

# Risk is reward: Exploiting the environment's risk-reward structures in decisions under uncertainty

Christina Leuker, Timothy J. Pleskac, Thorsten Pachur & Ralph Hertwig  
Center for Adaptive Rationality, Max Planck Institute for Human Development, Berlin  
leuker@mpib-berlin.mpg.de



## 1 INTRODUCTION

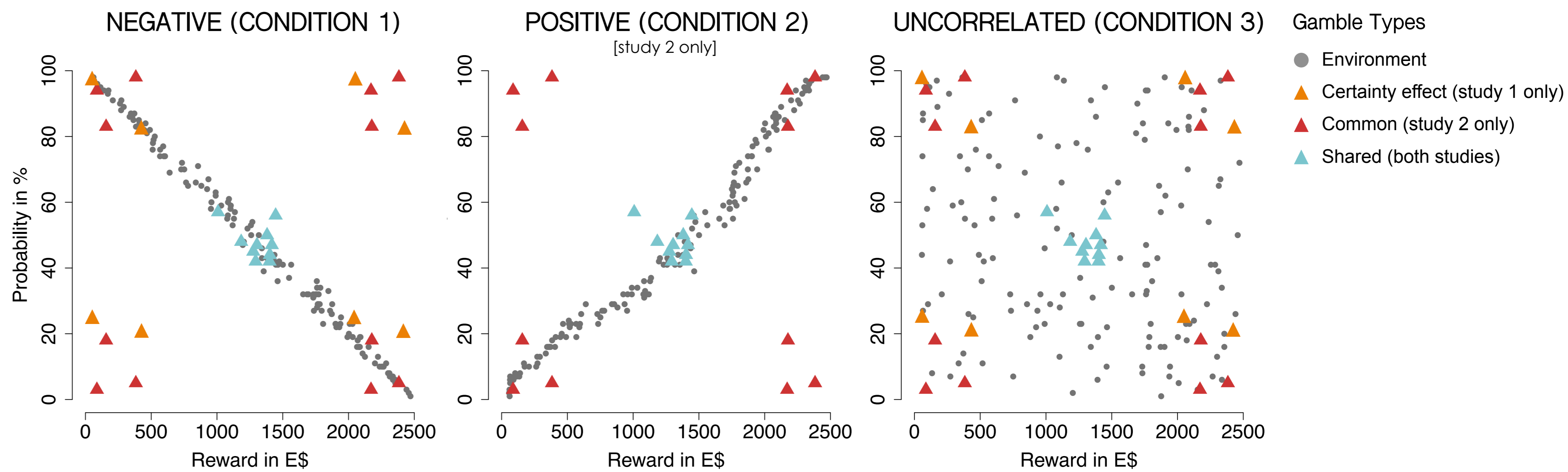
In many domains in the environment, the high rewards that people desire are unlikely to occur<sup>1</sup>. This negative risk-reward relationship seems natural for people to exploit to infer missing probabilities for **uncertain prospects**. At the same time, an adaptive view of cognition implies that people do not blindly apply such a heuristic, but **match** their decision strategies to the **structure of the environment**<sup>2,3,4</sup>.

How do people (1) **adapt** to different risk-reward environments and (2) **use** different risk-reward relationships in decisions under uncertainty?

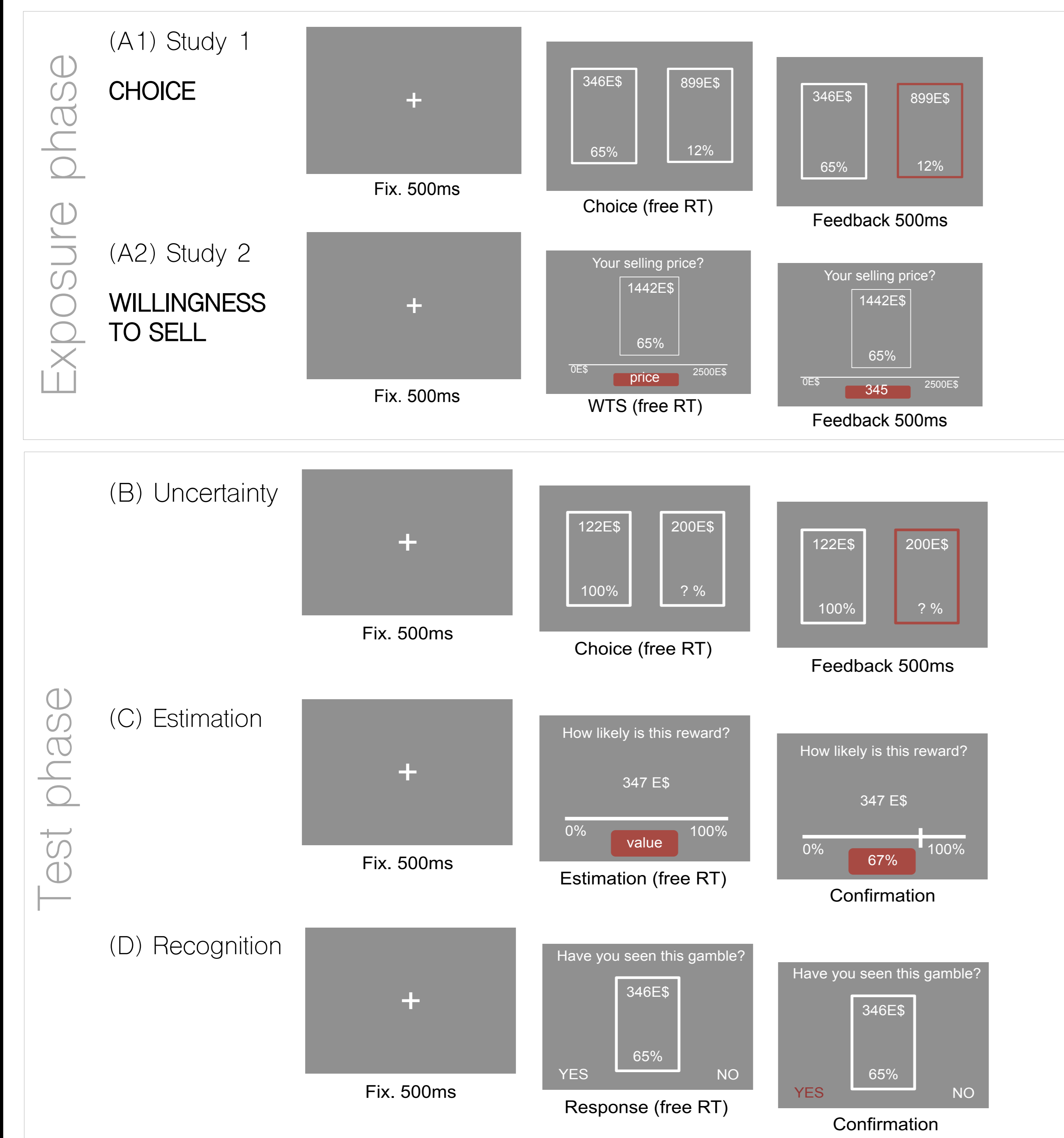
Here, we **exposed** participants to different risk-reward environments through gamble choices (study 1,  $N = 62$ ), or a willingness-to-sell task (study 2,  $N = 90$ ). In a **test phase**, we looked at how the different environments influenced decisions under uncertainty.

## 2 STIMULI

Participants were exposed to monetary gambles of the form ' $p$  chance of winning  $x$  (otherwise 0)'. The gambles were drawn from a **negatively correlated, positively correlated or uncorrelated** environment.



## 3 PROCEDURE



**Task procedure.** (A) Participants chose between two gambles (A1, study 1) or indicated their willingness to sell for single gambles (A2, study 2). All common gambles were interspersed after 50 environment-only gambles. (B, C, D) Tasks in the test phase were identical across all studies and conditions.

## 5 SUMMARY & OUTLOOK

### Summary

In the **exposure phase**, participants integrated payoffs and probabilities to maximize subjective utility (A), and processed single gambles faster if these gambles fit a given risk-reward structure (A2). Gambles incoherent with previously experienced risk-reward structures were systematically rejected in a recognition task (D). This suggests that participants encoded risk-reward structures in a rule-based manner, not via exemplars.

In **decisions under uncertainty**, participants who had been exposed to a negative risk-reward relationship were more risk-seeking for low payoffs and risk-averse for high payoffs. This pattern reversed in the positive condition and disappeared in the uncorrelated condition, in which participants were risk-averse throughout (B). This is consistent with participants inferring probabilities from payoffs (C). Overall, these results suggest that people are sensitive to different risk-reward ecologies and exploit the relationship that is present in the particular environment.

### Outlook

Attentional mechanisms in different risk-reward environments?  
Lifespan implications? (Stronger risk-reward sense as we grow older?)

## 6 REFERENCES

- [1] Pleskac, T. J., & Hertwig, R. (2014). Ecologically Rational Choice and the Structure of the Environment. *Journal of Experimental Psychology: General*, 143(5), 2000-2019.
- [2] Brunswik, E. (1943). Organismic achievement and environmental probability. *Psychological Review*, 47, 69-78.
- [3] Payne, J. W., Bettman, J. R., & Johnson, E. J. (1993). *The Adaptive Decision Maker*. New York, NY: Cambridge University Press.
- [4] Simon, H. A. (1956). Rational choice and the structure of the environment. *Psychological Review*, 63, 129-138.

## 4 RESULTS

### (A) BEHAVIOR DURING THE EXPOSURE PHASE (DECISIONS UNDER RISK)

**STUDY 1**  
●▲ Across both conditions, **expected utility theory** provided the best account of the data. There were no parameter differences between conditions ( $M_{\text{utility\_par}} = .55$ ,  $M_{\text{choice\_rule}} = .2$ ).

**STUDY 2**  
●▲ Across conditions, prices were well-described by **prospect theory**. There were no par. differences between conditions. Consistent with participants stating selling prices the average values suggested risk seeking ( $M_{\text{utility\_par}} = 1.12$ ,  $M_{\text{prob\_weight}} = 1.16$ ).

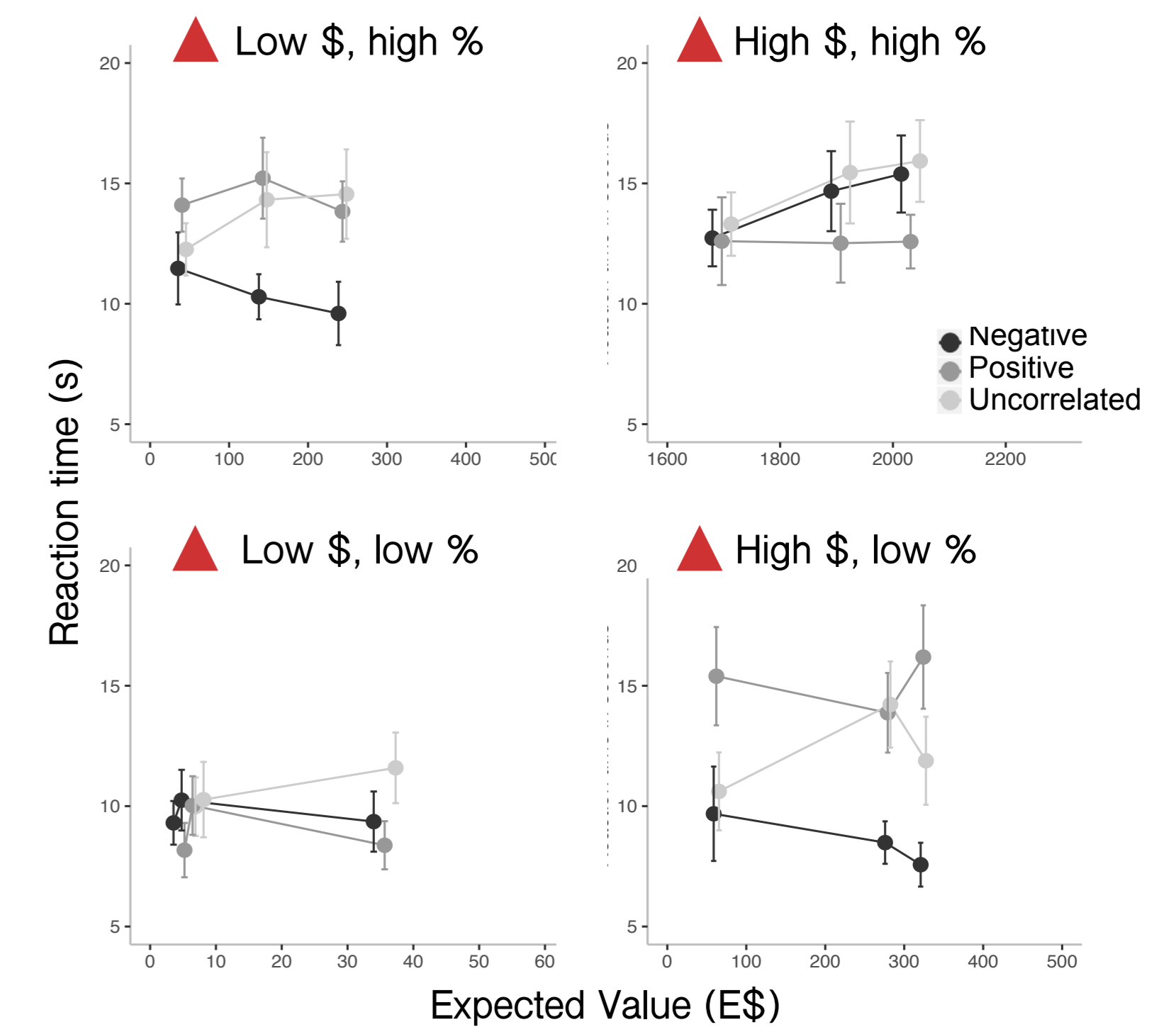
### Modelfits

(BIC scores, lower scores indicate better fit)

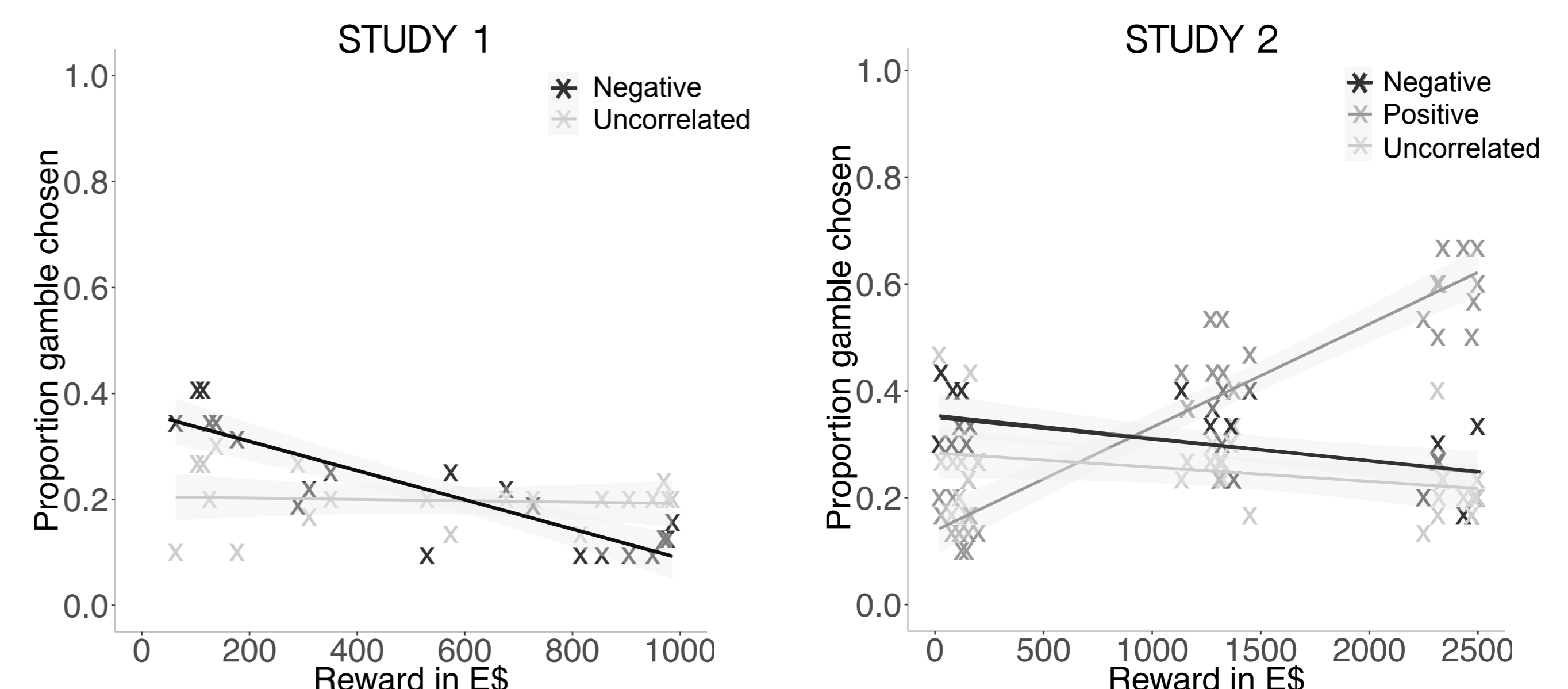
	Negative	Uncorrelated
Baseline	4436.14	4158.89
Expected Value	3369.76	2791.66
<b>Expected Utility</b>	<b>2700.56</b>	<b>1895.42</b>
Prospect Theory	2803.43	1904.72

▲ Standard **certainty effect** in both conditions. Most participants prefer the certain (100% > 80%), but lower payoff. These preferences switch when payoffs remain the same but probabilities are scaled down (25% < 20%).

▲ **Faster responses** for gambles that fit a condition's risk-reward structure.

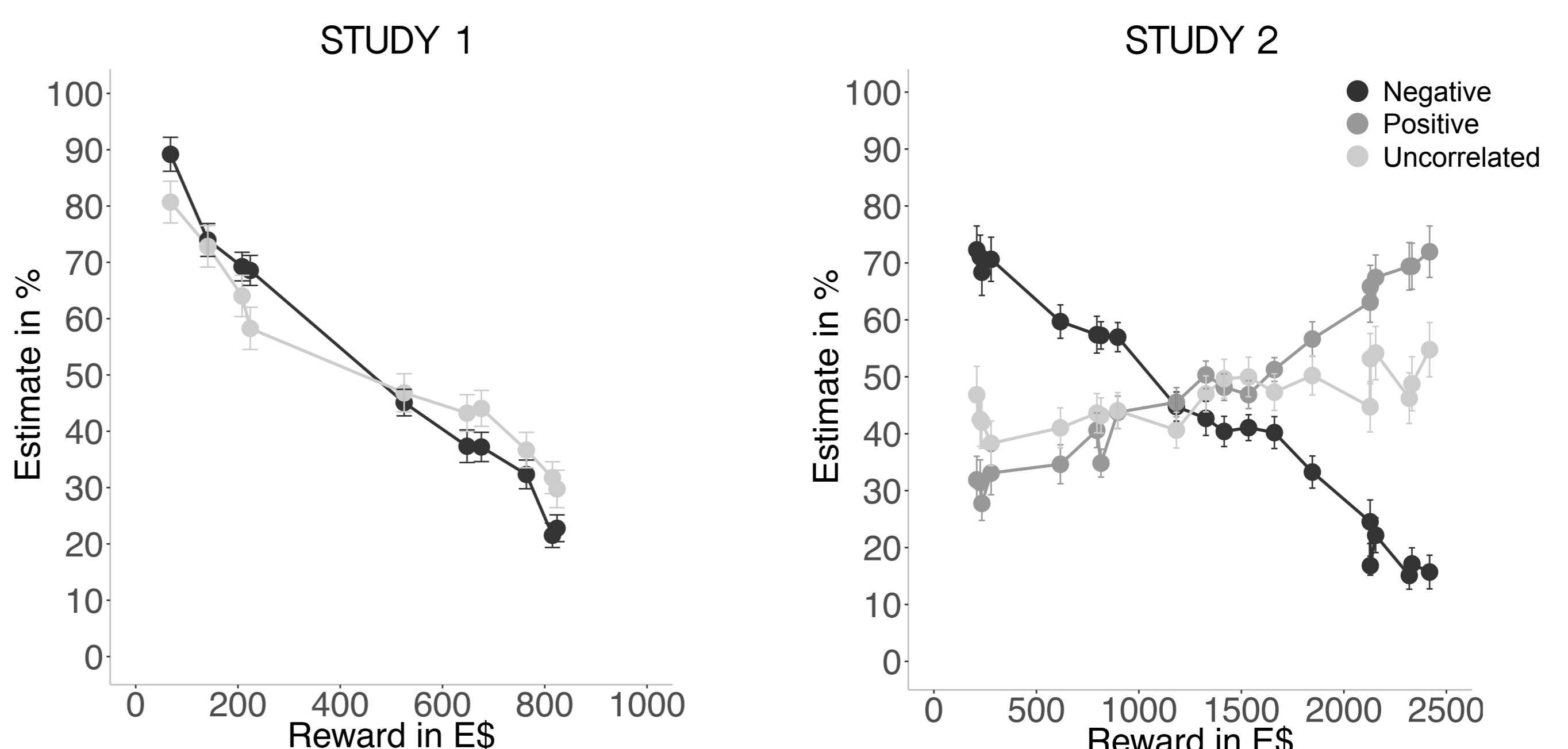


### (B) DECISIONS UNDER UNCERTAINTY (MISSING PROBABILITIES)



Sure thing =  $\frac{1}{2}$  \* gamble.

### (C) EXPLICIT PROBABILITY ESTIMATES



### (D) MEMORY JUDGMENTS OF RISKY PROSPECTS

▲▲▲ Both studies: No **recognition or discrimination ability** of specific gambles (% & \$ combinations). Participants in the correlated conditions systematically rejected gambles (both targets and lures) that did not fit the condition's risk-reward structure.