



Outline

Measurable Spaces and their Effect Logic

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Introduction & overview
Computation and logic

Effect modules and integration
Effect modules
Integration

Harvest time

Conclusions



Prerequisites

- Basic knowledge of category theory
- Some familiarity with program semantics via **monads**
 - Eg. via the powerset monad \mathcal{P} for **non-determinism**
 - Here also the distribution monad \mathcal{D} and the Giry monad \mathcal{G} , for discrete and continuous **probabilistic** computation
- Also, basic knowledge of **measure theory & integration**



Main point



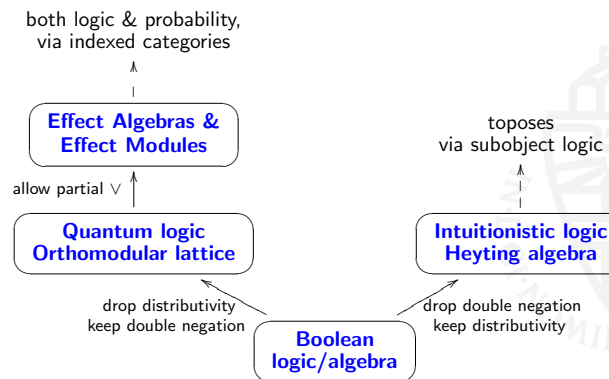
**Take home message*

Algebraic logic for probabilism/quantum uses **effect modules**

- These structure have been introduced in theoretical physics in the mid-1990s (Foullis, Gudder, ...), for quantum probability
- Here we elaborate the special case of (continuous) probabilistic computation



Where to position “effect modules”

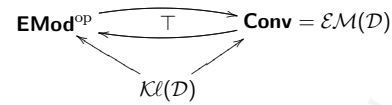


A bird's eye view on non-deterministic computation

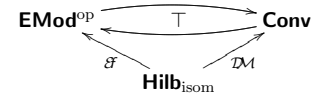
- Semantics of non-deterministic program is given by:
 - relations $R \subseteq X \times Y$, or, more categorically:
 - functions $X \rightarrow \mathcal{P}(Y)$, ie. maps in the **Kleisli category** $\mathcal{Kl}(\mathcal{P})$
- Full & faithful functor “from Kleisli to Eilenberg-Moore”
 - here: $\mathcal{Kl}(\mathcal{P}) \rightarrow \mathcal{EM}(\mathcal{P}) = \mathbf{CL}_V$
 - where \mathbf{CL}_V is complete lattices with join-preserving maps
- According to Dijkstra, each program $s: X \rightarrow \mathcal{P}(Y)$ gives **weakest precondition operation** $\text{wp}(s): \mathcal{P}(Y) \rightarrow \mathcal{P}(X)$
 - Explicitly, $\text{wp}(s)(Q) = \{x \mid s(x) \subseteq Q\}$
 - $\text{wp}(s)$ preserves meets, so is map in \mathbf{CL}_\wedge
- Summary of non-deterministic “logic and computation”

$$\begin{array}{ccc}
 X \xrightarrow{s} \mathcal{P}(Y) & & \\
 \mathcal{P}(X) \xrightarrow{\vee} \mathcal{P}(Y) & & \\
 \mathcal{P}(Y) \xrightarrow{\wedge} \mathcal{P}(X) & & \\
 \text{wp}(s) & & \\
 \hline
 \mathbf{CL}_\wedge^{\text{op}} & \xrightarrow{\cong} & \mathbf{CL}_V = \mathcal{EM}(\mathcal{P}) \\
 & \swarrow & \searrow \\
 & \mathcal{Kl}(\mathcal{P}) &
 \end{array}$$

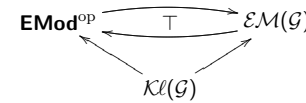
- For *discrete probability*:



- For *quantum*, the D'Hondt-Panangaden program logic is captured by:



There is also such a “states-and-effects” triangle for *continuous probability*, via the Giry monad \mathcal{G} :



This gives categorical reformulation of *Kozen's duality*.

We need to spend quite some time on the various structures involved.

Effect algebras generalise the unit interval $[0, 1]$ with its (partial!) addition $+$ and “negation” $x \mapsto 1 - x$.

A **Partial Commutative Monoid (PCM)** consists of a set M with zero $0 \in M$ and partial operation $\odot: M \times M \rightarrow M$, which is suitably commutative and associative. One writes $x \perp y$ if $x \odot y$ is defined.

An **effect algebra** is a PCM in which each element x has a unique ‘orthosupplement’ x^\perp with $x \odot x^\perp = 1 (= 0^\perp)$. Additionally, $x \perp 1 \Rightarrow x = 0$ must hold.

- Projections / closed subspaces** on a Hilbert space form an effect algebra; P^\perp is orthocomplement: $\langle x | y \rangle = 0$ for all $x \in P, y \in P^\perp$
- Orthomodular lattices** are effect algebras, with \odot as join $x \vee y$ only for elements with $x \perp y$, i.e. $x \leq y^\perp$
- Each **Boolean algebra** is an effect algebra: it is a distributive orthomodular lattice, in which $x \perp y$ iff $x \wedge y = 0$. In particular, the Boolean algebra of measurable subsets of a measure space forms an effect algebra, where $U \odot V$ is defined if $U \cap V = \emptyset$, and is then equal to $U \cup V$.

- Each effect algebra is a **partial order**, via $x \leq y$ iff $y = x \odot z$, for some z .
- One speaks of a σ -effect algebra if countable joins (wrt. \leq) exist.
- Examples are $[0, 1]$, but also measurable subsets $\Sigma_X \subseteq \mathcal{P}(X)$, wrt. a measurable space (X, Σ_X) .

DEFINITION

A homomorphism of effect algebras $f: X \rightarrow Y$ satisfies:

- $f(1) = 1$
- if $x \perp x'$ then both $f(x) \perp f(x')$ and $f(x \odot x') = f(x) \odot f(x')$.

This yields a category **EA** of effect algebras.

The subcategory $\sigma\text{-EA} \hookrightarrow \text{EA}$ contains σ -algebras with maps also preserving countable joins.

Examples:

- There is a functor $\text{Meas}^{\text{op}} \rightarrow \sigma\text{-EA}$, via $(A, \Sigma_X) \mapsto \Sigma_X$
- A **probability measure** is a map $\Sigma_X \rightarrow [0, 1]$ in $\sigma\text{-EA}$.



Effect modules

Effect modules are effect algebras with a **scalar multiplication**, with scalars not from \mathbb{R} or \mathbb{C} , but from $[0, 1]$.

DEFINITION

A (σ -)effect module M is a (σ -)effect algebra with an action $[0, 1] \times M \rightarrow M$ that is a "bihomomorphism"

A **map of effect modules** is a map of effect algebras that commutes with scalar multiplication.

We get a category **EMod**, with subcategory σ -EMod \hookrightarrow EMod.

Here we always assume " σ " and drop it for convenience.



Probability measures and predices

For a measurable space $X = (X, \Sigma_X)$ we define:

$$\mathcal{G}(X) = \{\phi: \Sigma_X \rightarrow [0, 1] \mid \phi \text{ is a probability measure}\}$$

$$\begin{aligned} \text{Pred}(X) &= \text{Meas}(X, [0, 1]) \\ &= \{p: X \rightarrow [0, 1] \mid p \text{ is a measurable function}\}. \end{aligned}$$

Functoriality

- $\mathcal{G}(X)$ is a measurable space again, giving a functor $\mathcal{G}: \text{Meas} \rightarrow \text{Meas}$
- $\text{Pred}(X)$ is an **effect module**, via operations inherited pointwise from $[0, 1]$, giving $\text{Pred}: \text{Meas} \rightarrow \text{EMod}^{\text{op}}$



Integration in logic and computation

For $f: X \rightarrow \mathcal{G}(Y)$ in **Meas** we define:

- Kleisli extension** $f^\natural: \mathcal{G}(X) \rightarrow \mathcal{G}(Y)$ in **Meas**

$$f^\natural(\phi) = \lambda N \in \Sigma_Y. \int (\lambda x. f(x)(N)) d\phi$$

- Substitution** $f^*: \text{Pred}(Y) \rightarrow \text{Pred}(X)$ in **EMod**

$$f^*(q) = \lambda x \in X. \int q df(x)$$

Now: Fundamental Galois-style relation between the two

$$\int f^*(q) d\phi = \int q df^\natural(\phi)$$



Effect modules, main examples

Probabilistic examples

- Fuzzy predicates** $[0, 1]^X$ on a set X , with scalar multiplication $r \cdot p \stackrel{\text{def}}{=} \lambda x \in X. r \cdot p(x)$.
- Measurable predicates** $\text{Hom}(X, [0, 1])$, for a measurable space X , with the same scalar multiplication.

Quantum examples

- Effects** $\mathcal{E}(H)$ on a Hilbert space: operators $A: H \rightarrow H$ satisfying $0 \leq A \leq I$, with scalar multiplication $(r, A) \mapsto rA$.
- Effects** in a C^* -algebra A : positive elements below the unit: $[0, 1]_A = \{a \in A \mid 0 \leq a \leq 1\}$.

This one covers the previous three illustrations.



Lebesgue integration

- Lebesgue integration** yields for $\phi \in \mathcal{G}(X)$ and $p \in \text{Pred}(X)$,

$$\int p d\phi \in [0, 1]$$

- It is defined, in standard manner:
 - on **indicator functions** as $\int \mathbf{1}_M d\phi = \phi(M)$
 - then extended linearly to **step functions** $\sum_i s_i \mathbf{1}_{M_i}$
 - and extended to arbitrary predicates via limits

Integration is a map of effect modules

$p \mapsto \int p d\phi$ is a map $\text{Pred}(X) \rightarrow [0, 1]$ in **EMod**



Predicate logic, categorically

- (Giry 1982) \mathcal{G} is a monad
- Taking predicates yields a functor ("indexed category")

$$\mathcal{K}\mathcal{L}(\mathcal{G}) \xrightarrow{\text{Pred}} \text{EMod}^{\text{op}}$$

On arrows it is given by substitution



Alternatives, for Giry and predicates

Integration yields two isomorphisms:

$$\mathcal{G}(X) \cong \mathbf{EMod}(Pred(X), [0, 1])$$

$$\phi \mapsto \lambda p. \int p \, d\phi$$

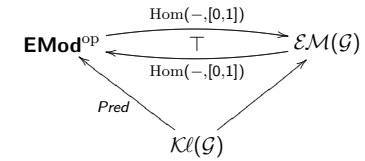
And similarly:

$$Pred(X) \cong \mathcal{EM}(\mathcal{G})(\mathcal{G}(X), [0, 1])$$

$$p \mapsto \lambda \phi. \int p \, d\phi$$

Note: we are “homming into $[0, 1]$ ”. This suggests a **duality**

The full picture



We have recovered **Kozen's** (1981) version for \mathcal{G} of Dijkstra for \mathcal{P} :

<u>$X \longrightarrow \mathcal{G}(Y)$</u>	probabilistic computations as Kleisli maps
<u>$\mathcal{G}(X) \longrightarrow \mathcal{G}(Y)$</u>	computations as algebra maps
<u>$Pred(Y) \longrightarrow Pred(X)$</u>	weakest precondition as effect module maps



Main points

Using **effect modules** we have a clean redescription of

- Lebesgue integration and the Giry monad
- Probabilistic predicates and substitution
- Kozen's duality, via state-and-effect triangles:



Also, we've put **continuous** probabilistic computation in this general framework, that also applies to quantum computation