## Sheaves of Probability



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## Credences represented by a probabilities



Our credences are represented by a probability measure $P$ on a "state space," e.g. $X=\{a, b, c, d, e, f, g, h, i, j\}$.

## Conditionalization




## Gradually accumulating evidence narrows down state space



## Do we actually accumulate evidence monotonically?

Show of hands:

- How many of you can no longer remember something you're sure you used to know?


## Overlapping sets of evidence



## Generalized Conditionalization

Quitting
Certainties
A Bayesian Framework
Modeling Degrees of Belief

MICHAEL G. TITELBAUM


Titelbaum's notion of consistency among a collection of different agents' credences:

## Definition (Generalized Conditionalization)

Let $X$ be a state space, and let $P_{i}$ be probability measures on subsets $A_{i} \subseteq X$. We say that the $P_{i}$ satisfy generalized conditionalization (GC) if for each pair of agents $i, j$ we have

$$
\left.P_{i}\right|_{A_{i} \cap A_{j}}=P_{j} \mid A_{i} \cap A_{j} .
$$

Essentially, do the $P_{i}$ agree where they overlap?

## Example credences satisfying GC



## A common prior





## Sheaves

If probability measures $P_{i}$ on $A_{i}$ satisfying GC (namely, $\left.P_{i}\right|_{A_{i} \cap A_{j}}=\left.P_{j}\right|_{A_{i} \cap A_{j}}$ ) always uniquely determine a "common prior" $P$ on $\bigcup_{i} A_{i}$ with $\left.P\right|_{A_{i}}=P_{i}$, it would mean that probability measures form a sheaf. Do they?

## Sheaves

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Answer: No!

## GC credences with no common prior

|  | $a$ | $b$ | $c$ |
| :---: | :---: | :---: | :---: |
| $P_{1}$ | $40 \%$ | $60 \%$ |  |
| $P_{2}$ |  | $40 \%$ | $60 \%$ |
| $P_{3}$ | $60 \%$ |  | $40 \%$ |

These have no common prior $P$ : we would need to have

$$
P(a)<P(b)<P(c)<P(a) .
$$

They're also "logically inconsistent" in the sense that together, the three agents have learned evidence that rules out all three possible states.

## Verifying GC

|  | $a$ | $b$ |
| :---: | :---: | :---: |
| $P_{1}$ | $40 \%$ | $60 \%$ |



## Verifying GC



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## Three notions of compatibility

(1) GC (Generalized Conditionalization): Do the probability measures agree on their overlaps?
(2) CP (Common Prior): Is each probability measure the restriction of a single prior distribution?
(3) LC (Logical Consistency): Do the probability measures all overlap nontrivially?
We have seen an example where GC holds but CP and LC do not.

## $\mathrm{LC} \Longrightarrow(\mathrm{GC} \Longleftrightarrow \mathrm{CP})$

In fact, for logically consistent probabilities, satisfying GC is equivalent to having a common prior!

## Theorem (B—, '24)

Let $X$ be a state space, and for each $i \in\{1, \ldots, n\}$ let $P_{i}$ be a probability measure on $A_{i} \subseteq X$. Suppose that for each $i$, we have $P_{i}\left(\bigcap_{i=1}^{n} A_{i}\right)>0$. Then the following are equivalent:

- For all $i, j \in\{1, \ldots, n\}$, we have $P_{i}\left|A_{i} \cap A_{j}=P_{j}\right|_{A_{i} \cap A_{j}}$.
- There exists a unique probability measure $P$ on $\bigcup_{i=1}^{n} A_{i}$ such that for each $i \in\{1, \ldots, n\}$, we have $\left.P\right|_{A_{i}}=P_{i}$.


## Sheaves of Probability

## Theorem (B—, '24)

Let $X$ be a measurable space, let $E \subseteq X$ be a measurable subset, and let $[E, X]$ be the collection of measurable subsets of $X$ containing $E$, partially ordered by inclusion. Equip $[E, X]$ with the notion of coverage given by finite unions, making it a site. Then the functor

$$
[E, X]^{\mathrm{op}} \rightarrow \text { Set }
$$

sending each subset $A$ to $\{$ probability measures $P$ on $A$ with $P(E)>0\}$, and each inclusion $A \subseteq B$ to the restriction function $\left.P \mapsto P\right|_{A}$, is a sheaf.

## Sketch of Proof

## Proof Sketch.

(1) Scale each $P_{i}$ to an ordinary finite measure $\mu_{i}$ such that $\mu_{i}(E)=1$.
(2) Show that the measures $\mu_{i}$ agree "on the nose" on their overlaps.
(3) Construct a finite measure $\mu$ on $\bigcup_{i=1}^{n} A_{i}$ that agrees with each $\mu_{i}$.
(9) Normalize $\mu$ to give the desired probability measure $P$ on $\bigcup_{i=1}^{n} A_{i}$.

## Thank you!

Questions for further discussion:

- What goes wrong with infinite covers $A_{1}, A_{2}, A_{3}, \ldots$ ?
- Is there some kind of group cohomology lurking in this story?
- Could we consider sheaves on more general categories to account for self-locating uncertainty?


