# An Effect-Theoretic Account of Lebesgue Integration

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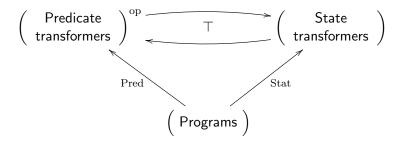
Radboud University Nijmegen

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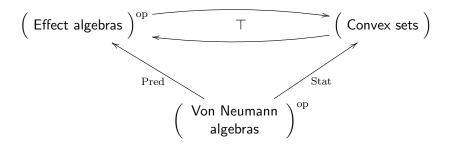
## Some locals



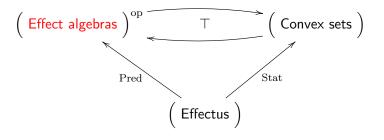
# Our usual business: categorical program semantics



# Our usual business: semantics of quantum programs



# Our usual business: effectus theory



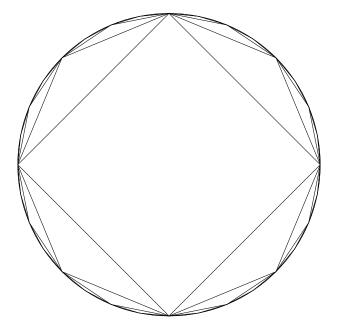


#### Some related work

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\* of integration of [0,1]-valued functions with respect to probability measures ( $\approx [0,1]$ -valued measures)



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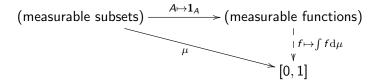
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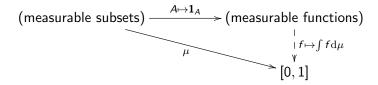
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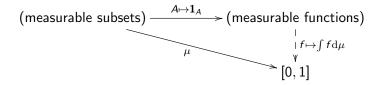
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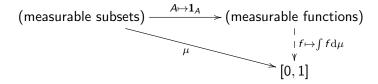
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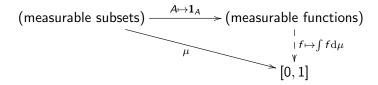
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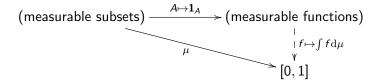
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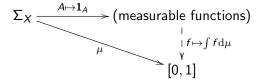
- 1. [0, 1]
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- 4.  $\sigma$ -algebra on  $X = \text{sub-}(\omega\text{-complete EA})$  of  $\wp(X)$ !



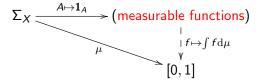
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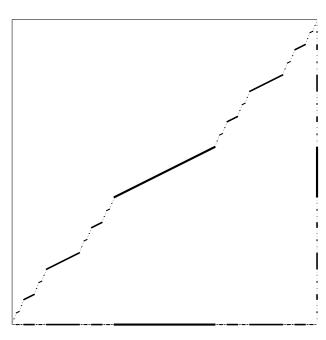
#### Measurable functions

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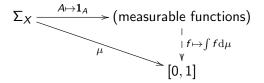
A map  $f: X \rightarrow [0,1]$  is **measurable** if

$$f^{-1}([a,b]) \in \Sigma_X$$
 for all  $a \le b$  in  $[0,1]$ 

$$\operatorname{Meas}(X,[0,1]) = \{ f: X \rightarrow [0,1]: f \text{ is measurable } \}$$

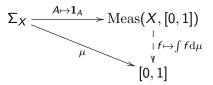


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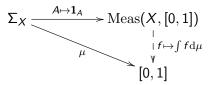
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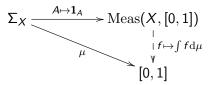
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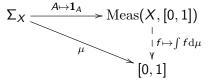
- 1.  $\mathbf{1}_{(-)} \colon \Sigma_X \longrightarrow \operatorname{Meas}(X, [0, 1])$
- 2. homomorphisms of  $\omega$ -complete EA  $\mu \colon \Sigma_X \to [0,1]$  = probability measures on X (!)

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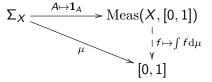
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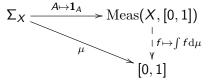
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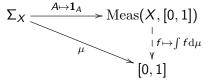
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A homomorphism of effect modules is what you expect

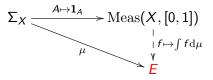
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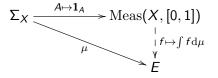
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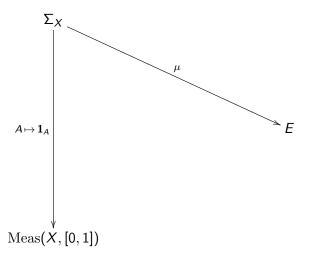
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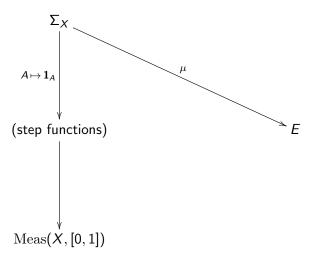
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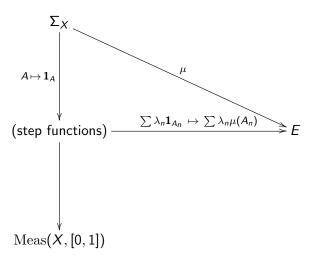


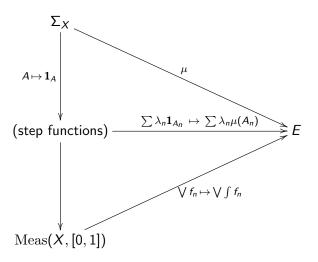
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**Conclusion:** Meas(X, [0, 1]) is the free  $\omega$ -complete effect module over  $\Sigma_X$  via  $A \mapsto \mathbf{1}_A$ .









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**Motto**: effects behave somewhat like measurable functions; the integral  $\int (-)d\phi \colon \operatorname{Meas}(X,[0,1]) \to \mathcal{E}f(\mathcal{H})$  translates.

### Recap and outlook

#### You have seen:

- 1. Lebesgue integration and effect algebras.
- 2. A universal property of the extension of measure to integral.

#### Agenda:

- 1. Fubini's Theorem
- 2. Carathéodory's Extension Theorem
- 3. Gleason's Theorem