

A stratified pointfree definition of probability via constructive natural density

Samuele Maschio



UNIVERSITÀ
DEGLI STUDI
DI PADOVA

Dipartimento di Matematica
Università di Padova

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Kolmogorov's probability became the standard notion
but it is **not informative** about the assignment of probability.

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- 3 There exists a unique extension of \mathbb{P} to $\sigma(\mathcal{R}) = \mathcal{B}(\mathbb{R}) \subseteq \mathcal{P}(\mathbb{R})$.

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We try to develop this idea in a constructive framework

Minimalist Foundation (+ AC!)

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then $\Phi(e) \circ \gamma$ and $\Phi(e') \circ \gamma'$ are equal Bishop reals.
- ③ $\mathbb{P}(e, \gamma) := \Phi(e) \circ \gamma$ is a well-defined operation
from actual events to Bishop reals.

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Or...

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