

# Analyzing the Impact of Choice Complexity on Risk Choices

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# Overview

- Introduction
- Literature
- Hypotheses
- Design and Procedure
- General results and modelling
- Discussion

# Introduction

Decision-making tasks of varying complexity

**Investing in a High-Yield Savings Account**



**Investing in Stock Options**



# Literature review

complexity aversion:

people prefer simple options because they are easier to understand

- Oberholzer et al., 2021: complexity **decreased** the choice probability of an option

However, almost no study testing the cognitive mechanism of complexity aversion

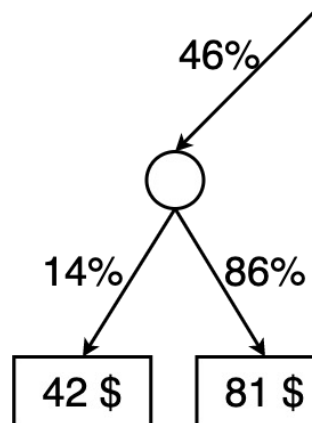
Zhao et al., (2020) found the pre-valuation bias are crucial for explaining loss aversion.

# Literature review

*Which of the following two alternatives do you prefer?*

Compound lotte  
Harrison et al., 2

I., 2019;



Alternative A		
Probability	Payment 1	Payment 2
100%	0	100

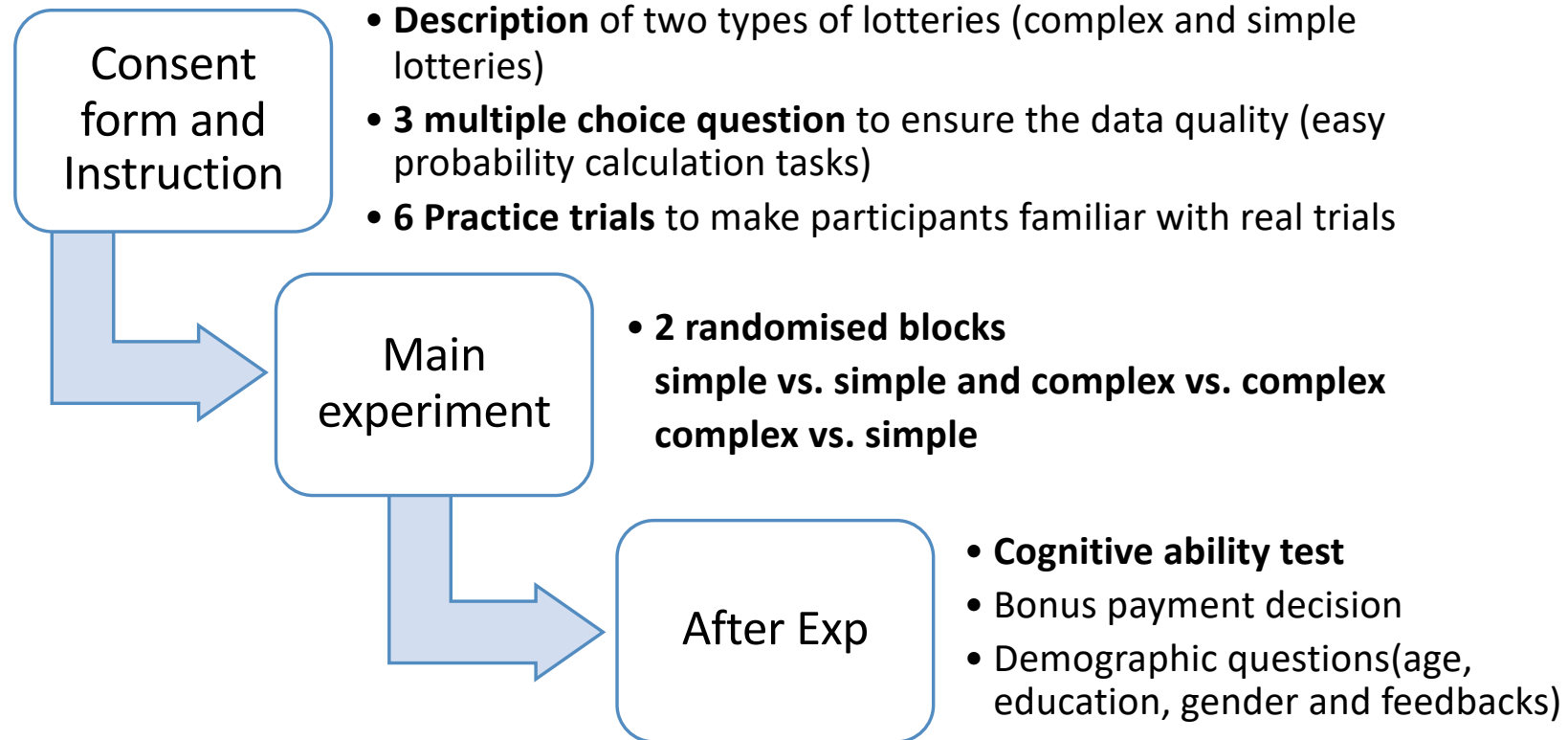
Alternative B			
Probability	Payment 1	Payment 2	Payment 3
50%	30	30	30
12.5%	0	0	0
0.5%	50	100	60
37%	60	60	40

*Mark your choice with a ✓*

I prefer Alternative A to Alternative B

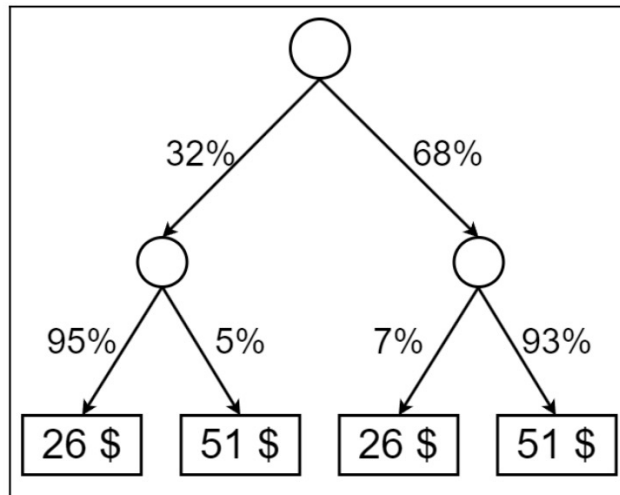
I prefer Alternative B to Alternative A

# Procedure

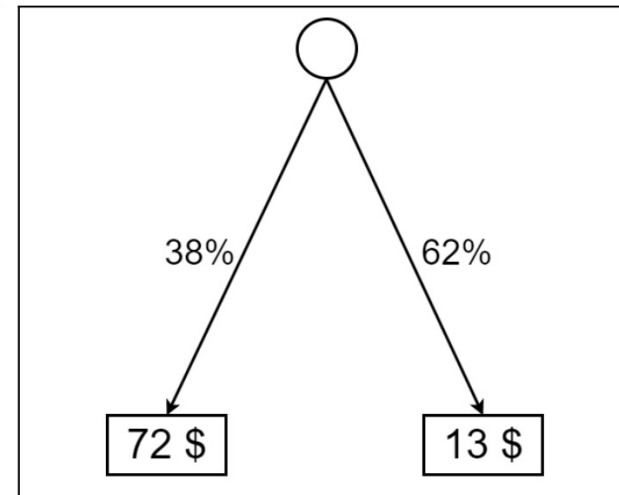


# Trials

Please choose one option that you prefer.



**Press F to choose the left option**



**Press J to choose the right option**

# Stimuli construction

- **EV Difference:** -20,-10,0,10,20
- **SD Difference:** 5,10, 15
- **Skewness diff:**
  - left vs. right = left lottery probability of lower outcome is  $< .20$  & right lottery probability of lower outcome is  $> .80$
  - right vs. left = left lottery probability of lower outcome is  $> .80$  & right lottery probability of lower outcome is  $< .20$
  - no skew vs. no skew = left and right lottery probability of lower outcome is  $.30 < p < .70$
- 8 control trials (EU Diff: 20 and -20, SD Diff 0 and no Skewness) in each condition



# Hypotheses in the CC and SS condition

## **Behavioral Hypothesis:**

- faster response times in simple versus simple compared to complex versus complex.
- choice consistency to be higher in simple versus simple than complex versus complex

# Hypotheses in the CS condition

## **Behavioral Hypothesis:**

People prefer simple options than complex options.

Cognitive Mechanism hypotheses to explain complexity aversion:

- **First hypothesis:** Complexity aversion is mainly driven by a pre-valuation bias.
- **Second hypothesis:** Complexity aversion is mainly driven by a discounting effect that occurs during information accumulation.
- **Third hypothesis:** Complexity aversion is mainly driven by the subjective representation of outcome probabilities.

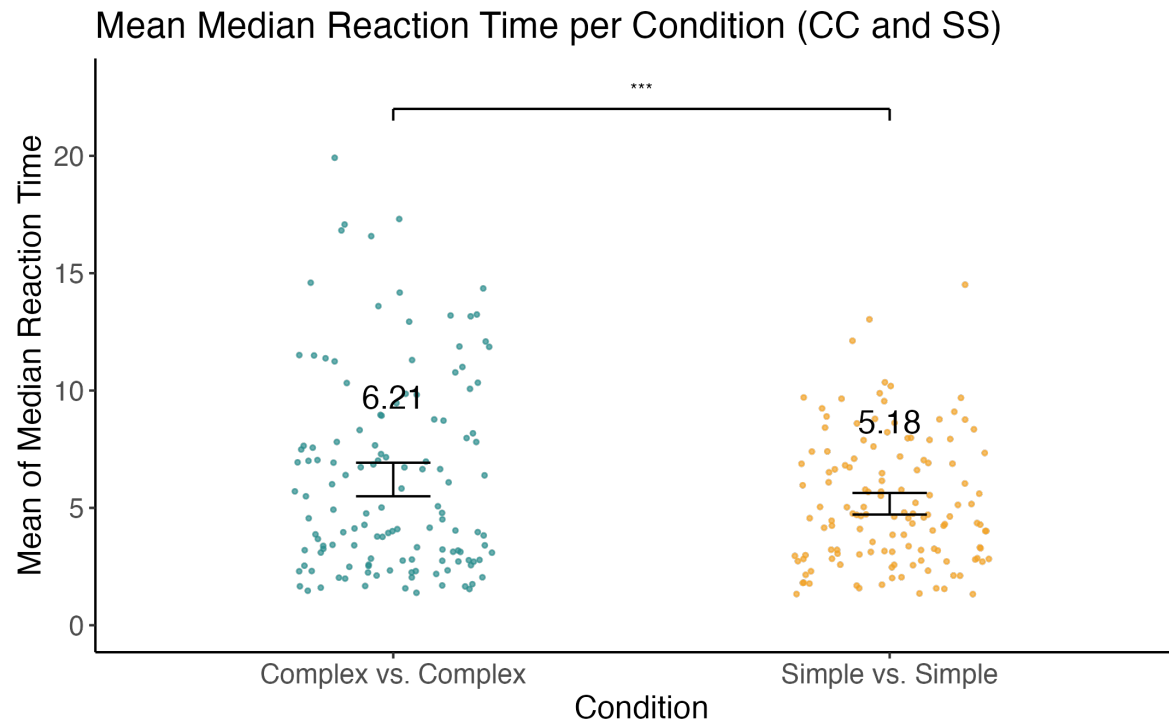
# Additional Correlation Hypotheses

## **Behavioral Hypothesis:**

Complexity aversion is positively correlated with cognitive ability.

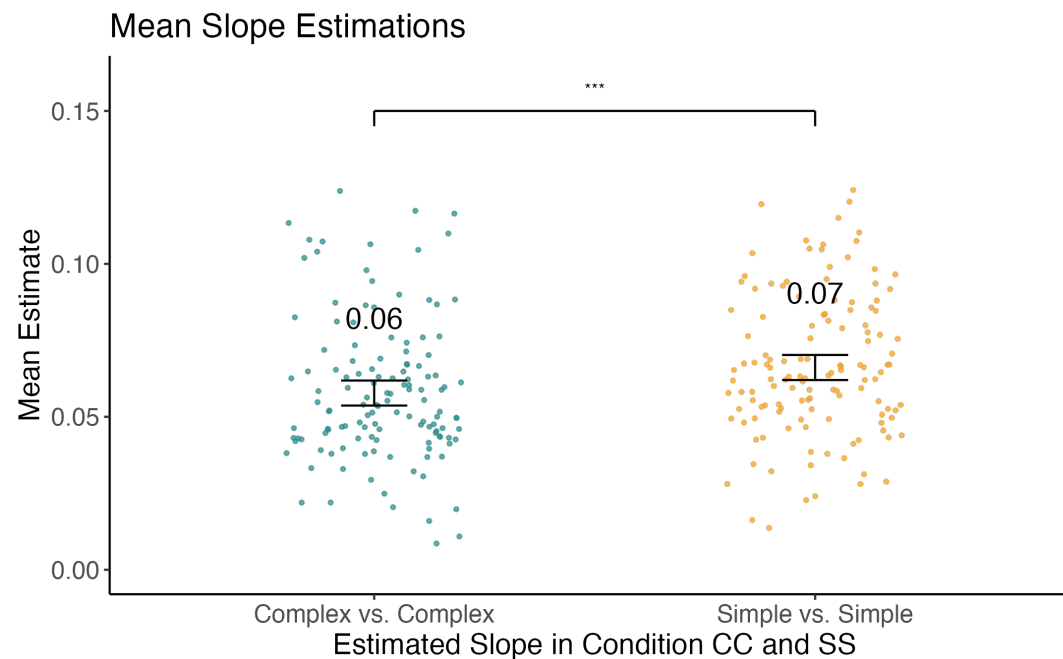
# Results: Complex vs. Complex and Simple vs. Simple: **Reaction time**

- faster RT in the CC condition ( $t(131) = 5.8352, p < .005$ )



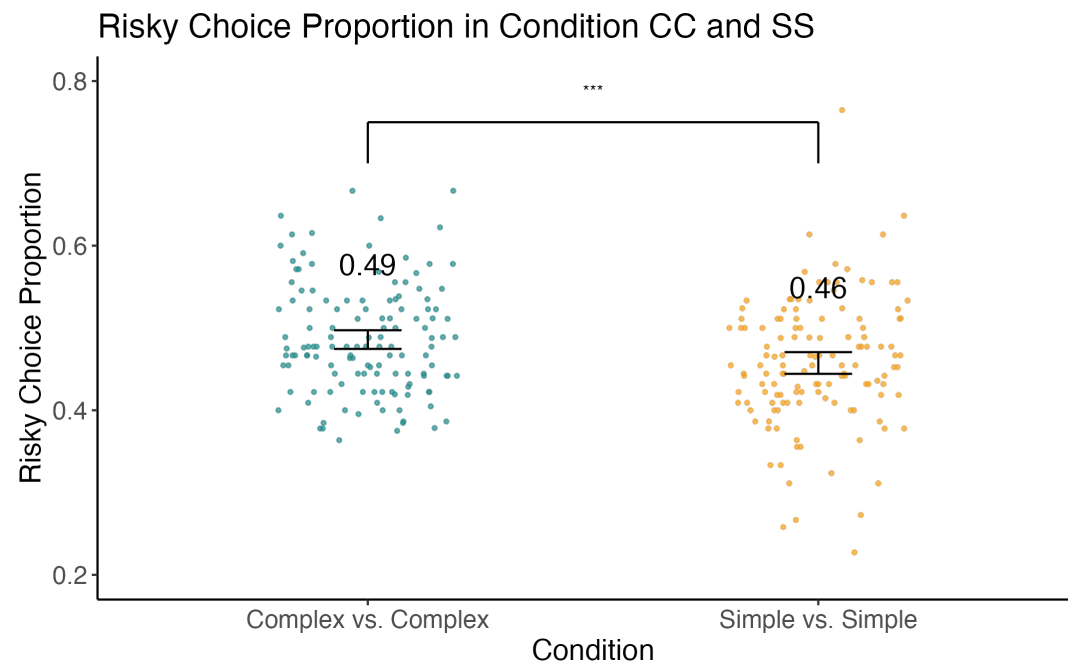
# Results: Complex vs. Complex and Simple vs. Simple: **EV Coefficient**

- t test comparing Coefficient of EV in a logistic regression on choice in CC and SS condition (higher in the SS condition,  $t(131) = -4.534, p < .005$ )



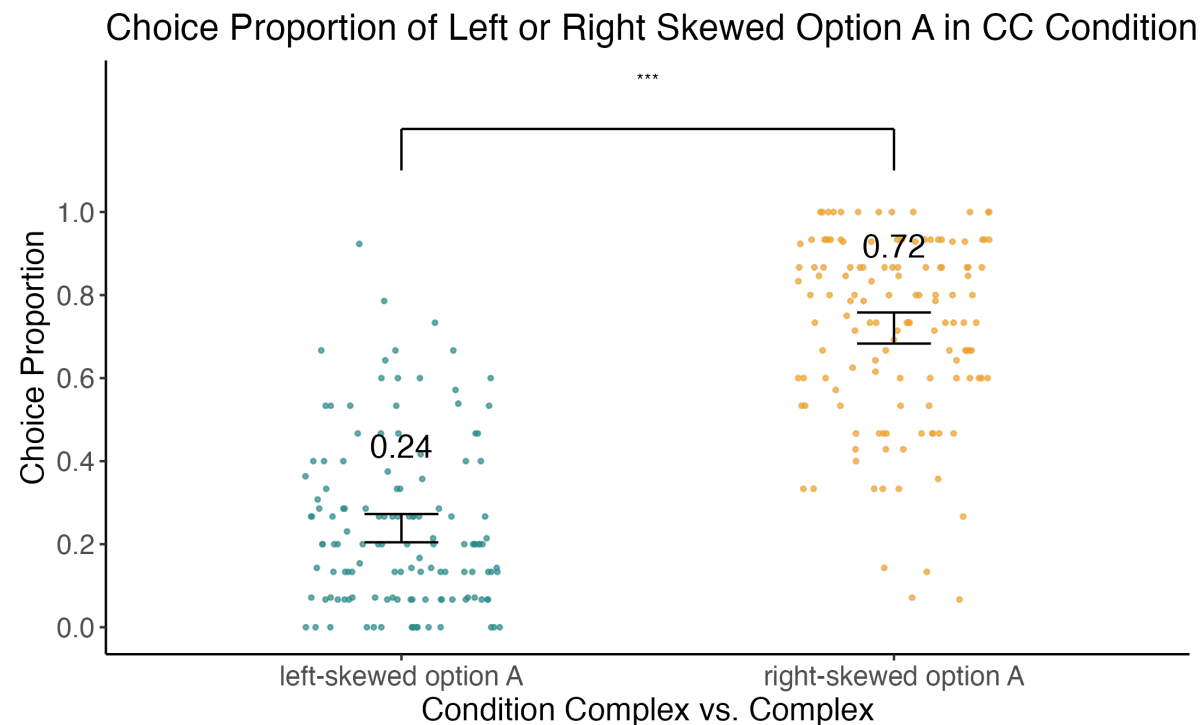
# Results: Complex vs. Complex and Simple vs. Simple: **Risky choices proportion**

- Two-sample t test comparing percentage of risky choices
- More risky choices in the CC condition,  $t(131) = -3.50$ ,  $p < .005$



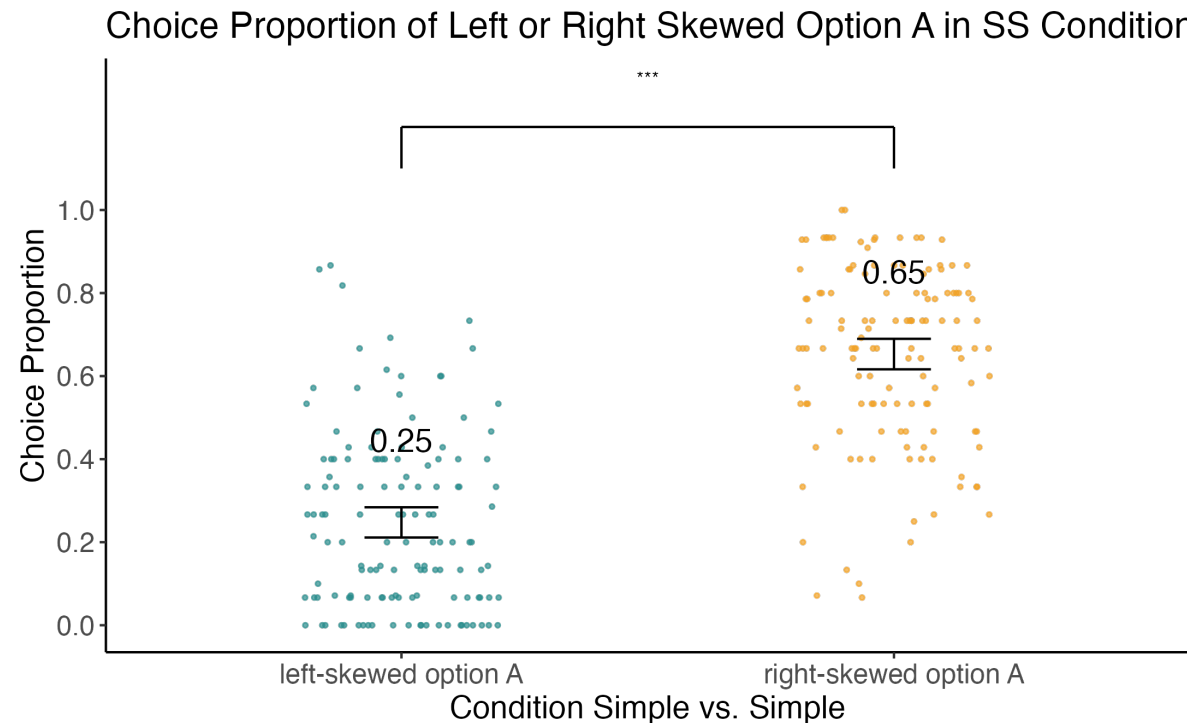
# Results: Complex vs. Complex and Simple vs. Simple: **Skewness in CC**

- In CC condition: right skewed option A was preferred.  $t(131) = 13.93$ ,  $p < .005$



# Results: Complex vs. Complex and Simple vs. Simple: **Skewness in SS**

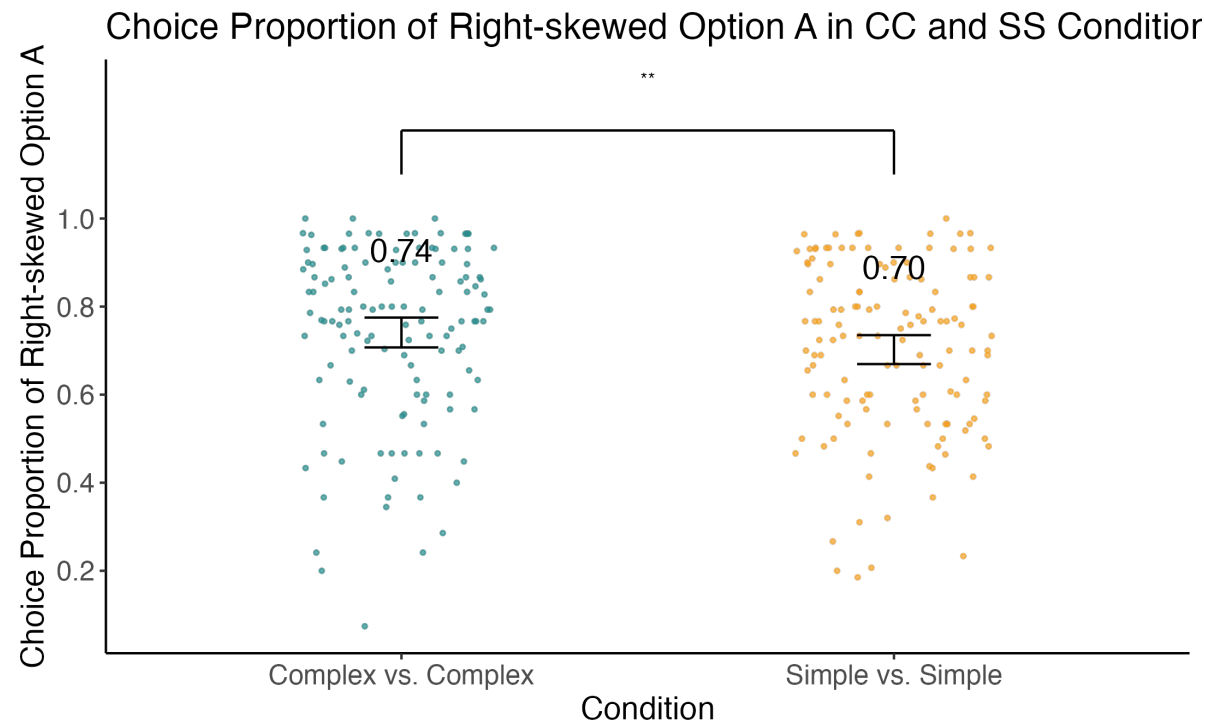
- In SS condition: right skewed option A was preferred.  $t(131) = 12.09$ ,  $p < .005$



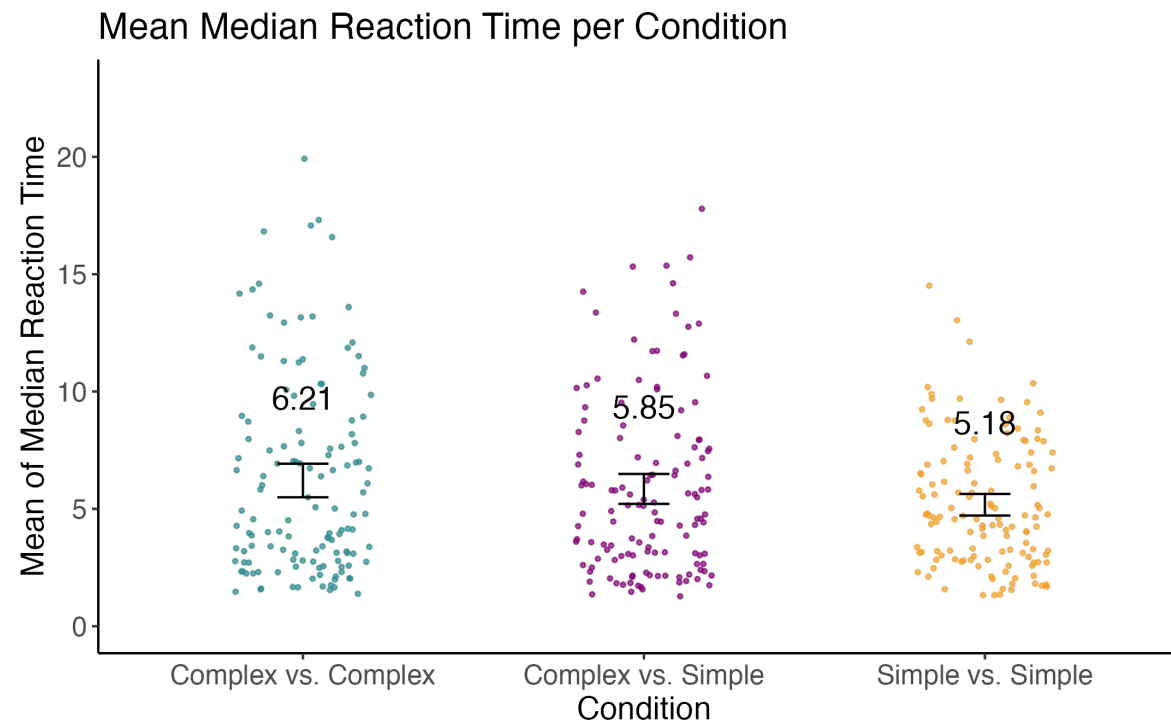


# Results: Complex vs. Complex and Simple vs. Simple: **Skewness in CC and SS**

- Right-Skewed Option A was more preferred in CC condition,  $t(131) = 2.38$ ,  $p < .05$

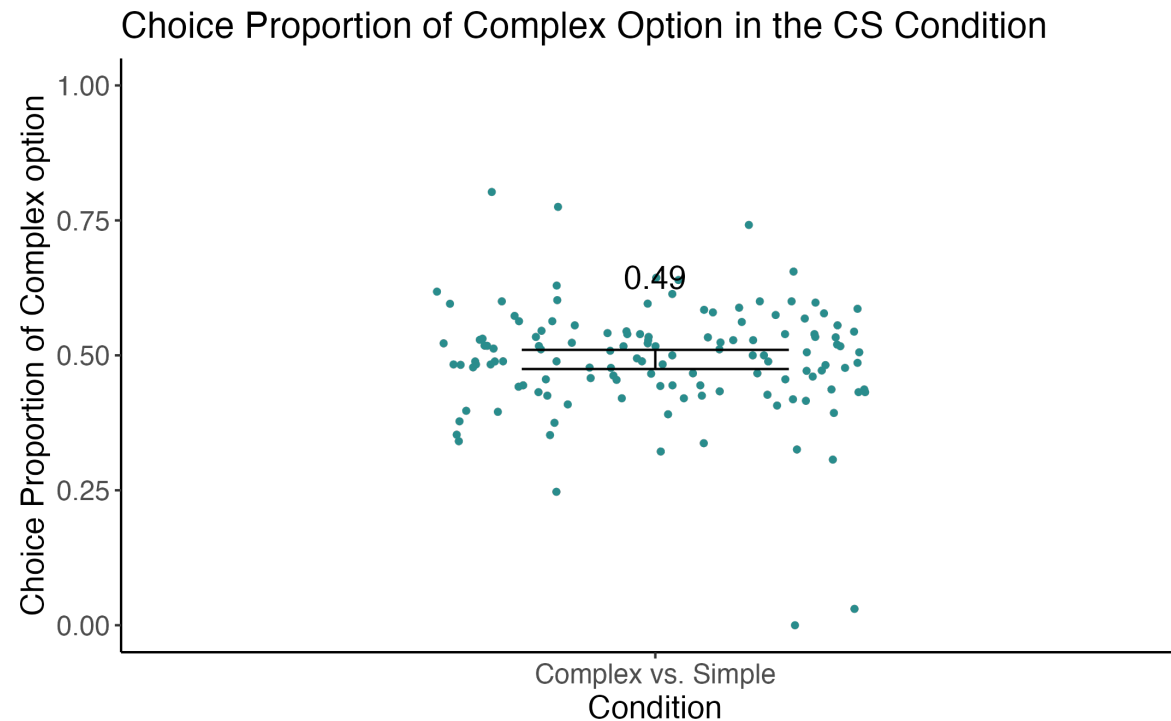


# Complex vs. Simple: Reaction time



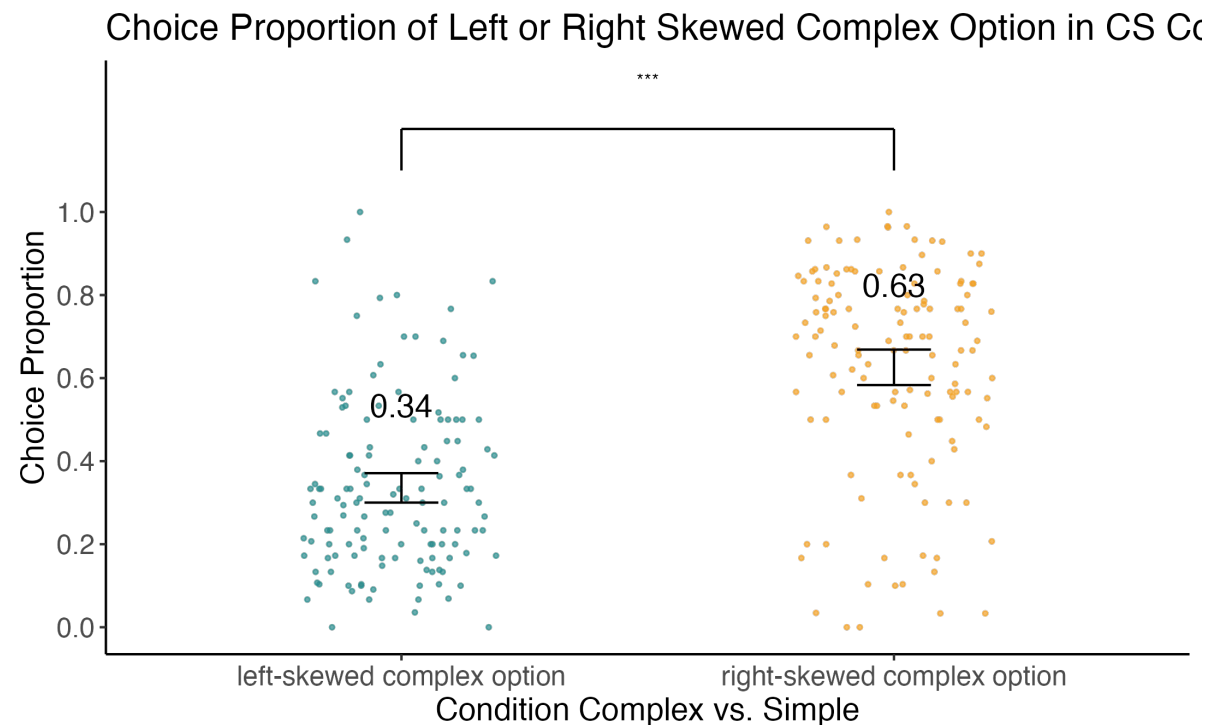
# Complex vs. Simple: Choice Proportion

- Not significantly lower than 50%,  $t(131) = -0.839$ ,  $p > .05$



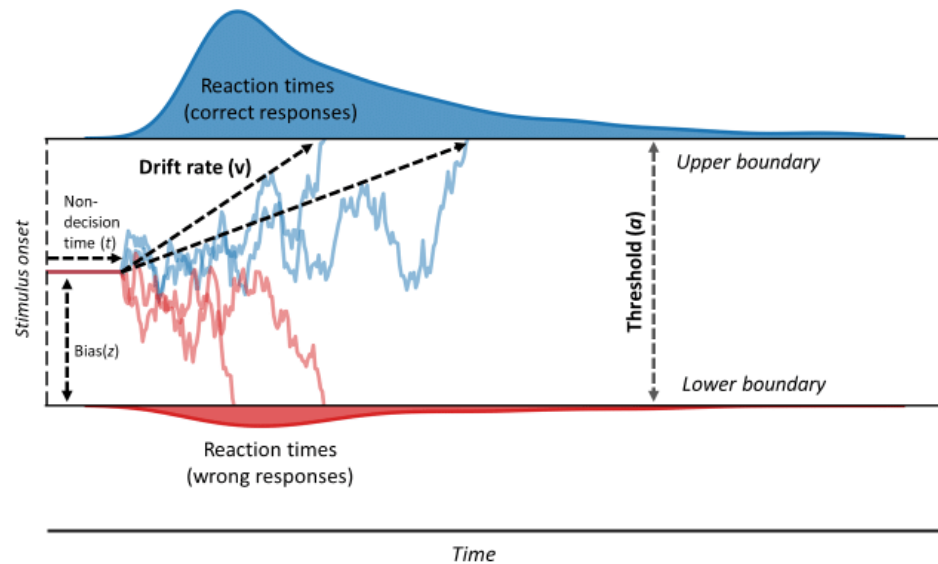
# Complex vs. Simple: Skewness

- In CS condition: right skewed complex option was preferred.  $t(131) = 8.41$ ,  $p < .005$



# Modelling

- Drift diffusion model



CC and SS condition

risky option

CS condition

complex option

safe option

simple option

# Modelling: EU and MV models

- EU models: drift rate as the difference of subjective utility of the two gamble options
- mean-variance models: drift rate predicted by EVD and SDD.
- Model parameters for all models include:  $t$  (non-decisional time),  $\alpha$  (choice boundary),  $v$  (drift rate),  $\theta$  (choice consistency parameter),  $\beta$  (risk sensitivity parameter).

# Modelling: additional parameters

## CC and SS condition

- $\Delta\beta$  (risk sensitivity difference between CC and SS)
- Probability weighting models:  $\gamma$  (curvature of probability weighting function; separate for CC and SS condition)
- Threshold models:  $\lambda$

## CS condition

- Starting point models:  $z$  (starting point, 0 if neutral)
- Discounting effect models:  $\eta$  (complexity discounting)
- Probability weighting models:  $\gamma$  (curvature of probability weighting function; separate for simple and complex)

# Modelling: Results in CC and SS

CC and SS condition

risk sensitivity difference between CC and SS

- strictly negative 95% credible interval excluded 0 in both EU and MV models
- higher consistency for simple versus simple compared to complex versus complex.
- EU: mean: -0.32, 95% HPDI: (-0.48, -0.21)
- MV: mean: -0.003, 95% HPDI: (-0.0035, -0.002)



# Modelling: Results in CC and SS

CC and SS condition

Threshold  $\lambda$

- strictly positive 95% HPDI excluded 0 in both EU and MV models
- larger threshold of complex versus complex compared to simple versus simple.
- EU: mean: 0.20, 95% HPDI: (0.12, 0.27)
- MV: mean: 0.19, 95% HPDI: (0.12, 0.27)

# Modelling: Results in CC and SS

CC and SS condition

Probability weighting models:  $\gamma$  (curvature of probability weighting function; separate for CC and SS condition)

- EU: mean: -0.25, 95% HPDI: (-0.39, -0.11)
- MV:

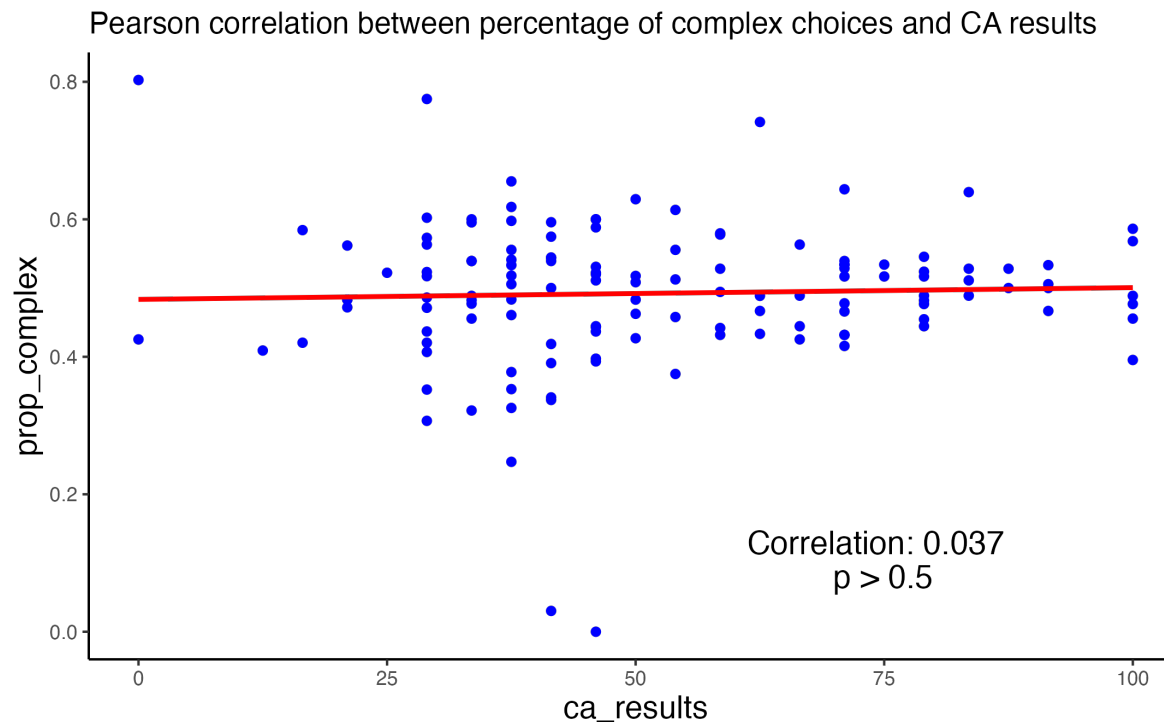
# Modelling: Results in CS

## CS condition

- Starting point models: 95% HPDI included 0.5 in both EU and MV models, no evidence support preliminary disposition against complex options
- Discounting effect models: 95% HPDI included 0 in both EU and MV models, no evidence support discounting effect against complex options
- Probability weighting models:

# Correlation between cognitive ability and complexity aversion

- No significant correlation between cognitive ability scores and choice proportion of complex option in the CS condition.





# Thanks for your attention!

## Reference:

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