

Examples where diversity is beneficial as a secondary goal

- Games of strategy, e.g., “balancing your range” in poker
- Construction of investment portfolios (hedging)
- Evolution (genetic diversity)



The utility of imagining an adversary...

Examples where simplicity is beneficial as a secondary goal

Occam's razor:

"Among competing hypotheses, the one with the fewest assumptions should be selected."

Jaynes' Principle of maximum entropy:

"Given some data, among all hypothetical probability distributions that agree with the data, the one of maximum entropy best represents the current state of knowledge."

The Shannon entropy

If X is a random variable taking values in a finite state space Ω , we define the **Shannon entropy of X** by

$$H(X) := \sum_{x \in \Omega} \mathbb{P}[X = x] \log \frac{1}{\mathbb{P}[X = x]}$$

(with the contention that $0 \log 0 = 0$). Also, we will use “log” for the base-2 logarithm, except when we use it for the natural logarithm...

- If X denotes a random message from some distribution, then the average number of bits needed to communicate (or compress) X is $\approx H(X)$
- English text has between 0.6 and 1.3 bits of entropy per character.

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The **probability mass function of X** is given by $p(x) = \mathbb{P}[X = x]$.
We will also write $H(p)$.

Important fact: H is a **concave** function of p .

$$H(p) := \sum_{x \in \Omega} p(x) \log \frac{1}{p(x)}$$

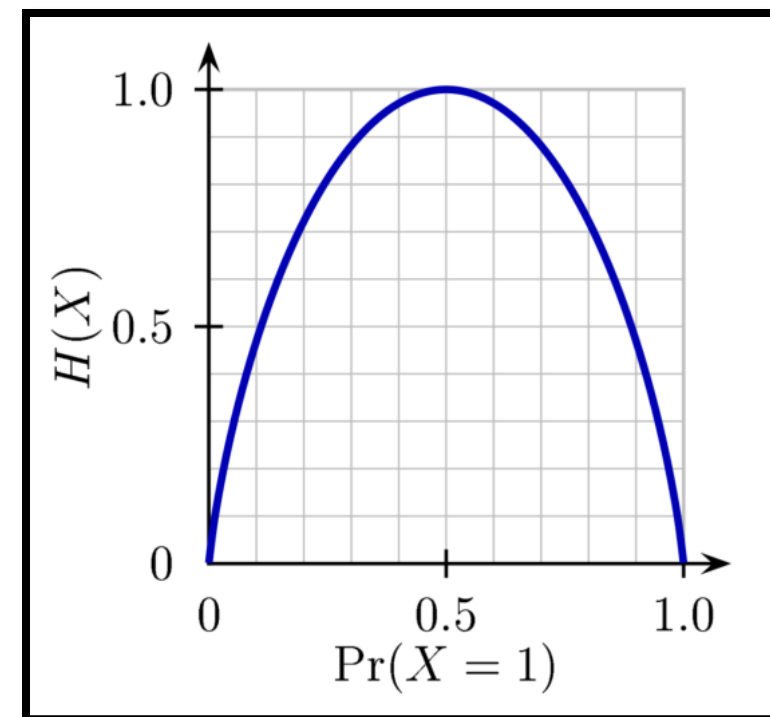
H is a **strictly concave** function of p .

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Outcome of a presidential poll vs. outcome of a fair coin flip



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Suppose there are n possible outcomes $\Omega = \{1, 2, \dots, n\}$.

What's the maximum entropy of X ?

The universe is maximizing entropy



- **Part I:** Entropy to encourage simplicity: Matrix scaling
- **Part II:** Entropy to encourage diversification: Caching and paging