### Persuasion under Insufficient Reason

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- How to choose among these models?

Bayesian approach



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"Ambiguity" approach



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"The most informed person on the planet" approach



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Principle of insufficient reason



Its modern version called Principle of Maximum Entropy: Among viable hypotheses (models), choose "the one which is maximally noncommittal with regard to missing information." (Jaynes 1957)

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- ▶ Common defense: Variables are context-dependent

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- ▶ to justify the use of the <u>linear</u> persuasion model
- to provide a new justification to simple disclosure rules:
  - ► Fully revealing and completely uninformative
  - Upper and lower censorship

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- ► The principal designs a signal: a random variable  $m \in M = [0, 1]$  that is, possibly, correlated with s.
- ▶ A signal is described by a probability distribution  $\pi(m|s)$

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- 3. Agent observes t and m, and then makes his choice between a = 0 and a = 1.

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  - and the least contradictory to any new data that may appear

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#### Definition

A preference relation  $\succeq$  admits a  $\underbrace{\text{vNM}}$  expected utility representation if there exists a utility function  $U: X \to \mathbb{R}$  such that for each  $p_1, p_2 \in \Delta(X)$ 

$$p_1\succeq p_2$$
 if and only if  $\int_{x\in X}U(x)\mathrm{d}p_1(x)\geq \int_{x\in X}U(x)\mathrm{d}p_2(x).$ 

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#### **Definition**

A preference relation  $\succeq$  admits a <u>lottery comparison representation</u> if there exists a benchmark lottery  $b \in \Delta(X)$  such that for each  $p_1, p_2 \in \Delta(X)$ 

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## Proposition 1

A preference relation  $\succeq$  has a vNM expected utility representation if and only if it has a lottery comparison representation.

Moreover, if a vNM utility U and a benchmark lottery b both represent  $\succeq$ , then there exist  $\alpha \in \mathbb{R}$  and  $\beta > 0$  such that

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• We can now treat U(x) as a probability distribution

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  - H(g,u) = H(g) + H(u)

# Maximum-Entropy Utility

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The maximum-entropy utility in the class of CARA, CRRA, or HARA is risk neutral.

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  - ightharpoonup Persuasion problem is <u>linear</u> because maximum entropy U is linear
  - In a linear problem with uniform distribution, every signal is optimal.

- ► Theorem 2
  - Suppose that Principal applies PIR to
    - ▶ all g(t) with a given mean  $\mu$ .

- fully revealing when  $\mu \geq 1/2$ ,
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#### ► Why?

- Exponential density is either increasing or decreasing
- Fully revealing signal is optimal if the density is increasing
- Completely uninformative signal is optimal if the density is decreasing

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  - Truncated normal density is log-concave or log-convex
  - ► If the density is log-concave (log-convex) then upper (lower) censorship is optimal

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  - What are naturally occurring summary statistics about risk attitude?