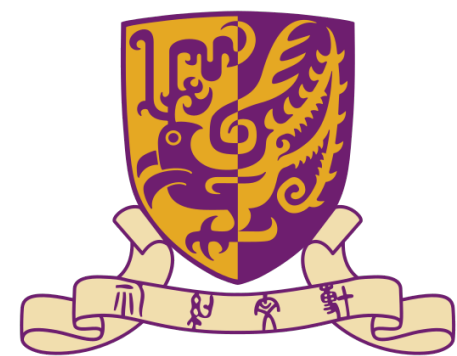


# Intrinsic Robustness of Prophet Inequality to Strategic Reward Signaling

Wei Tang<sup>1</sup>, Haifeng Xu<sup>2</sup>, Ruimin Zhang<sup>2</sup>, Derek Zhu<sup>2</sup>

<sup>1</sup>Chinese University of Hong Kong



香港中文大學  
The Chinese University of Hong Kong

<sup>2</sup>The University of Chicago



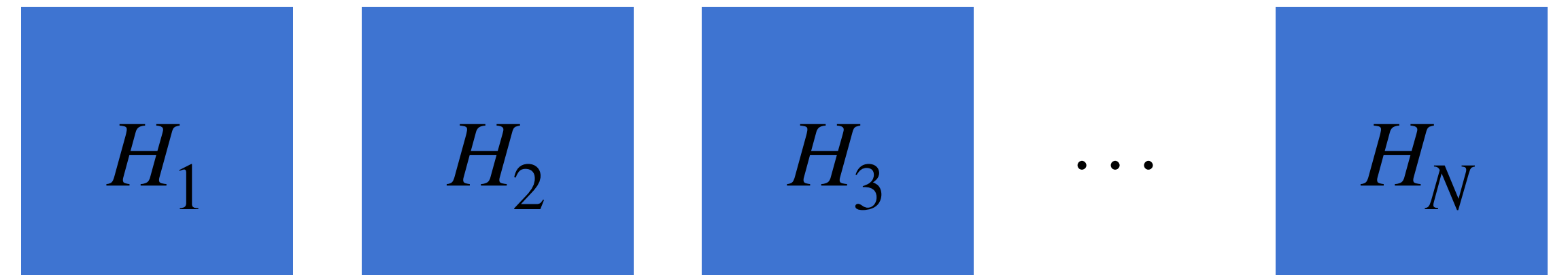
THE UNIVERSITY OF  
CHICAGO

# Prophet Inequality

A gambler's Problem



N boxes containing unknown rewards  $X_i \sim H_i$

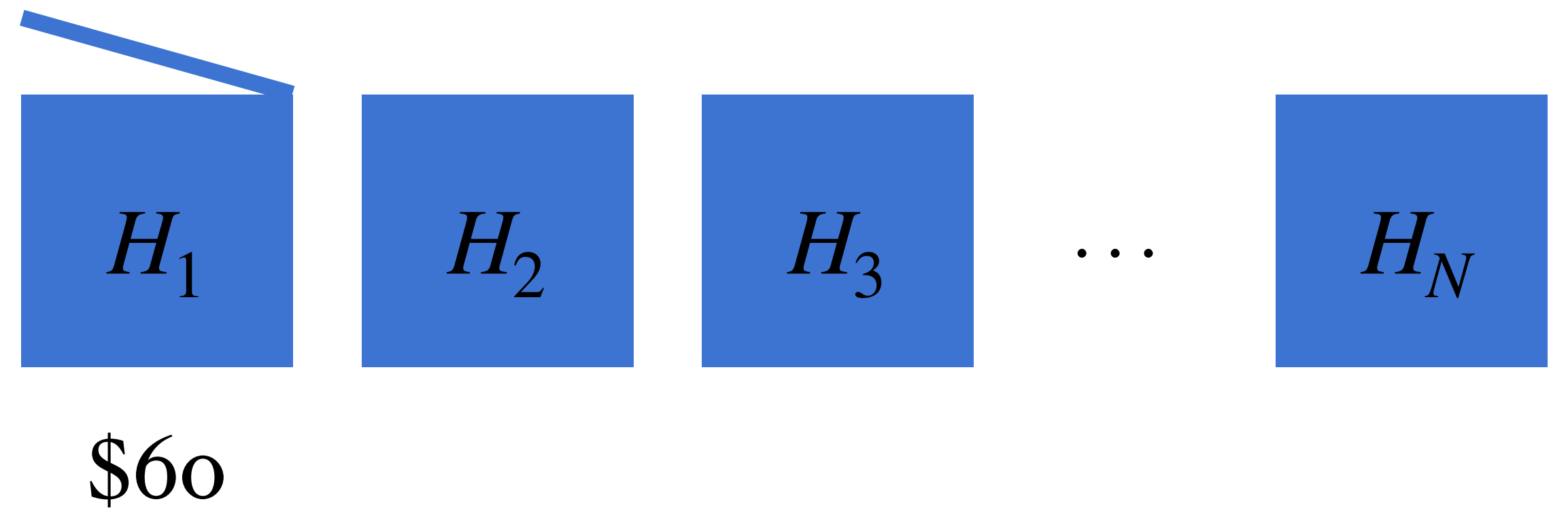


# Prophet Inequality

A gambler's Problem



N boxes containing unknown rewards  $X_i \sim H_i$



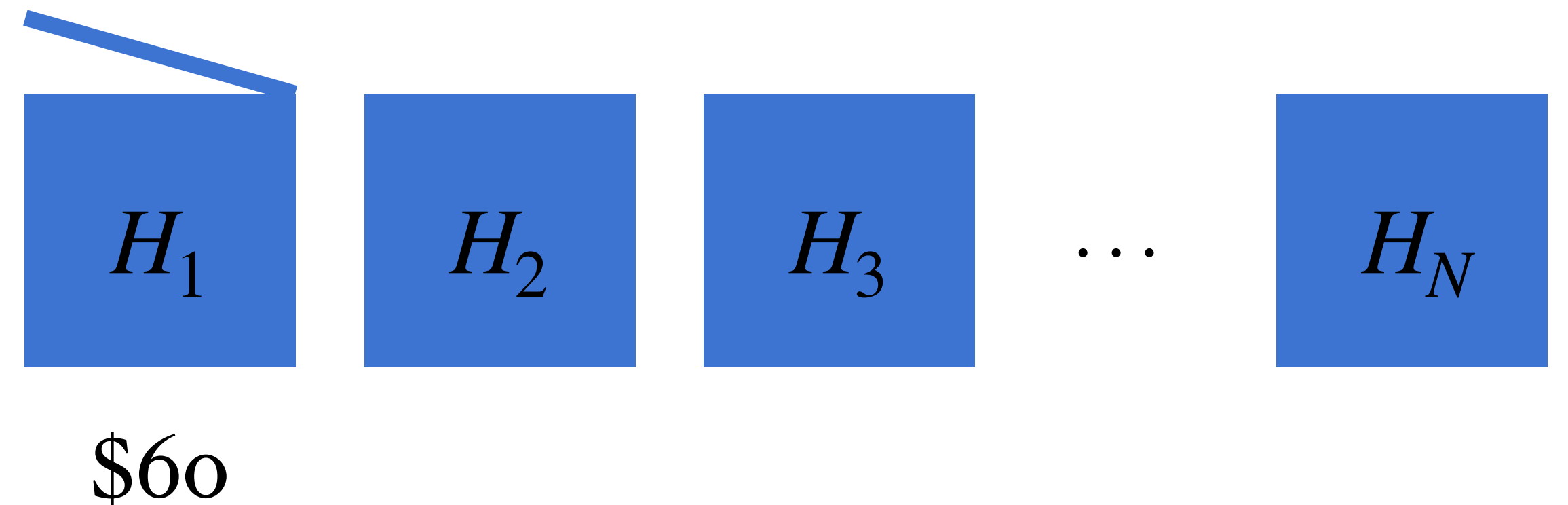


# Prophet Inequality

## A gambler's Problem



N boxes containing unknown rewards  $X_i \sim H_i$



**Stop:** win \$60, and the game ends

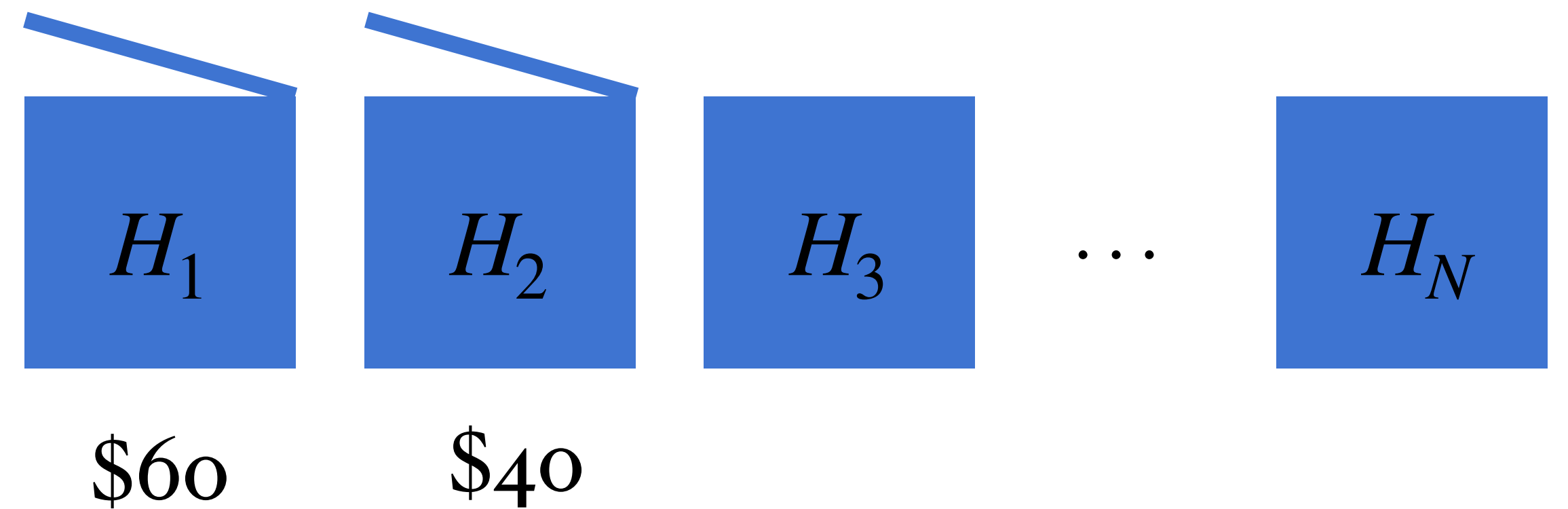
**Continue:** discard \$60, game continues to next box

# Prophet Inequality

## A gambler's Problem



N boxes containing unknown rewards  $X_i \sim H_i$



**Stop:** win \$40, and the game ends

**Continue:** discard \$40, game continues to next box

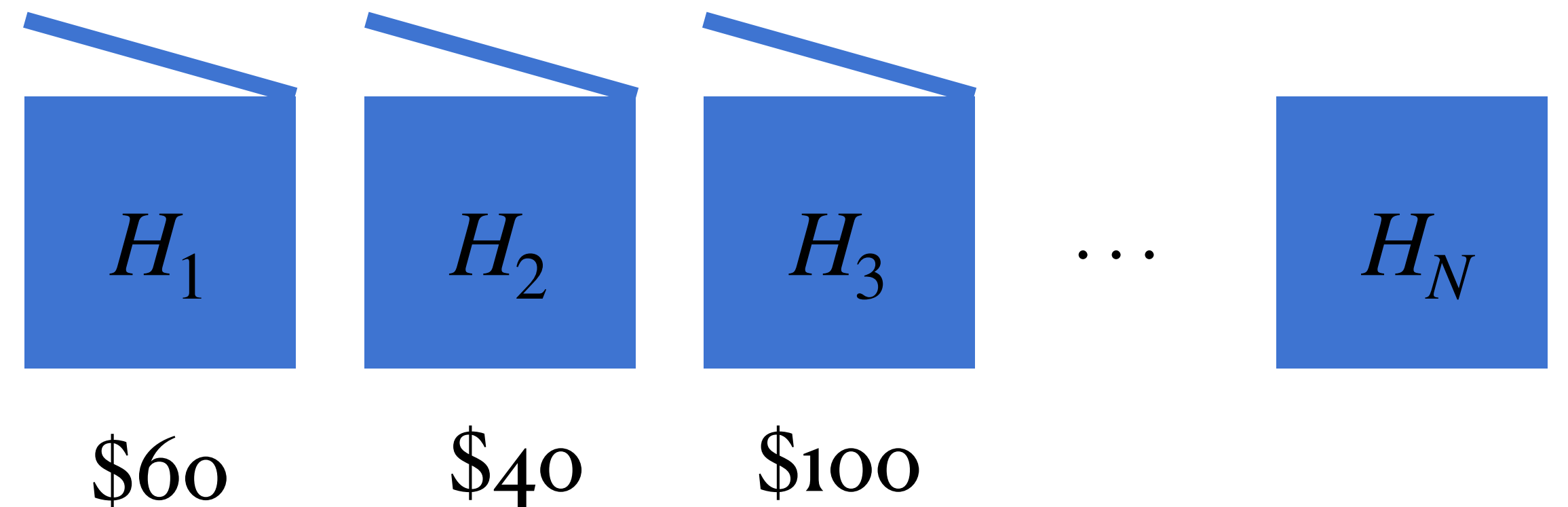


# Prophet Inequality

A gambler's Problem



N boxes containing unknown rewards  $X_i \sim H_i$



**Stop:** win \$100, and the game ends

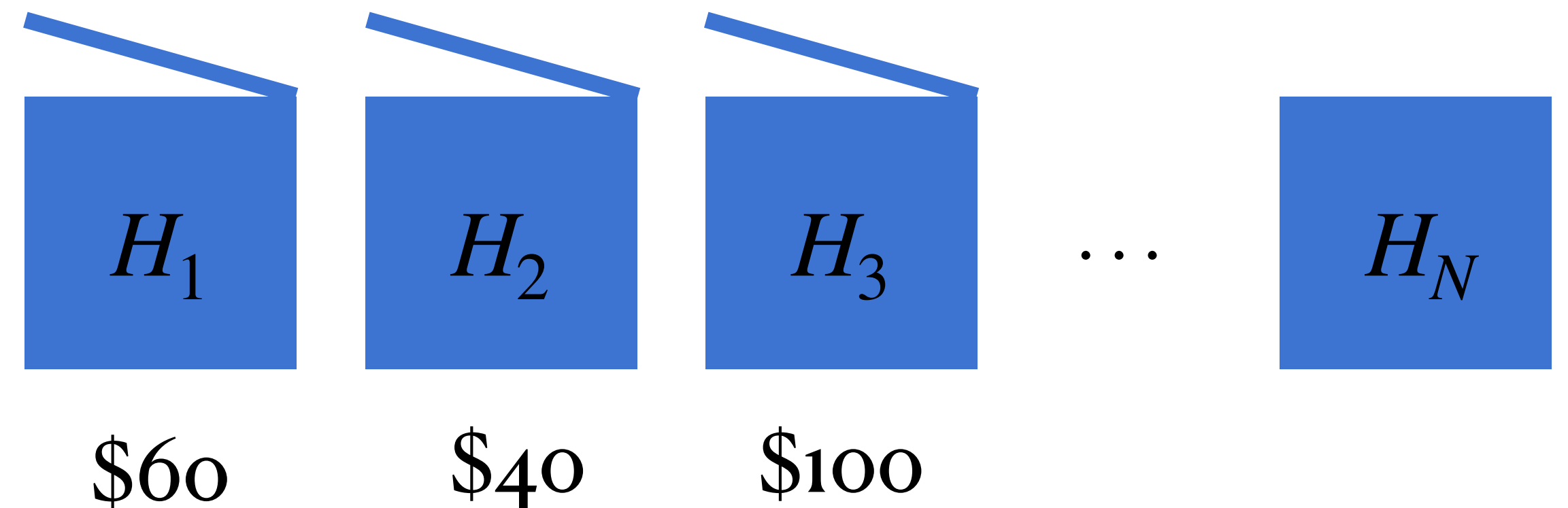
**Continue:** discard \$100, game continues to next box

# Prophet Inequality

A gambler's Problem



$N$  boxes containing unknown rewards  $X_i \sim H_i$



**Stop:** win \$100, and the game ends

**Continue:** discard \$100, game continues to next box

Goal: win as much reward as possible

# Prophet Inequality

- Given  $N$  independent distributions:  $H_1, H_2, \dots, H_N$
- At step  $i$ ,  $X_i \sim H_i$  is revealed
- The **searcher** make irrevocable accept/reject decision for each  $X_i$
- Goal: maximize the accepted value in expectation
- Benchmark: prophet's payoff  $OPT = \mathbb{E}\{\max_i X_i\}$

$$\text{Competitive Ratio} = \max_I \frac{\mathbb{E}_{\text{randomness in } I}[OPT(I)]}{\mathbb{E}_{\text{randomness in } I, \text{ALG}}[ALG(I)]}$$



Theorem [Krengel, Sucheston, Garling '77]: There exist a strategy for the searcher such that

$$\mathbb{E}\{\text{reward}\} \geq \frac{1}{2} \mathbb{E}\{\max_i X_i\}$$

Theorem [Samuel-Cahn '84], [Kleinberg Weinberg 12]: There exist **fixed threshold policies** for the searcher such that

$$\mathbb{E}\{\text{reward}\} \geq \frac{1}{2} \mathbb{E}\{\max_i X_i\}$$

**Tightness of 1/2:**

$$X_1 = 1 \quad \text{w.p.} \quad 1$$

$$X_2 = 0 \quad \text{w.p.} \quad 1 - p$$

$$X_2 = 1/p \quad \text{w.p.} \quad p$$

- Find threshold  $t$  such that  $\Pr(\exists i \text{ with } X_i \geq t) = 1/2$
- Pick the first element that exceeds  $t$
- Alternatively:  $t = 1/2 \cdot \text{OPT}$
- Also: **any  $t$  between these two**

Theorem [Krengel, Sucheston, Garling '77]: There exist a strategy for the searcher such that

$$\mathbb{E}\{\text{reward}\} \geq \frac{1}{2} \mathbb{E}\{\max_i X_i\}$$

Theorem [Samuel-Cahn '84], [Kleinberg Weinberg 12]: There exist **fixed threshold policies** for the searcher such that

$$\mathbb{E}\{\text{reward}\} \geq \frac{1}{2} \mathbb{E}\{\max_i X_i\}$$

**Tightness of 1/2:**

$$X_1 = 1 \quad \text{w.p.} \quad 1$$

$$X_2 = 0 \quad \text{w.p.} \quad 1 - p$$

$$X_2 = 1/p \quad \text{w.p.} \quad p$$

**Robust?**

- Find threshold  $t$  such that  $\Pr(\exists i \text{ with } X_i \geq t) = 1/2$
- Pick the first element that exceeds  $t$
- Alternatively:  $t = 1/2 \cdot \text{OPT}$
- Also: **any  $t$  between these two**

# Prophet Inequality with Strategic Reward Signaling

- Given  $N$  independent distributions:  $H_1, H_2, \dots, H_N$ 
  - Each  $H_i$  is associated with a strategic player  $i$
- At step  $i$ , player  $i$  strategically disclose information about  $X_i \sim H_i$
- The searcher make irrevocable accept/reject decision for each  $X_i$
- Goal: maximize the accepted value in expectation
- Benchmark: prophet's payoff  $\text{OPT} = \mathbb{E} \left\{ \max_i X_i \right\}$



# Robustness

**Definition 1 ( $\alpha$ -robust stopping policy):** A stopping policy  $p$  is  $\alpha$ -robust if

1. It achieves  $\alpha$ -approximation to OPT when players are strategically signaling their rewards
2. It remains a  $1/2$ -approximation in the standard non-strategic setting.

$$\text{OPT} = \mathbb{E}[\max_i X_i] \text{ where } X_i \sim H_i$$

# Player's Optimal Signaling Scheme

**Proposition 1:** Given a threshold stopping policy with threshold  $T$ , for each player  $i$ :

- If  $T \leq \lambda_i$ , then player  $i$ 's optimal information revealing strategy is the **no information strategy**;
- If  $T > \lambda_i$ , then player  $i$ 's optimal information revealing strategy is **threshold signaling** and determined by a cutoff  $t_i$  that satisfies

$$T = \mathbb{E}[X_i | X_i \geq t_i] = \int_{t_i}^{\infty} x dH_i(x) / (1 - H_i(t_i))$$

That is, player  $i$ 's optimal signaling scheme sends one of two signals:

$$X_i \geq t_i \text{ or } X_i < t_i$$

# First Main Result

**Theorem 1:** For any distributions  $H_1, H_2, \dots, H_N$ , a threshold stopping policy with threshold  $T = 1/2 \cdot OPT$  is  $\frac{1 - 1/e}{2}$ -robust, and this is tight among a class of thresholds.



# Second Main Result

achieving 1/2-robustness for special distributions

**Theorem 2:** For IID distributions  $H_1 = H_2 = \dots = H_N$ , a threshold stopping policy with threshold

$$T = \sum_i \mathbb{E}_{H_i}(X_i - T)^+ \text{ is } 1/2\text{-robust, and this is tight.}$$

**Theorem 3:** If  $H_1, H_2, \dots, H_N$  satisfy certain **regularity** assumptions, then a threshold stopping policy with threshold  $T$  that satisfies  $2 \cdot T_{KW} \leq T \leq T_{SC}$  is 1/2-robust

**Thank you!**