ph-conversion to prove equivalence of pro-grams, then a gross simplification is introduced. We and they (especially the open with the closed  $\lambda$ -terms, possibly containing cutra constants, corresponding to some features of the programming language under consideration. There are three semantic-based approaches to proving environments. grams, then a gross simplification' is introduced, we grow a calculus based on a categorical semantics for several statement of the second sec rogramming languages c Eugenio Moggi Lab. for Found. of Comp. Sci. The operational approach starts from an operational semantics, e.g. a partial function manning every program (i.e. closed term) to its resulting value (if any), which induces a computations, which provides The operational approach starts from an operational semantics, e.g. a partial function mapping every program (i.e. closed term) to its resulting value (if any), which induces a construence relation on onen terms called operational emivalence (see e.g. [Pho75]). The second sec ing equivalence of program mapping every program (i.e. closed term) to its resulting value (if any), which induces a congruence relation on open terms called **operational equivalence** (see e.g. [Pio75]). Then the problem is to prove that two terms are operationally equivalent. specific computational mode congruence relation on open terms called **operational equivalence** (so the problem is to prove that two terms are operationally equivalent. The denotational approach fires an interpretation of the (programming) language in a mathematical attractive, the intended model. These the oroblem is to neve that two terms The denotational approach gives an interpretation of the (programming) language in a mathematical structure, the intended model. Then the problem is to prove that two terms denote the same object in the intended model. Programs should form a category Introduction This paper is about logi grams, in particular for grams, in Particular in grams, Following a cons ical computer science y And an effect defines a monad closed *\lambda*-terms, possib corresponding to some els for the (programming) language. language under consi ets tor the (programming) surguage. e same object in all possible models. proaches to proving ory: the operational equivalence  $\approx$ by: the operational equivalence  $\approx$ ely. On the other hand, the logical • The operation ping every program (i.e. closed wa ing value (if any), which induces a congruent ey, on the other name, the  $o_{\text{Strain}}$  is formula A is true in all models ing value (it any), which monces a congruent lation on open terms called **operational equiva** can be exm ceed as follows: nming languages (e.g. functional lation on open terms called operational equiva-lence (see e.g. (10)). Then the problem is to prove aning tangonges (e.g. tunctional, pply changing the set of axions 1. We take cate tence (see e.g. (10)). Then are proven is to b that two terms are operationally equivalent.  $q_{PO}$  stranging the set of axions foreover, the relation  $\vdash$  is often l system for it, while Th and  $\approx$ functions an • The denotational approach gives an interpretamantics of The **denotational** approach gives an interpreta-tion of the (programming) language in a mathprograms the theory of  $\beta\eta_{-}$ tion of the (programming) language in a math-ematical structure, the intended model. Then 2. We conside The of type  $A \to B$  with a ematical structure, the **intended model**. Then the problem is to prove that two terms denote the be extends pletely behaviours like nonreal programs, Instead, we At the end we <sup>1</sup>These Notes were produced at Stan are provide in the intended model. \*Research partially supported by EEC Joint Collaboration Contract # ST2L0374-C(EDB). lambda-calci taught in Spring Term 1989. A second thank to John Mi equivalence to Stanford possible, and to all students who attended the elop on top a categorical رمانتهوی به ۲۰ و موجود (ماریک). Programs are identified with total functions from values to معادی plete w.r.t. feedback. C(EDB) Eugenio Moggi values.

### Monads, Categorically

- A monad over a category **C** is a triple  $(T, \eta, \mu)$ , where
  - $T: C \rightarrow C$  is a functor,
  - Morphisms  $\eta_A : A \to TA$  and  $\mu_A : T^2(A) \to T(A)$  for every object  $A \in C$
  - (For those of you who know: actually natural transformations)
  - Make the following diagrams commute:



## Monads are Burritos

Assume C is a category of foods.

•  $T: C \rightarrow C$  is a functor, like burritos



•  $\eta_A: A \to TA$  takes a regular value and turns it into a burrito



•  $\mu_A : T^2(A) \to T(A)$  takes a ridiculous burrito of burritos and turns them into a regular burrito.



Monads are Monoids



A monad is a monoid in the category of endofunctors

Let **T** be a notion of computation (encoding an effect)

A T-program from A to B is a function  $A \xrightarrow{f} T(B)$ , from the set of values of type A to the set of T-computations of type B.

We also write 
$$A \xrightarrow{f} B$$
 to denote  $A \xrightarrow{f} T(B)$ 

```
T-Programs
```

```
def greaterThanM (m : N) (n : N) : Prop
:= n > m
```

```
-- setOf (p : \alpha \rightarrow Prop) : Set \alpha
```

```
def TNat (m : N) : Set N :=
 setOf (greaterThanM m)
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### Sample "Notions of Computation" / T-Programs in the Category of Sets

- **Exceptions**: TA = A + E where *E* is the set of exceptions
- **Partiality:**  $TA = A + \{ \perp \}$  (i.e. **Option** A in Lean 4)
- Side-Effect:  $TA = (S \times A)^S$  or  $TA = \{S \to S \times A\}$  for fixed set *S* modelling the effect of a single mutable state storing a value of *S*.
- Continuation:  $TA = R^{(R^A)}$ , or  $TA = (A \to R) \to R$  for a fixed set R

models the effect of *call with current continuation* (call/cc).

- Interactive Input:  $TA = \mu X \cdot A + X^U$ , where U is the set of characters
  - i.e set of **U**-branching trees (with finite branches) and **A**-labelled leaves, where  $\mu X \cdot \tau$  is the least solution to domain equation  $X = \tau$

### Sample "Notions of Computation" / T-Programs in the Category of Sets

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Slogan



Slogan



### The Category of T-Programs

- To define the category of T-programs we need:
  - Identity Arrows:  $A \xrightarrow{id_A} A$
  - We can use  $\eta$  in monads! (Reminder:  $\eta$  : Id<sub>C</sub>  $\rightarrow$  T) so  $A \xrightarrow{\eta_A} T(A)$
  - We need to define composition making this diagram commute:



### Kleisli Triple

- A Kleisli Triple over a category **C** is a triple  $(T, \eta, \mu)$ , where
  - $T: C \rightarrow C$  is a functor,
  - $\eta_A : A \to TA$  for every object  $A \in C$
  - $f^*: TA \to TB$  for every object  $A, B \in C$  and  $f: A \to TB$
- Then we can have the Kleisli Composite of A  $\stackrel{f}{\rightarrow}$  B and B  $\stackrel{g}{\rightarrow}$  C



### Kleisli Category over $T: Kl_T$

- Given an endofunctor **T** on category  $\mathscr{C}$ , the Kleisli Category  $Kl_T$  is defined as:
  - Obj  $(Kl_T) = \text{Obj}(\mathscr{C})$
  - $\operatorname{id}_A = \eta_A : A \to T(A) \text{ (i.e. } A \xrightarrow{\operatorname{id}_A} A \text{)}$
  - $Hom_{Kl_T}(A, B) = Hom_{\mathcal{C}}(A, TB)$
  - $g \circ_{Kl} f = g^* \circ f : A \to TC$ , given  $f : A \to T(B)$  and  $g : B \to T(C)$



# There is a one-to-one correspondence between Kleisli Triples and Monads

## Kl<sub>list</sub> for list-computations

- A list-program  $A \xrightarrow{f} B$  is a function from A to lists in B
- The identity A  $\xrightarrow{id_A}$  list(A) is the function  $A \xrightarrow{\text{singleton}}$  list(A)
- Any function  $B \xrightarrow{g^*} \text{list}(C)$  extends to a function  $\text{list}(B) \to \text{list}(C)$ 
  - by applying g to each term in a list of elements of B
  - and concatenating the result.

The Kleisli composite



is defined by application of f and g followed by concatenation.

class Monad m where (>>=) :: m a  $\rightarrow$  (a  $\rightarrow$  m b)  $\rightarrow$  m b return :: a  $\rightarrow$  m a

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 $T: C \rightarrow C$  is a functor

class Monad m where (>>=) :: m a  $\rightarrow$  (a  $\rightarrow$  m b)  $\rightarrow$  m b return :: a  $\rightarrow$  m a

> $\eta : \operatorname{Id}_{C} \to T$  is a natural transformation So  $\eta_{A} : A \to TA$  is a morphism

class Monad m where (>>=) :: m a  $\rightarrow$  (a  $\rightarrow$  m b)  $\rightarrow$  m b return :: a  $\rightarrow$  m a

 $f^*: TA \to TB$  for every object  $A, B \in C$  and  $f: A \to TB$ 

class Monad m where join ::  $m (m a) \rightarrow m a$ return ::  $a \rightarrow m a$ 

> $\mu: T^2 \to T$  is a natural transformation So  $\mu_A: T^2A \to TA$  is a morphism

class Monad m where (>>=) :: m a  $\rightarrow$  (a  $\rightarrow$  m b)  $\rightarrow$  m b return :: a  $\rightarrow$  m a

 $f^*: TA \to TB$  for every object  $A, B \in C$  and  $f: A \to TB$ 

### Exceptions as a Monad

- $TA = \operatorname{val} A | \operatorname{Exn} E \quad (\approx A + E)$
- $\eta_v = \text{val } V$  (in Haskell Monad, return v)
- Given  $f: A \to TB$ :
  - (val V) >>= f = f v
  - $(\mathsf{Exn} \ E) >> = f = \mathsf{Exn} \ E$
- Operations Specific to Exceptions:
  - raise  $e = \operatorname{Exn} e$
  - try *a* with  $x \to b = \text{match } a$  with (val  $v \to v | \text{Exn } x \to b$ )



### Mutable States as a Monad

- $TA = S \rightarrow A \times S$  (S is the types of states)
- $\eta_v = \forall s . (v, s)$  (in Haskell Monad, return v)
- Given  $f: A \to TB$ :

• 
$$a >> = f = \forall s_1 . f x s_2$$
 where  $(x, s_2) = as_1$  (threading the state)

- Operations Specific to Mutable States:
  - get  $loc = \forall s . (s(loc), s)$

• set *loc* 
$$v = \forall s.((), s\{l \leftarrow v\})$$

# Monads are used as 'backbones' for interpreting effects

# Monads are use arXiv:1406.4823v1 [

[cs.LO]

ZU064-05-FPR main 19 June 2014 0:23 Under consideration for publication in J. Functional Programming 4 29 May 2014 Notions of Computation as Monoids Centro Internacional Franco Argentino de Ciencias de la Información y de Sistemas FCEIA, Universidad Nacional de Rosario, Argentina There are different notions of computation, the most popular being monads, applicative functors, and areause. In this writch use shows that these three nations can be seen as monaids in a monaids Increase are different notions or computation, the most popular being monace, applicative functors, and arrows. In this article we show that these three notions can be seen as monoids in a monoids and arrows we determine the state based or electronic termine the state of the st and arrows. In this arricle we snow that these three notions can be seen as monoids in a monoidal category. We demonstrate that at this level of abstraction one can obtain useful results which can be can be as a supervised to the statement of t category, we demonstrate that at this level of abstraction one can obtain useful results which can be instantiated to the different notions of computation. In particular, we show how free constructions and contain measurementations for measurementation into model constructions for measurementations for measurementations. instantiated to the different notions of computation, in particular, we show how free constructions and Cayley representations for monoids translate into useful constructions for monoids, applicative applicative structure of a stru and Cayley representations for monoids translate into useful constructions for monaus, applicative functors, and arrows. Moreover, the uniform presentation of all three notions helps in the analysis of the relation between them. When constructing a semantic model of a system or when structuring computer code, when constructing a semantic moder of a system of when structuring computer lower, there are several notions of computation that one might consider. Monads (Moggi, 1989), there are several notions of computation that one might consider structure of the second structure Moggi, 1991) are the most popular notion, but other notions, such as arrows (Hughes, 2000) augges, 1991) are the hilbst popular houses, one other notions, such as arrows (ruggies, 2007) and, more recently, applicative functors (McBride & Paterson, 2008) have been gaining Each of these notions of computation has particular characteristics that makes them more Each or these notions or computation has particular characteristics that makes them more suitable for some tasks than for others. Nevertheless, there is much to be gained from unifying all three different notions under a single conceptual framework. annyng au tnree uttrerent notions under a single conceptual thinkwork. In this article we show how all three of these notions of computation can be cast as a muta autore we surve now an ance or unsee notions or computation can be cast as a monoidal category. Monads are known to be monoids in a monoidal cate. a inonousi in a monoiosai category, monaos are known to be monoios in a monoioai cate-gory of endofunctors (Mac Lane, 1971; Barr & Wells, 1985). Moreover, strong monads are goay on encounterate takes, 1974, Datt or metas, 1903), interevent studies instantiate are monoids in a monoidal category of strong endofunctors. Atrows have been recently shown in a strong waveful in a monoidal entropy of avoid and the takes to a strong the takes at a strong strong to the strong strong strong to the strong stron nonouus in a monouusi category or strong entonunctors, Alitows nave toest recently shown to be strong monoids in a monoidal category of profunctors by Jacobs et al. (2009). Ap plicative functors, on the other hand, are usually presented as lax monoidal functors with a picative functors, on the other hand, are usually presented as fax monotal functors with a compatible strength (McBride & Paterson, 2008; Jaskelioff & Rypacek, 2012; Paterson, 2012), to be the strength of comparing successing in terms and the analysis source as a second to a supervise source and the second source However, in the category-theory community, it is known that tax monoidal functors are monoids with respect to the Day convolution, and hence applicative functors are also monoids to a manufact antenance of antidemotors when Day convolution are also monoids in a monoidal category of endofunctors using the Day convolution as a tenfor (Uay, 1973). Therefore, we unify the analysis of three different notions of computation, namely monads, applicative functors, and arrows, by looking at them as monoids in a monoids. and approximation that the second of the sec

## reting effects

# Monads are used as *'backbones'* for interpreting Some effects

# Monads are used as 'backbones' for interpreting Some effects

Monoids in Monoidal Categories

## But where do these monads come from?

# Algebraic Theories for Algebraic Effects (Lawvere Theories!)

### Algebraic Theories

#### **Algebraic Theory**

A signature  $\Sigma = (\Sigma, \operatorname{ar})$  consists of

- $\blacksquare$  a set  $\Sigma$  of operation symbols and
- a function  $\operatorname{ar}: \Sigma \to \mathbb{N}$ , which assigns the arity  $\operatorname{ar}(\underline{op})$  for each  $\underline{op} \in \Sigma$ .

For a signature  $\Sigma$  and a set X, the set of  $\Sigma$ -terms  $Term_{\Sigma}(X)$  generated by X is defined as the smallest set such that

 $\blacksquare X \subseteq Term_{\Sigma}(X) \text{ and }$ 

for any  $\underline{op} \in \Sigma$  and  $t_1, \ldots, t_{\operatorname{ar}(\underline{op})} \in \operatorname{Term}_{\Sigma}(X)$ ,  $\underline{op}(t_1, \ldots, t_{\operatorname{ar}(\underline{op})}) \in \operatorname{Term}_{\Sigma}(X)$ .

An equation is a pair  $(\ell, r)$  of  $\Sigma$ -terms  $\ell, r \in Term_{\Sigma}(V)$ . We sometime write an equation  $(\ell, r)$  as  $V \vdash \ell = r$ .

An algebraic theory  $\mathfrak{T}$  is a pair  $(\Sigma, \mathcal{E})$  of a signature  $\Sigma$  and a set of equations  $\mathcal{E} = \{V_i \vdash \ell_i = r_i\}_{i \in I}$ .

### Algebraic Structures

- An algebraic structure comprises of:
  - a set (or a type), called the **carrier** of the structure;
  - **operations** over this set (with name and arity)
  - equations (laws) that these operations satisfy.

### Algebraic Structure of Monoids

- A monoid  $(T, \epsilon, \circ)$  can be viewed as an algebraic structure, where
  - Carrier: *T*
  - Operations:
    - *ε*:0
    - •:2
  - Equations:
    - $\epsilon \circ x = x$
    - $x \circ \epsilon = x$

• 
$$x \circ (y \circ z) = (x \circ y) \circ z$$

### Algebraic Structure of Monoids

- A monoid  $(T, \epsilon, \circ)$  can be viewed as an algebraic Structure, where
  - Carrier: T
  - Operations:
    - *ε*:0
    - *m* : 2
  - Equations:
    - $m(\epsilon, x) = x$
    - $m(x, \epsilon) = x$
    - m(x, m(y, z)) = m(m(x, y), z)

### Algebraic Structure of Monoids

- A monoid  $(T, \epsilon, \circ)$  can be viewed as an algebraic structure, where
  - Carrier: *T*
  - Operations:
    - *ε*:0
    - *m* : 2
  - Equations:
    - $\{x\} \vdash m(\epsilon, x) = x$
    - $\{x\} \vdash m(x, \epsilon) = x$
    - $\{x, y, z\} \vdash m(x, m(y, z)) = m(m(x, y), z)$

### Algebraic Theory

- A theory contains
  - the signature of operators (names and types)
  - the equations
  - the carrier is NOT to be specified here (it's abstract!)

Algebraic Theory (first-order finitary)

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Algebraic Theory of Monoid

- Operations:
  - *ε*:0
  - *m* : 2
- Equations:
  - $\{x\} \vdash m(\epsilon, x) = x$
  - $\{x\} \vdash m(x, \epsilon) = x$
  - $\{x, y, z\} \vdash m(x, m(y, z)) = m(m(x, y), z)$

## Algebraic Theory & Models

- A model of the theory:
  - a definition of the support and of the operations that satisfies the equations.
  - Alternatively, is an interpretation of the signature  $\Sigma_T$  which validates all the equations under some carrier
- We refer to a model of theory **T** as a **T-model** or a **T-algebra**.
- Example models for theory of monoids:
  - (ℕ,0,+),
  - $(\mathbb{R}, 1, \times)$ ,
  - $(T \rightarrow T, id, \circ)$

### Free Monoid

• Given a set (an "alphabet") **A**,

the free monoid over  ${\bf A}$  is  $(A^*, \epsilon, \cdot \ )$  , where

- **support:**  $A^*$ , the set of finite lists of **A** ("words over **A**") like  $a_1a_2\cdots a_n$
- identity element  $\epsilon$ : the empty list;
- composition : list concatenation.
- Example: taking  $A = \{1, ..., 9\}$ ,
  - $1 \cdot (23 \cdot 456) = (1 \cdot 23) \cdot 456 = 123456$

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#### Free Models

- Let **T** be an **algebraic theory** and **X** a set.
- A free T-model generated by X is a T-model M and a function
  - $f: X \rightarrow \text{support}(M)$  such that:
- For every other **T-model** M' and function  $f': X \to \operatorname{supp}(M')$ , there exists a unique morphism  $\Phi: M \to M'$  such that the following diagram commutes:

# Free Models of a Theory will Determine a Monad
## Lawvere Theories

- Lawvere's idea: no matter how you present the theory, the same operations should be derivable and satisfy the same equations
- A Lawvere theory bundles derivable operations and their equations into a category.

## Monad-Theory Correspondence and How should we work more

- A monad is:
  - A "computational effect"  $Set \xrightarrow{T} Set$
  - So that T-programs  $A \xrightarrow{f} T(B)$  define the (squiggly) arrows in the category  $Kl_T$
- The opposite of the category of T-programs between finite sets defines a Lawvere theory  $L_T^{op}$ . Conversely, any Lawvere theory L defines a monad  $T_L$  on category of set.
- **Theorem:** The category of Lawvere theories is equivalent to the category of finitary monads on Set.
- **Finitary** monads and (Lawvere theories describe equivalent categorical encodings of universal algebra.

## Moreover if you are interested

Some Readings

Category Theory for Programmers

Sam Lindley's Effect Handler Oriented Programming slides

More to be updated at https://github.com/YunkaiZhang233/effect-reading/ blob/main/README.md



## Thank You!