



# Do Robo-Advisors Make Us Better Investors?

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## Abstract

- Investors increasingly face assistance from **robo-advisors**
- Robo-advisors are often imbued with anthropomorphic design elements such as an avatar or a name (e.g., the Bank of America name Erica)
- We study whether and how robo-advisors reduce the **disposition effect (DE)**, a well-documented and economically costly behavioral bias
- Findings from two induced-value laboratory experiments:
  - Investment advice from robo-advisor (upon request) reduces the DE
  - Evidence for two mediators: (i) socialness perceptions, and (ii) number of advice requests
  - Use of anthropomorphic design elements increase socialness perceptions but reduces the number of advice requests

## Background

- The DE describes investors' tendency to sell winning assets too early and to sell losing assets too late (Shefrin & Statman, 1985)
- Draw on **cognitive dissonance theory** (Festinger, 1957), whereby investors avoid realizing losses to avoid admitting that past purchases were mistakes
- Examine effect of robo-advisor by disentangling two separate **characteristics** of robo-advisors:
  - Provision of unbiased investment advice
  - Perceptions of socialness toward the robo-advisor

- Invest in assets B and C
- Sell asset D



→ **Advice effect:**  
Receiving advice facilitates decision to sell at a loss

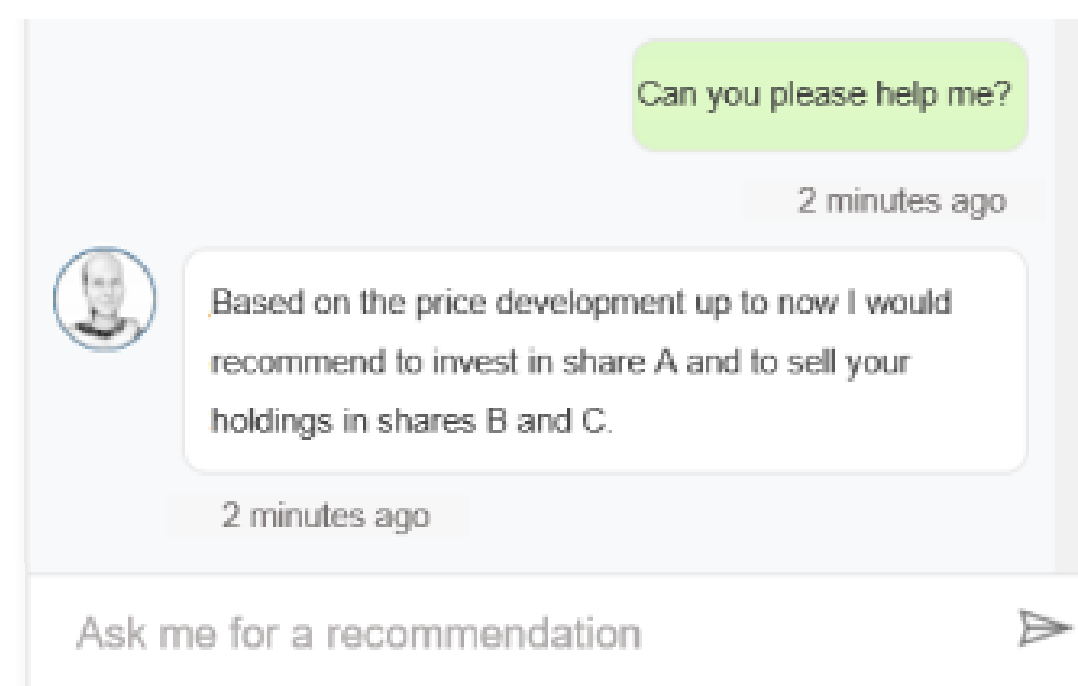
→ **Agency effect:**  
Perceptions of socialness facilitate assigning blame to the advisor after a loss

Access Zoom Meeting [Here!](#)

## Method

- Two **induced-value laboratory experiments**, student subject pool from two large German universities ( $n_1=195$ ,  $n_2=259$ )
- General design (trading game) based on Weber & Camerer (1998)
  - Six tradeable assets varying in their probability to increase
  - Participants are aware of probability distributions but exact allocation of assets is unknown
- Manipulations:**
  - Robo-advisor vs no robo-advisor (control) → **study 1**
  - Anthropomorphic robo-advisor vs non-anthropomorphic robo-advisor (i.e., recommendation algorithm) → **study 2**

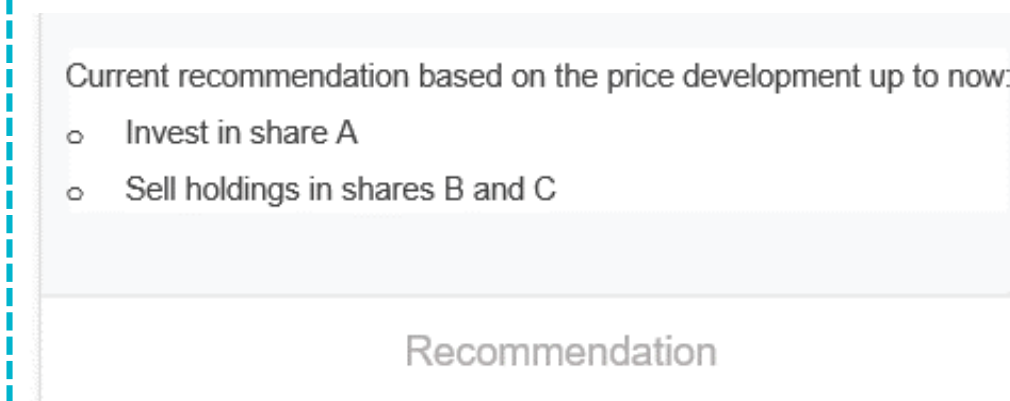
### Robo-advisor



Advisor interface in robo-advisor group

- ✓ investment advice
- ✓ visual cues
- ✓ verbal cues
- ✓ natural language processing

### Recommendation algorithm



Advisor interface in recommendation algorithm group

- ✓ investment advice

## Main Results

- Lower DE (measured as in Odean, 1998) in the robo-advisor group compared to control group (Wilcoxon signed rank test,  $p = 0.003$ )
  - Economic significance: robo-advisor increases portfolio performance by 2.7% in line with previous research
- Evidence for **parallel mediation** over number of advice requests and socialness perceptions following a product of coefficients approach (O'Rourke & Vazquez, 2019)
  - Significant **indirect effect over socialness perceptions** (bootstrapped confidence interval with 1000 iterations: -0.050, -0.001)
  - Significant (conditional) **indirect effect over advice requests** (bootstrapped confidence interval with 1000 iterations: -3.308, -0.695)
  - Regressions control for risk aversion, loss aversion, disposition to trust, sociability, financial sophistication, experience, gender, age, number of trades, duration
- Lower perceptions of socialness (Mann-Whitney test,  $p = 0.014$ ) and higher number of advice requests (Chi-square test,  $p = 0.007$ ) in the recommendation algorithm group compared to the robo-advisor group, evidence for **opposing mediation**

## Discussion

- Provision of investment advice from robo-advisor as a **debiasing feature**
- Support for cognitive dissonance as a **belief-based explanation** for the DE
- Anthropomorphism may hinder investors to actively seek advice, due to **trade-off** between desire to increase accuracy and maintain autonomy (Dalal & Bonaccio, 2010)
- Implications** for the design of digital advisory services:
  - Optimize level of anthropomorphism by maximizing debiasing effect of blaming someone else (agency effect), and simultaneously
  - Increase perceptions of autonomy and control retention (e.g., by providing alternative forms of advice)

## Limitations and Future Research

- University student sample
- Single industry
- Extend results to other demographic groups as well as to other relevant settings such as advisory services in the insurance or healthcare domain

## References

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