

Layer by Layer: combining monads

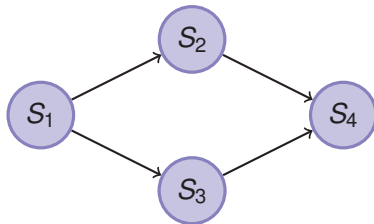
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October 16, 2018

Motivation: ProbNetKAT

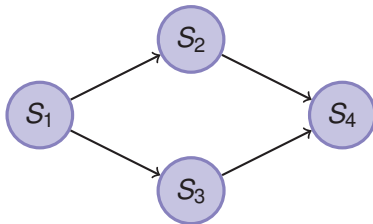
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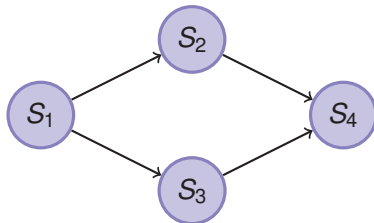


Topology:

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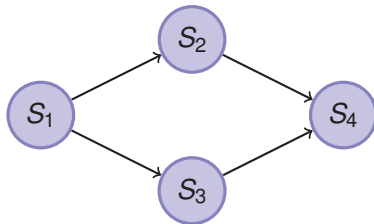
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A packet reaches S_4 : $(t; p)^*; (sw = S_4)$

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- Why? What's going on?
- General question:

How can we add features in a principled and controllable manner?

Building languages layer by layer: shopping list



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■ First layer:

$p ::= \text{skip} \mid p; p \mid a \in \text{At}$

$p; \text{skip} = \text{skip}; p = p, \dots$

Monad: $(-)^*$

Building languages layer by layer: shopping list



■ Second layer:

$p ::= \text{abort} \mid p + p \mid a \in \text{At}$
 $p + \text{abort} = \text{abort} + p = p$,
 $p + q = q + p$, $p + p = p, \dots$
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Building languages layer by layer: shopping list



■ Topping:

$$p ::= p \oplus_r p \mid a \in \text{At}$$

$$p \oplus_r q = q \oplus_{1-r} p, \dots$$

Monad: \mathcal{D}

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- The composition of two monads is not necessarily a monad
- Combine monads S, T via distributive law

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- No distributive law $\mathcal{PD} \rightarrow \mathcal{DP}$
- But there exists a distributive law $(-)^*\mathcal{P} \rightarrow \mathcal{P}(-)^*$
- How do we deal with this systematically?

This paper

A general and modular approach for determining :

- (a) if a monad combination by distributive law is possible;
- (b) if it is not possible, exactly which features are broken by the extension;
and
- (c) suggests a way to fix the composition by modifying one of the monads.

Monads

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- Monads: a categorical way to encode computational effects:
Non-determinism, probabilities, side-effects . . .
- Applications of monads include programming language semantics, automata theory, etc.
- It is convenient to compositionally *combine* several effects.

Definitions

Definition

A Monad (T, η, μ) on a category C is:

- An endofunctor $T : C \rightarrow C$
- A natural transformation $\eta : 1 \rightarrow T$
- A natural transformation $\mu : TT \rightarrow T$

(Verifying some structural properties)

We will consider monads on Set.

Examples

Finite Powerset

$$\mathcal{P}(A) = \{B \mid B \subseteq A, B \text{ finite}\}$$

Free Monoid (List)

$$A^* = \{w_1 \dots w_n \mid n \in \mathbb{N}, w_i \in A\}$$

Distributions

$$\mathcal{D}(A) = \{f \mid f \text{ probability distribution on } A, \\ \text{and } \text{Supp}(f) \text{ finite}\}$$

Algebras

Definition

An *algebra* for the monad T is an object A together with a morphism $\alpha : TA \rightarrow A$.

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Definition

For a signature Σ and a set of equations E we can define a monad T such that $\mathbf{EM}(T) \simeq \mathbf{Alg}(\Sigma, E)$

Examples

	Σ	E
\mathcal{P}	$0, +$	$x+0=0+x=x$ $x+y=y+x$ $(x+y)+z=x+(y+z)$ $x+x=x$ (join-semilattice)
$(-)^*$	$1, ;$	$x;1=1;x=x$ $(x;y);z=x;(y;z)$ (monoid)

S, T monads, $\mathbf{EM}(T) \simeq \mathbf{Alg}(\Sigma_T, E_T)$, $\mathbf{EM}(S) \simeq \mathbf{Alg}(\Sigma_S, E_S)$

Definition

A *distributive law* of T over S is a natural transformation $\lambda : ST \rightarrow TS$
(verifying structural properties)

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Definition

A *distributive law* of T over S is a natural transformation $\lambda : ST \rightarrow TS$ (verifying structural properties)

If T distributes over S , then:

- TS is a monad

$$\begin{array}{ccc}
 X \xrightarrow{\eta_X^T} TX \xrightarrow{\eta_{TX}^S} STX & STSTX \xrightarrow{S\lambda_{TX}} SSTX \xrightarrow{\mu_{TTX}^S} STTX \xrightarrow{S\mu_X^T} STX \\
 \searrow u \nearrow & \searrow m \nearrow
 \end{array}$$

- Operations in Σ_S distribute over those of Σ_T

We call S the *inner layer*, T the *outer layer*.

Remarks and questions:

- Distributive laws are one of the go-to methods to **compose monads**
- Implements a one-way distributivity of algebraic operations
- For two given monads, how to know whether there exists a distributive law?
- How to build it?

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- Define a lifting \hat{T} of T on Σ -algebras

$$(A, \sigma : A^{\text{ar}(\sigma)} \rightarrow A)_{\sigma \in \Sigma} \rightarrow (TA, T\sigma \circ \otimes^{\text{ar}(\sigma)} : (TA)^{\text{ar}(\sigma)} \rightarrow TA)_{\sigma \in \Sigma}$$

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If \hat{T} sends (Σ, E) -algebras to (Σ, E) -algebras, then it defines a distributive law $\lambda : ST \rightarrow TS$.

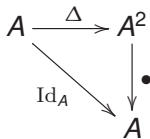
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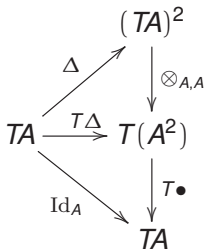
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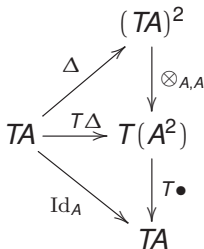
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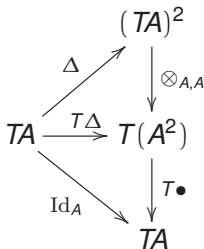
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- If it commutes then $(TA, \hat{\bullet} : (TA)^2 \rightarrow TA) \models x \hat{\bullet} x = x$.
- If it doesn't, we know exactly where the obstacle is and can troubleshoot accordingly.

Application: combining $(-)^*$, \mathcal{P} and \mathcal{D}

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- Completely consistent with the semantics of ProbNetKAT

Theorem

Let T be a commutative, relevant and affine monad. For all u and v , T preserves $u = v$.

Fixing composition – Method 1: changing the inner layer

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$\mathbf{EM}(S) \simeq \mathbf{Alg}(\Sigma_S, E_S)$, $\mathbf{EM}(T) \simeq \mathbf{Alg}(\Sigma_T, E_T)$. Let E'_S be the subset of E_S containing the equations preserved by T .

- Obtain S' from $\mathbf{Alg}(\Sigma_S, E'_S)$
- Compose T with S' , obtain a (Σ, E) algebra, where:

$$\Sigma = (\Sigma_T \cup \Sigma_S)$$

$$E = (E_T \cup E'_S \cup \text{distributivity of } \Sigma_S \text{ over } \Sigma_T)$$

Method 1: fix the inner layer

Example

\mathcal{D} does not preserve idempotency nor distributivity. Drop them and obtain a (Σ, E) algebra where $\Sigma = \{;, 1, +, 0, \oplus_\lambda\}$ and $E =$

- associativity, commutativity, unit laws for $+$
- equations of $(-)^*$
- absorption $p; 0 = 0; p = 0$
- equations of \mathcal{D} (convex algebras)
- $p; (q \oplus_\lambda r) = (p; q) \oplus_\lambda (p; r)$
- $(q \oplus_\lambda r); p = (q; p) \oplus_\lambda (r; p)$
- $p + (q \oplus_\lambda r) = (p + q) \oplus_\lambda (p + r)$
- $(q \oplus_\lambda r) + p = (q + p) \oplus_\lambda (r + p)$

Method 2: Change the outer layer

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Two options to fix \mathcal{PD} :

- 1 Build a monad PD that preserves the relevant equations.
- 2 Replace \mathcal{P} by \mathcal{P}_c and then composition works: $\mathcal{P}_c\mathcal{D}$.

Conclusions

- A principled approach to constructing (equational) languages layer by layer.
- Conditions on existence of distributive laws and potential fixing strategies.
- Note: other troubleshooting strategies are possible!



Thank you! Questions?