Non-commutative disintegrations and regular conditional probabilities

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Deterministic and nondeterministic processes

2 Stochastic matrices

- Standard definitions
- The category of stochastic maps

3 Classical disintegrations

- Classical disintegrations: intuition
- Diagrammatic disintegrations
- Classical disintegrations exist and are unique a.e.

Quantum disintegrations

- Completely positive maps and *-homomorphisms
- Non-commutative disintegrations
- Existence and uniqueness
- Applications and Examples

Category theory as a theory of processes

Processes can be deterministic or non-deterministic



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Processes can be deterministic or non-deterministic



The Kleisli category associated to a monad is one way to distinguish between two such kinds of morphisms.

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Goal for non-commutative regular conditional probabilities

Our goal will be to formulate concepts in probability theory categorically. This will enable us to abstract these concepts to contexts beyond their initial domain. We will focus our attention on quantum probability.



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Stochastic maps: "if y then x" probabilistic statements

Let X and Y be finite sets. A <u>stochastic map</u> $r: Y \longrightarrow X$ assigns a probability measure on X to every point in Y. It is a function whose value at a point "spreads out" over the codomain.

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The value $r_y(x)$ of r_y at x is denoted by r_{xy} . Since r_y is a probability measure, $r_{xy} \ge 0$ for all x and y. Also, $\sum_{x \in X} r_{xy} = 1$ for all y.

Stochastic maps from functions: "if x then y" statements

A function $f: X \to Y$ induces a stochastic map $f: X \dashrightarrow Y$ via



 $f_{vx} := \delta_{vf(x)}$

where $\delta_{yy'}$ is the Kronecker delta and equals 1 if and only if y = y' and is zero otherwise.

The <u>composition</u> $\nu \circ \mu : X \longrightarrow Z$ of $\mu : X \longrightarrow Y$ followed by $\nu : Y \longrightarrow Z$ is defined by matrix multiplication

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u \circ \mu)_{\mathsf{zx}} := \sum_{\mathsf{y} \in \mathsf{Y}}
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• A probability measure μ on X can be viewed as a stochastic map $\mu : \{\bullet\} \longrightarrow X$ from a single element set.

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- If f : X → Y is a function, the composition f ∘ μ : {●} → Y is the pushforward of μ along f.
- If f : X → Y is a stochastic map, the composition f ∘ μ : {●} → Y is a generalization of the pushforward of a measure. The measure f ∘ μ on Y is given by (f ∘ μ)(y) = ∑_{x∈X} f_{y×}μ(x) for each y ∈ Y.

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Stochastic maps and their compositions form a category

Composition of stochastic maps is associative and the identity function on any set acts as the identity morphism.

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Thus, a commutative diagram of the form



says that μ is a probability measure on X and its pushforward to Y along f is the probability measure ν .

A disintegration is a stochastic section

Let X and Y be finite sets equipped with probability measures. Gromov pictures a measure-preserving function $f : X \to Y$ in terms of water droplets. f combines the water droplets and their volume (probabilities) add when they combine under f.



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Disintegrations: diagrammatic definition

Definition

Let (X, μ) and (Y, ν) be probability spaces and let $f : X \to Y$ be a function such that the diagram on the right commutes.



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A <u>disintegration</u> of (f, μ, ν) is a stochastic map $Y \xrightarrow{r} X$ such that



the latter diagram signifying commutativity ν -a.e.

A disintegration is also called a <u>regular conditional probability</u> and an <u>optimal hypothesis</u>.

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Question: Where do disintegrations show up?

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Furthermore, for any other g' satisfying these two conditions, g = g'.

Proof.

Take g to be the composition $Y \xrightarrow{h} X \times Y \xrightarrow{\pi_X} X$.

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Objects: Finite-dimensional C*-algebras

 Let M_n(ℂ) denote the set of complex n × n matrices. It is an example of a C*-algebra: we can add and multiply n × n matrices, the operator norm gives a norm, and A* is the conjugate transpose of A.

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- Every finite-dimensional C*-algebra is (C*-algebraically isomorphic to) a direct sum of matrix algebras.
- In particular, C^X, functions from a finite set X to C, is a commutative C*-algebra (it is isomorphic to C ⊕ · · · ⊕ C). A basis for this algebra as a vector space is {e_x}_{x∈X} defined by e_x(x') := δ_{xx'}.

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- Every (unital) <u>*-homomorphism</u> $F : \mathcal{M}_n(\mathbb{C}) \to \mathcal{M}_m(\mathbb{C})$ is of the form

$$F(A) = U \begin{bmatrix} A & & 0 \\ & \ddots & \\ 0 & & A \end{bmatrix} U^*,$$

where U is unitary. In particular m = np for some $p \in \mathbb{N}$.

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For every CPU map ω : M_n(ℂ) → ℂ (called a <u>state</u>), there exists a unique n × n positive matrix ρ such that tr(ρ) = 1 and tr(ρA) = ω(A) for all A ∈ M_n(ℂ). ρ is called a <u>density matrix</u>.

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- For every CPU map ω : C^X → C (also called a <u>state</u>), there exists a unique probability measure p : {●} → X such that ω(φ) = ∑_{x∈X} p_xφ(x) for all φ ∈ C^X. We write this state as ⟨p, · ⟩.

From finite sets to finite-dimensional C^* -algebras

There is a (contravariant) fully faithful functor from finite sets and stochastic maps to finite-dimensional C^* -algebras and CPU maps.

category theory	classical/	quantum/	physics/
	commutative	noncommutative	interpretation
object	set		phase space
		C^* -algebra	observables
ightarrow morphism	function	*-homomorphism	deterministic
			process
\rightsquigarrow morphism	stochastic	CPU map	non-deterministic
	map		process
monoidal	cartesian	tensor	combining
product	product $ imes$	product \otimes	systems
→>> to/from	probability	C*-algebra state/	physical state
monoidal unit	measure	density matrix	physical state

Non-commutative disintegrations

Definition (P-Russo)

Let (\mathcal{A}, ω) and (\mathcal{B}, ξ) be C^* -algebras equipped with states. Let $F : \mathcal{B} \to \mathcal{A}$ be a *-homomorphism such that the diagram on the right commutes.



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Fix $n, p \in \mathbb{N}$. Let



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be a commutative diagram with F the *-homomorphism given by the block diagonal inclusion $F(A) = \operatorname{diag}(A, \ldots, A)$. A disintegration of ω over ξ consistent with F exists **if and only if** there exists a density matrix $\tau \in \mathcal{M}_p(\mathbb{C})$ such that $\rho = \tau \otimes \sigma$.

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Example 1: Einstein-Podolsky-Rosen



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$$\rho := \frac{1}{2} \begin{bmatrix} 0 & 0 & 0 & 0 \\ 0 & 1 & -1 & 0 \\ 0 & -1 & 1 & 0 \\ 0 & 0 & 0 & 0 \end{bmatrix} \qquad \& \qquad \sigma := \frac{1}{2} \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}.$$
and let $F : \mathcal{M}_2(\mathbb{C}) \to \mathcal{M}_4(\mathbb{C})$ be the diagonal map. Then
 $\operatorname{tr}(\sigma A) = \operatorname{tr}(\rho F(A))$ for all A but there does not exist a disintegration of ρ
over σ consistent with F .

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$$\operatorname{tr}(\sigma A) = \operatorname{tr}(\rho F(A)) \text{ for all } A \text{ but there does not exist a disintegration of } \rho$$
over σ consistent with F .

Proof.

 ρ is entangled (not separable) and therefore cannot be expressed as the tensor product of any two 2 \times 2 density matrices.

Example 2: Diagonal density matrices

Theorem (P–Russo)

Fix $p_1, p_2, p_3, p_4 \ge 0$ with $p_1 + p_2 + p_3 + p_4 = 1$, $p_1 + p_3 > 0$, and $p_2 + p_4 > 0$. Let

$$\rho = \begin{bmatrix} p_1 & 0 & 0 & 0 \\ 0 & p_2 & 0 & 0 \\ 0 & 0 & p_3 & 0 \\ 0 & 0 & 0 & p_4 \end{bmatrix} \qquad \& \qquad \sigma = \begin{bmatrix} p_1 + p_3 & 0 \\ 0 & p_2 + p_4 \end{bmatrix}$$

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 $p_1p_4 = p_2p_3.$

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and let $\omega = \operatorname{tr}(\rho \cdot) : \mathcal{M}_m(\mathbb{C}) \leadsto \mathbb{C}$ be a state with $\langle q, \cdot \rangle := \omega \circ F$ the induced state on $\mathbb{C}^{\sigma(A)}$.

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$$\rho = \sum_{\lambda \in \sigma(A)} P_{\lambda} \rho P_{\lambda},$$

where the right-hand-side is called the <u>Lüders projection</u> of ρ with respect to the measurement of A.

Example 4: A "no-go" theorem for pure to mixed states

There are no disintegrations for evolving pure states to mixed states (a state is *pure* iff it is an extreme point of the convex set of states).

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Theorem (P–Russo)

Given a commutative diagram



of CPU maps with ρ pure, if a disintegration exists, then σ must necessarily be pure as well.

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Thank you

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Thank you for your attention!