

# *Financial Education and the Quality of Decision Making*

B. Douglas Bernheim  
Stanford University

Financial Literacy Seminar Series  
George Washington University  
November 19, 2015

# Introduction

- Low financial literacy throughout the world raises concerns about the quality of financial decision making
  - [FLat World Project](#) ([F](#)inancial [L](#)iteracy [a](#)round [t](#)he [W](#)orld)

# Introduction

- Low financial literacy throughout the world raises concerns about the quality of financial decision making
  - [FLat World Project](#) ([F](#)inancial [L](#)iteracy [a](#)round [t](#)he [W](#)orld)
- Financial education seeks to improve decisions by helping consumers understand connection between choices and consequences
  - Efforts to deploy at multiple levels (high school, workplace, community)

# Introduction

- Low financial literacy throughout the world raises concerns about the quality of financial decision making
  - [FLat World Project](#) ([F](#)inancial [L](#)iteracy [a](#)round [t](#)he [W](#)orld)
- Financial education seeks to improve decisions by helping consumers understand connection between choices and consequences
  - Efforts to deploy at multiple levels (high school, workplace, community)
- Large and growing literature examines the effects of financial education on financial literacy (test scores) and financial choices (such as saving)
  - Bernheim, Garrett, Maki (2001): high school financial education mandates
  - Bernheim & Garrett (2003), Duflo and Saez (2003): financial education in the workplace
  - Many subsequent studies; evidence is mixed (see Lusardi and Mitchell, 2014, Hastings, Madrian, & Skimmyhord, 2013)

- *Critical unanswered question*: are the behavioral effects of financial education are helpful or harmful?

- *Critical unanswered question*: are the behavioral effects of financial education are helpful or harmful?
- Discussions of welfare typically colored by paternalistic judgments and/or strong preconceptions
  - “People are better off with...” (high saving, balanced portfolios)
  - “A better understanding of choice options necessarily promotes better decisions.”

- *Critical unanswered question*: are the behavioral effects of financial education are helpful or harmful?
- Discussions of welfare typically colored by paternalistic judgments and/or strong preconceptions
  - “People are better off with...” (high saving, balanced portfolios)
  - “A better understanding of choice options necessarily promotes better decisions.”
- Yet it is also possible that financial education alters behavior through other mechanisms: *indoctrination, exhortation, deference to authority, social pressure, and/or psychological anchors*

- *Critical unanswered question*: are the behavioral effects of financial education are helpful or harmful?
- Discussions of welfare typically colored by paternalistic judgments and/or strong preconceptions
  - “People are better off with...” (high saving, balanced portfolios)
  - “A better understanding of choice options necessarily promotes better decisions.”
- Yet it is also possible that financial education alters behavior through other mechanisms: *indoctrination, exhortation, deference to authority, social pressure, and/or psychological anchors*
- If so, it may induce people to act contrary to the preferences they themselves would reveal (through choices) if they properly understood the consequences of their actions.



## Contributions of the research agenda:

- **First**, introduce a new approach to evaluating the quality of financial decision making
  - Ambuehl, Bernheim, and Lusardi (2015), “The Effect of Financial Education on the Quality of Decision Making”
  - Involves a precise concept of *financial competence*
  - Firmly rooted in the principles of *behavioral welfare economics* (Bernheim and Rangel, 2004, 2009).
  - Non-paternalistic, quantitatively precise, modest information requirements, easily implemented

## Contributions of the research agenda:

- **First**, introduce a new approach to evaluating the quality of financial decision making
- **Second**, document empirically the importance of assessing and analyzing financial competence, rather than relying exclusively on conventional outcome measures
  - Ambuehl, Bernheim, and Lusardi (2015), “The Effect of Financial Education on the Quality of Decision Making”
  - Ambuehl, Bernheim, Ersoy, and Lusardi (in progress), “Financial Education and the Quality of Portfolio Allocation”
  - The interventions we study appear successful based on conventional outcome measures (financial literacy, self-reported decision strategies, directional effects on choice), but they do not improve financial competence (welfare)
  - Points to a disconnect between what people understand in principle, and what they act on: *motivational rhetoric*
  - Creates a design problem for financial education programs: attention-getting motivational material may undermine substance

## Contributions of the research agenda:

- **First**, introduce a new approach to evaluating the quality of financial decision making
- **Second**, document empirically the importance of assessing and analyzing financial competence, rather than relying exclusively on conventional outcome measures
- **Third**, examine how the social environment affects financial competence and mediates the effects of financial education
  - Ambuehl, Bernheim, Ersoy, and Harris (in progress), “Social Transmission of Financial Decision-Making Skills: The Blind Leading the Blind?”
  - Social effects are potentially critical because many people turn to friends and family for advice and assistance
  - Does communication improve the quality of financial decisions? What are the secondary effects of financial education? Are the primary effects reinforced or muted by social feedback?

## Contributions of the research agenda:

- **First**, introduce a new approach to evaluating the quality of financial decision making
- **Second**, document empirically the importance of assessing and analyzing financial competence, rather than relying exclusively on conventional outcome measures
- **Third**, examine how the social environment affects financial competence and mediates the effects of financial education
- **Fourth**, evaluate the impact of interventions in the field on the quality of financial decision making

# Financial Competence

Ambuehl, Bernheim, and Lusardi (2015)

- What we are looking for: a *non-paternalistic* notion of what it means to make good decisions

# Financial Competence

Ambuehl, Bernheim, and Lusardi (2015)

- What we are looking for: a *non-paternalistic* notion of what it means to make good decisions
- Approaches we reject
  - *Standard Revealed Preference*: cannot address welfare effects of financial education (all choices are tautologically optimal in light of the preferences they reveal)
  - *Behavioral Revealed Preference*, based on educated choices: assumes the conclusion
  - *Other Behavioral Revealed Preference strategies*: forces us to shoehorn choices into a model of preferences that might or might not be correct (Song, 2015)

Notion of financial competence is based on three observations:

- **First**, financial decisions generally involve choices among *consumption instruments* rather than consumption bundles
  - Consumption instruments are derivative goods valued only because they provide the means to secure bundles of intrinsically valued goods
  - For example, in an intertemporal setting, a consumption bundle specifies current and future consumption. Deciding how much to invest in a retirement savings account involves the choice of a consumption instrument.

Notion of financial competence is based on three observations:

- **First**, financial decisions generally involve choices among *consumption instruments* rather than consumption bundles
- **Second**, there are typically *many instruments that yield the same consumption opportunities*, giving rise to equivalent decision problems

A simple illustration:

- \$10,000 invested in an account yielding 2% per year for 36 years
- A zero-coupon bond that pays \$20,000 in 36 years



Notion of financial competence is based on three observations:

- **First**, financial decisions generally involve choices among *consumption instruments* rather than consumption bundles
- **Second**, there are typically *many instruments that yield the same consumption opportunities*, giving rise to equivalent decision problems
- **Third**, if consumers understand the relation between their actions and the consequences of these actions, they should exhibit *consistency across equivalent representations of the same decision problem*

Notion of financial competence is based on three observations:

- **First**, financial decisions generally involve choices among *consumption instruments* rather than consumption bundles
- **Second**, there are typically *many instruments that yield the same consumption opportunities*, giving rise to equivalent decision problems
- **Third**, if consumers understand the relation between their actions and the consequences of these actions, they should exhibit *consistency across equivalent representations of the same decision problem*

Thus:

- Perfect financial competence requires equivalent choices from *equivalent decision problems*
- Intuitively, the divergence between choices made in equivalent decision problems reflects the *degree of financial competence*

# Measuring Financial Competence

- To measure financial competence, we focus on *equivalent pairs of simply framed and complexly framed valuation tasks*

# Measuring Financial Competence

- To measure financial competence, we focus on *equivalent pairs of simply framed and complexly framed valuation tasks*
- A *valuation task* elicits a value  $V(i)$  for which the consumer exhibits indifference between instrument  $i$  and  $\$V(i)$  immediately, e.g.:
  - Investing **\$10,000 @ 2% for 36 years** versus receiving **\$Y today**
  - Receiving **\$20,000 in 36 years** versus receiving **\$Z today**

# Measuring Financial Competence

- To measure financial competence, we focus on *equivalent pairs of simply framed and complexly framed valuation tasks*
- A *valuation task* elicits a value  $V(i)$  for which the consumer exhibits indifference between instrument  $i$  and  $\$V(i)$  immediately, e.g.:
  - Investing **\$10,000 @ 2% for 36 years** versus receiving **\$Y today**
  - Receiving **\$20,000 in 36 years** versus receiving **\$Z today**
- For equivalent instruments  $i$  and  $j$ , perfect financial competence implies  $V(i) = V(j)$ , e.g.:
  - **\$Y today = \$Z today**

# Measuring Financial Competence

- To measure financial competence, we focus on *equivalent pairs of simply framed and complexly framed valuation tasks*
- A *valuation task* elicits a value  $V(i)$  for which the consumer exhibits indifference between instrument  $i$  and  $\$V(i)$  immediately, e.g.:
  - Investing  $\$10,000$  @ 2% for 36 years versus receiving  $\$Y$  today
  - Receiving  $\$20,000$  in 36 years versus receiving  $\$Z$  today
- For equivalent instruments  $i$  and  $j$ , perfect financial competence implies  $V(i) = V(j)$ , e.g.:
  - $\$Y$  today =  $\$Z$  today
- $|V(i) - V(j)|$  and  $(V(i) - V(j))^2$  are appealing measures of financial competence

# Measuring Financial Competence

- To measure financial competence, we focus on *equivalent pairs of simply framed and complexly framed valuation tasks*
- A *valuation task* elicits a value  $V(i)$  for which the consumer exhibits indifference between instrument  $i$  and  $\$V(i)$  immediately, e.g.:
  - Investing **\$10,000 @ 2% for 36 years** versus receiving **\$Y today**
  - Receiving **\$20,000 in 36 years** versus receiving **\$Z today**
- For equivalent instruments  $i$  and  $j$ , perfect financial competence implies  $V(i) = V(j)$ , e.g.:
  - **\$Y today = \$Z today**
- $|V(i) - V(j)|$  and  $(V(i) - V(j))^2$  are appealing measures of financial competence
- Elicit valuations through multiple price lists

# Simple and Complex Framing

Two equivalent decision problems

Complexly framed:

Complete description of the instrument

Simply framed:

Complete description of the intermediate outcome implied by the instrument:



# Simple and Complex Framing

Two equivalent decision problems

Complexly framed:

Complete description of the instrument

- e.g., \$10 @ 2% for 36 days

Simply framed:

Complete description of the intermediate outcome implied by the instrument:

# Simple and Complex Framing

Two equivalent decision problems

Complexly framed:

Complete description of the instrument

- e.g., \$10 @ 2% for 36 days

Simply framed:

Complete description of the intermediate outcome implied by the instrument:

- e.g., \$20 in 36 days

# Simple and Complex Framing

Two equivalent decision problems

## Complexly framed:

Complete description of the instrument

- e.g., \$10 @ 2% for 36 days
- e.g., Asset A: (\$5, \$10), Asset B: (\$3, \$15), Portfolio: (50% Asset A, 50% Asset B)

## Simply framed:

Complete description of the intermediate outcome implied by the instrument:

- e.g., \$20 in 36 days

# Simple and Complex Framing

Two equivalent decision problems

## Complexly framed:

Complete description of the instrument

- e.g., \$10 @ 2% for 36 days
- e.g., Asset A: (\$5, \$10), Asset B: (\$3, \$15), Portfolio: (50% Asset A, 50% Asset B)

## Simply framed:

Complete description of the intermediate outcome implied by the instrument:

- e.g., \$20 in 36 days
- e.g., Asset C: (\$4, \$12)

# Welfare Interpretation

Based on Bernheim and Rangel (2009)

When choices are based on an incorrect understanding of available consumption bundles, they are not welfare-relevant (*characterization failure*)

# Welfare Interpretation

Based on Bernheim and Rangel (2009)

When choices are based on an incorrect understanding of available consumption bundles, they are not welfare-relevant (*characterization failure*)

**Illustration: A choice between an apple and an orange**

- When it is not dark, the individual correctly understands the options and chooses the orange
- When it is dark, the individual misunderstands the options, thinks the orange is a mandarin and chooses the apple

# Welfare Interpretation

Based on Bernheim and Rangel (2009)

When choices are based on an incorrect understanding of available consumption bundles, they are not welfare-relevant (*characterization failure*)

## Illustration: A choice between an apple and an orange

- When it is not dark, the individual correctly understands the options and chooses the orange
- When it is dark, the individual misunderstands the options, thinks the orange is a mandarin and chooses the apple
- Characterization failure occurs when it is dark
- We can use the choices made when it is not dark to evaluate the welfare loss from the choices made when it is dark

# Welfare Interpretation

## *Working Assumption:*

Characterization failure occurs with complex framing but not with simple framing



# Welfare Interpretation

## *Working Assumption:*

Characterization failure occurs with complex framing but not with simple framing

## *Maximal Welfare Loss:*

- Suppose, for equivalent options,  $V(s) = \$13$  and  $V(c) = \$18$
- If you are offered the complexly framed instrument for \$15, you will buy it, incurring a welfare loss of \$2
- The most you can lose is  $|V(s) - V(c)|$

# Welfare Interpretation

## *Working Assumption:*

Characterization failure occurs with complex framing but not with simple framing

## *Maximal Welfare Loss:*

- Suppose, for equivalent options,  $V(s) = \$13$  and  $V(c) = \$18$
- If you are offered the complexly framed instrument for \$15, you will buy it, incurring a welfare loss of \$2
- The most you can lose is  $|V(s) - V(c)|$

## *Expected Welfare Loss:*

- To a second-order approximation, proportional to  $(V(s) - V(c))^2$
- With uniformly distributed prices (as in our experiment), this formula is exact

# Welfare Interpretation

Benefits of evaluating financial competence based on *pairs of equivalent simply and complexly framed valuation tasks*:

# Welfare Interpretation

Benefits of evaluating financial competence based on *pairs of equivalent simply and complexly framed valuation tasks*:

- Paternalistic judgments are avoided

# Welfare Interpretation

Benefits of evaluating financial competence based on *pairs of equivalent simply and complexly framed valuation tasks*:

- Paternalistic judgments are avoided
- Yields quantitatively precise and rigorously justifiable welfare measures

# Welfare Interpretation

Benefits of evaluating financial competence based on *pairs of equivalent simply and complexly framed valuation tasks*:

- Paternalistic judgments are avoided
- Yields quantitatively precise and rigorously justifiable welfare measures
- Does not require one to have the right model of behavior (in contrast to the behavioral revealed preference approach)
  - No need to construct counterfactual behavior in the complexly framed decision problem based on “true preference”
  - No need to extrapolate measures of the welfare loss (equivalent or compensating variation) based on “true preferences”
  - The approach therefore has low information/modeling requirements and is easy to implement

# Welfare Interpretation

What if the working assumption is wrong?

# Welfare Interpretation

What if the working assumption is wrong?

*Alternative assumption:*

Characterization failure occurs with simple framing but not with complex framing. (Possible reason: familiarity with, and well-adapted heuristics for, more common instruments.)



# Welfare Interpretation

What if the working assumption is wrong?

*Alternative assumption:*

Characterization failure occurs with simple framing but not with complex framing. (Possible reason: familiarity with, and well-adapted heuristics for, more common instruments.)

*Why this possibility doesn't trouble us:*

- The welfare measures treat the simply and complexly framed problems symmetrically, so it wouldn't change

# Welfare Interpretation

What if the working assumption is wrong?

## *Alternative assumption:*

Characterization failure occurs with simple framing but not with complex framing. (Possible reason: familiarity with, and well-adapted heuristics for, more common instruments.)

## *Why this possibility doesn't trouble us:*

- The welfare measures treat the simply and complexly framed problems symmetrically, so it wouldn't change
- The assumption can be tested:
  - Does the individual spend more time making simply or complexly framed decisions?
  - Does financial education affect the simply framed or complexly framed decisions?

# Welfare Interpretation

*Another alternative assumption:*

Characterization failure with **both** simple framing and with complex framing.

# Welfare Interpretation

*Another alternative assumption:*

Characterization failure with **both** simple framing and with complex framing.

*Why this possibility doesn't trouble us:*

- Suppose we are also willing to assume that people think through complexly framed decision problems by converting them to simply framed ones (or the other way around)
  - Testable implication: financial education should affect decisions in the complexly framed problems, not in the simply framed ones

# Welfare Interpretation

*Another alternative assumption:*

Characterization failure with **both** simple framing and with complex framing.

*Why this possibility doesn't trouble us:*

- Suppose we are also willing to assume that people think through complexly framed decision problems by converting them to simply framed ones (or the other way around)
  - Testable implication: financial education should affect decisions in the complexly framed problems, not in the simply framed ones
- Then we are measuring the welfare loss the consumer would incur if her understanding of the relationship between intermediate outcomes and consumption bundles were correct.
  - Does not measure the overall welfare loss, but does tell us how the misunderstanding of the relation between complexly framed instruments and intermediate outcomes contributes to that loss

# Applications

*Features of typical adult financial education intervention:*

# Applications

## *Features of typical adult financial education intervention:*

- Brevity is a design constraint
  - Fernandes et al. (2014): Typical financial education intervention involves less than 10 hours of instruction in total
  - Skimmyhorn (2015): Financial education program used by US Military covers multiple topics (compound interest, retirement concepts, Thrift and Savings Plan, military retirement programs, investments) in a single 2-hour session

# Applications

## *Features of typical adult financial education intervention:*

- Brevity is a design constraint
  - Fernandes et al. (2014): Typical financial education intervention involves less than 10 hours of instruction in total
  - Skimmyhorn (2015): Financial education program used by US Military covers multiple topics (compound interest, retirement concepts, Thrift and Savings Plan, military retirement programs, investments) in a single 2-hour session
- Focus on simple, memorable, and potentially useful heuristics accompanied by highly motivating messages
  - Possibly optimal given the constraint of brevity



# Intervention #1: Compound Interest

Ambuehl, Bernheim, and Lusardi (2015)

- Core topic in most financial education courses
- Generally taught in very short modules focusing on heuristics and simple motivational messages, and hence suitable for limited experimental intervention
- Addresses a known bias (*exponential growth bias* -- Eisenstein and Hoch, 2007, Stango and Zinman, 2009, Levy and Tasoff, 2014)

## A preview of the findings:

- Based on conventional measures, the intervention appears to achieve the right effects for the right reasons:
  - Financial literacy increases significantly
  - People report that they use their improved knowledge when making their choices
  - Behavior changes significantly, and in a direction that counteracts a known bias
  - All these effects are very large and highly significant

## A preview of the findings:

- Based on conventional measures, the intervention appears to achieve the right effects for the right reasons:
  - Financial literacy increases significantly
  - People report that they use their improved knowledge when making their choices
  - Behavior changes significantly, and in a direction that counteracts a known bias
  - All these effects are very large and highly significant
- However, the intervention does not improve financial competence (welfare). Reasons:
  - Notwithstanding the above, the effect on behavior results from motivational rhetoric, not substance
  - The impact is indiscriminate, and not related to the initial bias

# Structure of Experiment

1. Initial financial literacy quiz
2. Educational intervention
3. Decision problems
4. Survey questions, including test on compound interest

## Financial education intervention

- Section on compound interest from a leading book on personal financial decision making
  - Malkiel and Ellis, *The Elements of Investing: Easy Lessons for Every Investor*
  - Widely used
  - Standard treatment of compound interest, with simple examples
  - Short, extremely well-exposed
  - “Naturalistic” intervention
- Presented as a video (narrated slides) in the style of Khan Academy

## Components of the intervention

- Simple explanation of compound interest, including an example (iterative calculation)

## Components of the intervention

- Simple explanation of compound interest, including an example (iterative calculation)
- Explanation and application of the Rule of 72
  - $(\% \text{ interest rate}) \times (\text{doubling period}) = 72$
  - 5 illustrative calculations

## Components of the intervention

- Simple explanation of compound interest, including an example (iterative calculation)
- Explanation and application of the Rule of 72
  - $(\% \text{ interest rate}) \times (\text{doubling period}) = 72$
  - 5 illustrative calculations
- Rhetoric and exhortations
  - Quotes, e.g. “Albert Einstein is said to have described compound interest as the most powerful force in the universe“
  - Examples in which relatively small initial investments grow to millions of dollars (calculations not included)
  - Exhortations, e.g. “The power of compounding is why everyone agrees that saving early in life and investing is good for you.”



## Treatments

- We want to determine whether the behavioral effects of financial education (if any) are attributable to substance or motivational rhetoric

## Treatments

- We want to determine whether the behavioral effects of financial education (if any) are attributable to substance or motivational rhetoric
- 2x2 design, across-subject design
  - Substance (Rule of 72) - yes/no
  - Rhetoric – yes/no

## Treatments

- We want to determine whether the behavioral effects of financial education (if any) are attributable to substance or motivational rhetoric
- 2x2 design, across-subject design
  - Substance (Rule of 72) - yes/no
  - Rhetoric – yes/no
- So we have four treatment groups:
  - Full intervention
  - Substance-only intervention (no rhetoric)
  - Rhetoric-only intervention (no rule of 72)
  - Control (video based on unrelated material from same book)

## Decision problems

- Elicit valuations for 20 future rewards (10 pairs)
  - Simple framing: “We will pay you \$20 in 72 days”
  - Complex framing: “We will invest \$10 at an interest rate of 1% per day. Interest is compounded daily. We will pay you those proceeds in 72 days.”

## Decision problems

- Elicit valuations for 20 future rewards (10 pairs)
  - Simple framing: “We will pay you \$20 in 72 days”
  - Complex framing: “We will invest \$10 at an interest rate of 1% per day. Interest is compounded daily. We will pay you those proceeds in 72 days.”
- Some details:
  - Time horizon is either 36 or 72 days (simplifies application of the rule)
  - Order randomized at the individual level
  - Paired problems are not identified as such
  - Elicited using (iterated) multiple price lists

## Multiple price list (complexly framed version)

	you will get the specified dollar amount within two days from today	we will invest \$2 in an account with 5% interest per day. Interest is compounded daily. We will pay you the proceeds in 36 days.
\$20	<input checked="" type="radio"/>	<input type="radio"/>
\$18	<input checked="" type="radio"/>	<input type="radio"/>
\$16	<input type="radio"/>	<input checked="" type="radio"/>
\$14	<input type="radio"/>	<input checked="" type="radio"/>

## Multiple price list (complexly framed version)

	you will get the specified dollar amount within two days from today	we will invest \$2 in an account with 5% interest per day. Interest is compounded daily. We will pay you the proceeds in 36 days.
\$ 17.8	<input type="radio"/>	<input type="radio"/>
\$ 17.6	<input type="radio"/>	<input type="radio"/>
\$ 17.4	<input type="radio"/>	<input type="radio"/>
\$ 17.2	<input type="radio"/>	<input type="radio"/>
\$ 17	<input type="radio"/>	<input type="radio"/>

## Test on compound interest

- Incentivized
- 5 questions, e.g.
  - If someone tells you an investment will double in four years, what rate of return (per year) is he promising? 15%, 16%, 17%, 18%, 19%, 20%
  - If an investment grows at 8% per year (interest is compounded annually), how much has it grown in four years? 30%, 31%, 32%,..., 40%



## Test on compound interest

- Incentivized
- 5 questions, e.g.
  - If someone tells you an investment will double in four years, what rate of return (per year) is he promising? 15%, 16%, 17%, 18%, 19%, 20%
  - If an investment grows at 8% per year (interest is compounded annually), how much has it grown in four years? 30%, 31%, 32%,..., 40%

## Self-reports about decision process

- Whether used the Rule of 72
- Whether used mathematical calculations
- Whether obtained help

## Payments

- \$10 for completing the experiment
- On average, an additional payment of \$15
  - 75% of subjects paid based on their choices
  - 25% paid based on their tests

## Payments

- \$10 for completing the experiment
- On average, an additional payment of \$15
  - 75% of subjects paid based on their choices
  - 25% paid based on their tests

Sessions took approximately 1 hour to complete

## Data

- Subjects recruited (and paid) through Amazon Mechanical Turk

## Data

- Subjects recruited (and paid) through Amazon Mechanical Turk
- Demographics relative to US population
  - Younger (20s and 30s)
  - Lower income
  - More highly educated, with higher financial literacy
  - Slightly more likely to be employed
  - Whites and males overrepresented

## Data

- Subjects recruited (and paid) through Amazon Mechanical Turk
- Demographics relative to US population
  - Younger (20s and 30s)
  - Lower income
  - More highly educated, with higher financial literacy
  - Slightly more likely to be employed
  - Whites and males overrepresented
- Advantageous features for our purposes
  - Over-represents some target populations (young, low income)
  - Highly motivated by rewards

- Subjects took the tasks seriously
  - Very low attrition (only 4 subjects who could have seen a treatment video)
  - Unsolicited feedback
  - Coherent choice patterns

- Subjects took the tasks seriously
  - Very low attrition (only 4 subjects who could have seen a treatment video)
  - Unsolicited feedback
  - Coherent choice patterns
- 106-128 subjects per treatment (455 in total)
  - After dropping multiple switchers (9.7% of subjects)



- Subjects took the tasks seriously
  - Very low attrition (only 4 subjects who could have seen a treatment video)
  - Unsolicited feedback
  - Coherent choice patterns
- 106-128 subjects per treatment (455 in total)
  - After dropping multiple switchers (9.7% of subjects)
- Time preferences (based only on simply framed choices)
  - Not significantly different across treatments
  - Mean discounts rates:
    - 36 days: 76.7%
    - 72 days: 70.6%

## Notable features of study

- Exploration of financial competence & welfare is novel

## Notable features of study

- Exploration of financial competence & welfare is novel
- Use of experiments to isolate causality is part of emerging trend in this sub-literature

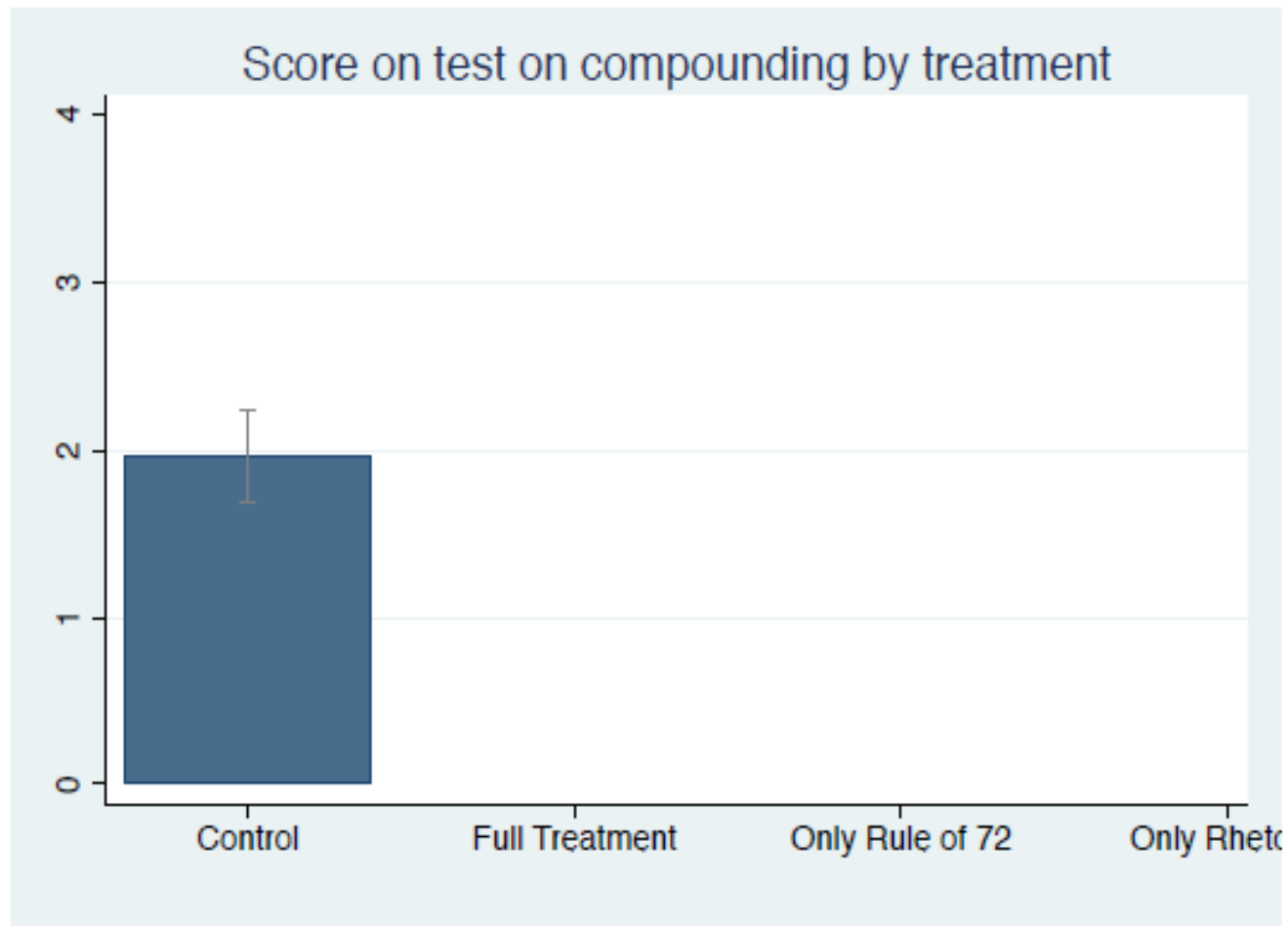
## Notable features of study

- Exploration of financial competence & welfare is novel
- Use of experiments to isolate causality is part of emerging trend in this sub-literature
- Focus is on a narrow intervention, and a closely linked decision skill
  - Contrasts with much of the literature, which focuses on broad, composite, heterogeneous interventions, and loosely relate decisions
  - May account for mixed findings
  - Disagree with call in Hastings et al. (2013) for studies of “large scale interventions”

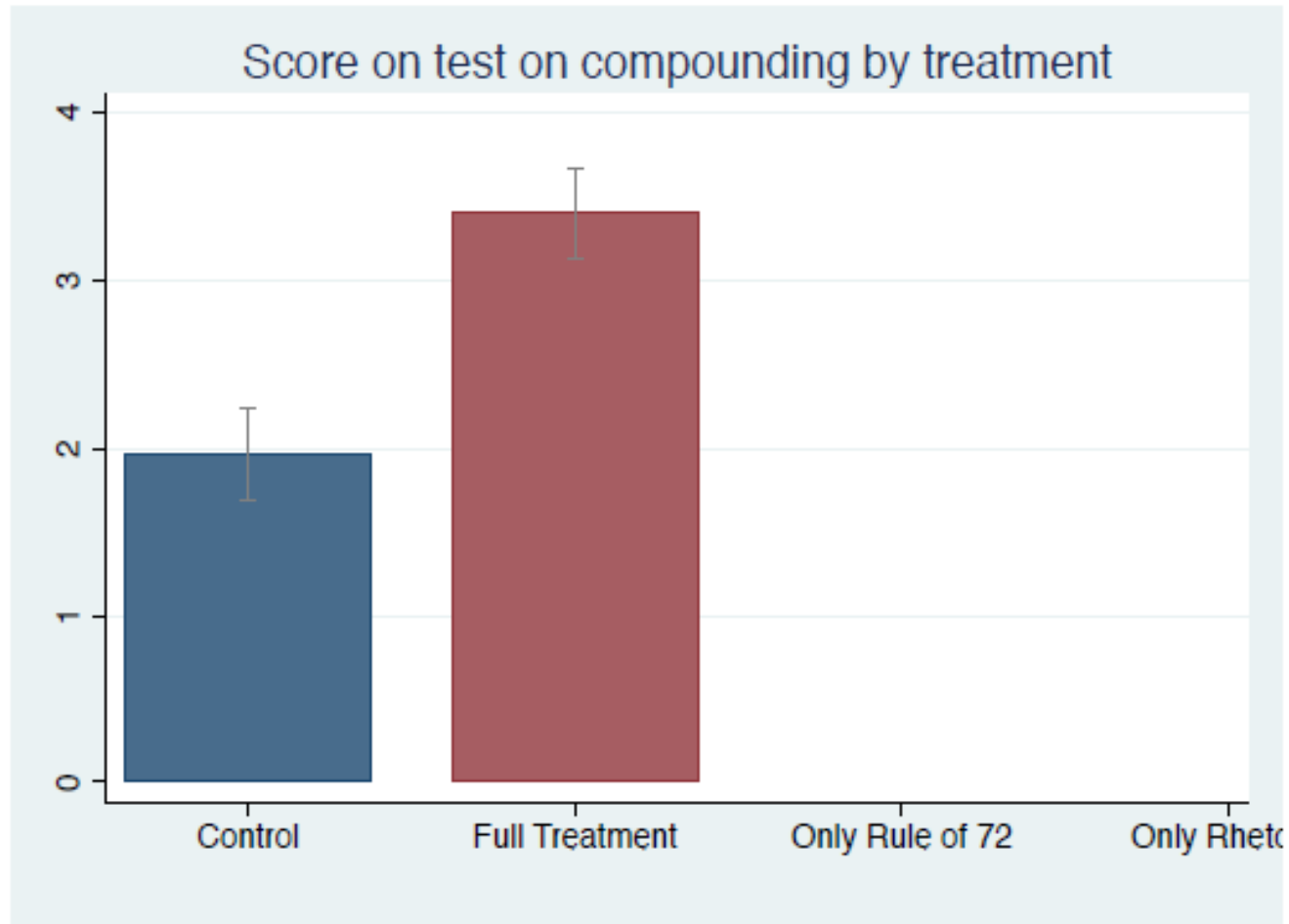
## Notable features of study

- Exploration of financial competence & welfare is novel
- Use of experiments to isolate causality is part of emerging trend in this sub-literature
- Focus is on a narrow intervention, and a closely linked decision skill
  - Contrasts with much of the literature, which focuses on broad, composite, heterogeneous interventions, and loosely relate decisions
  - May account for mixed findings
  - Disagree with call in Hastings et al. (2013) for studies of “large scale interventions”
- Allows for population heterogeneity with respect to effects of education

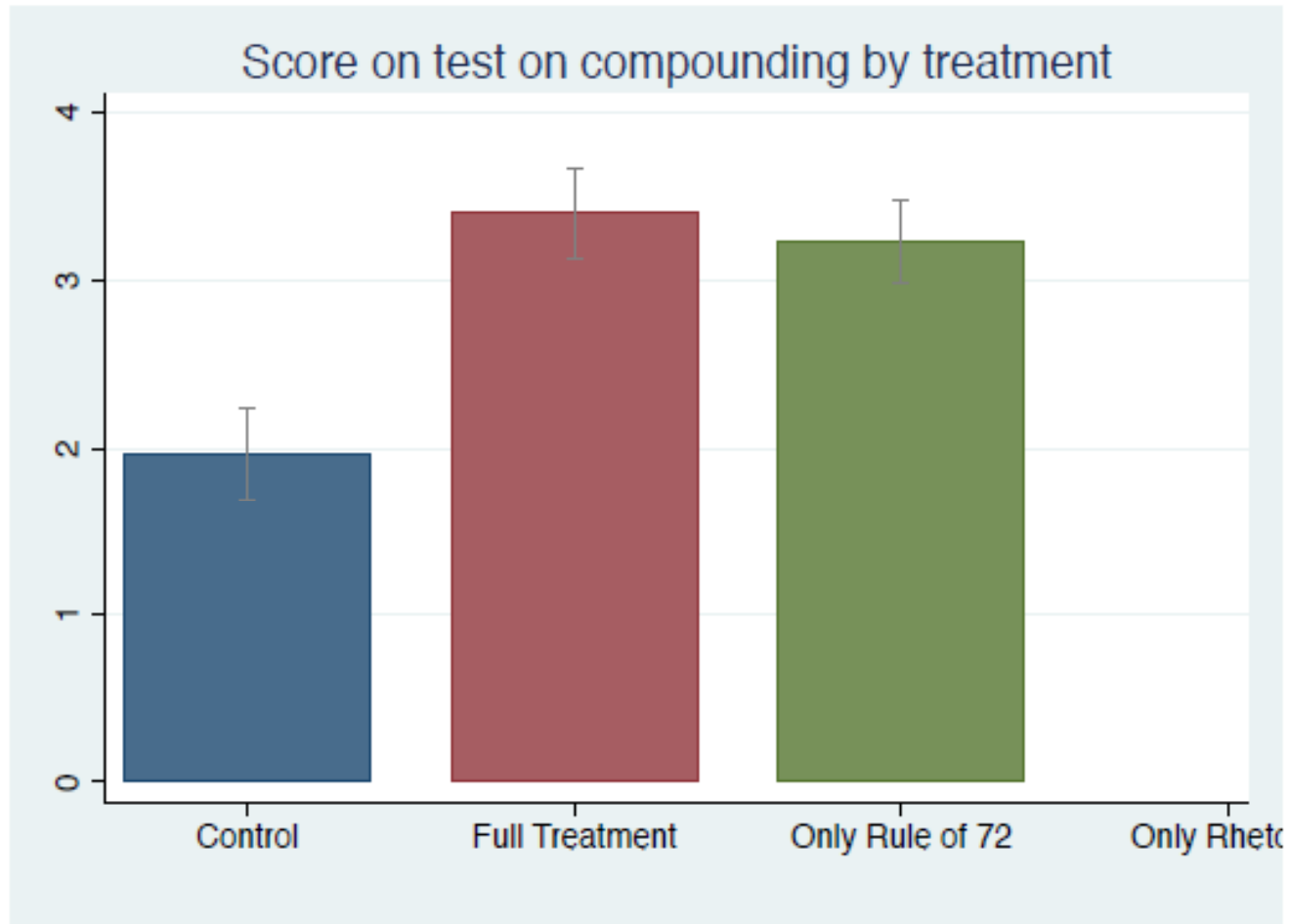
# Test Scores



# Test Scores

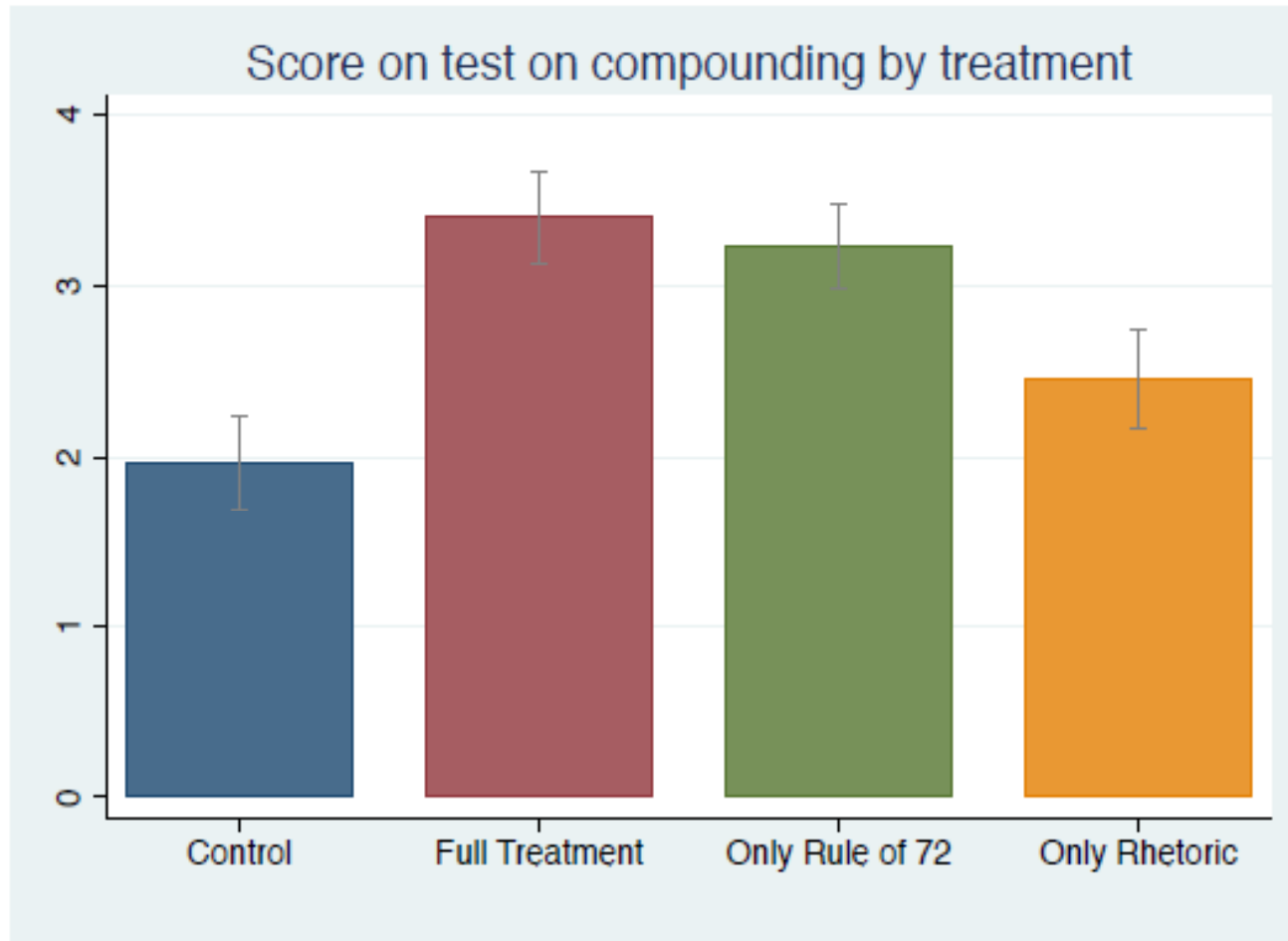


# Test Scores

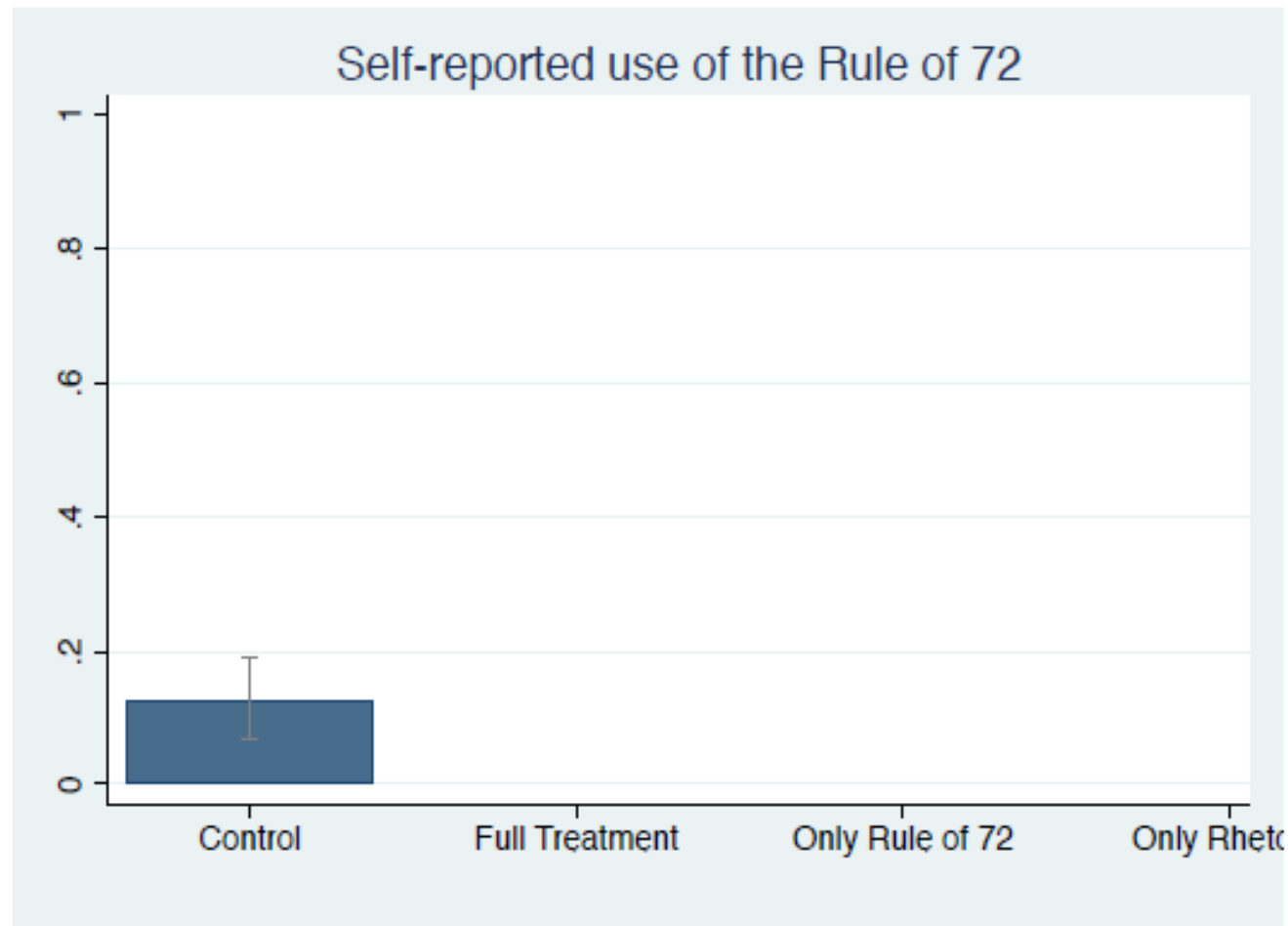




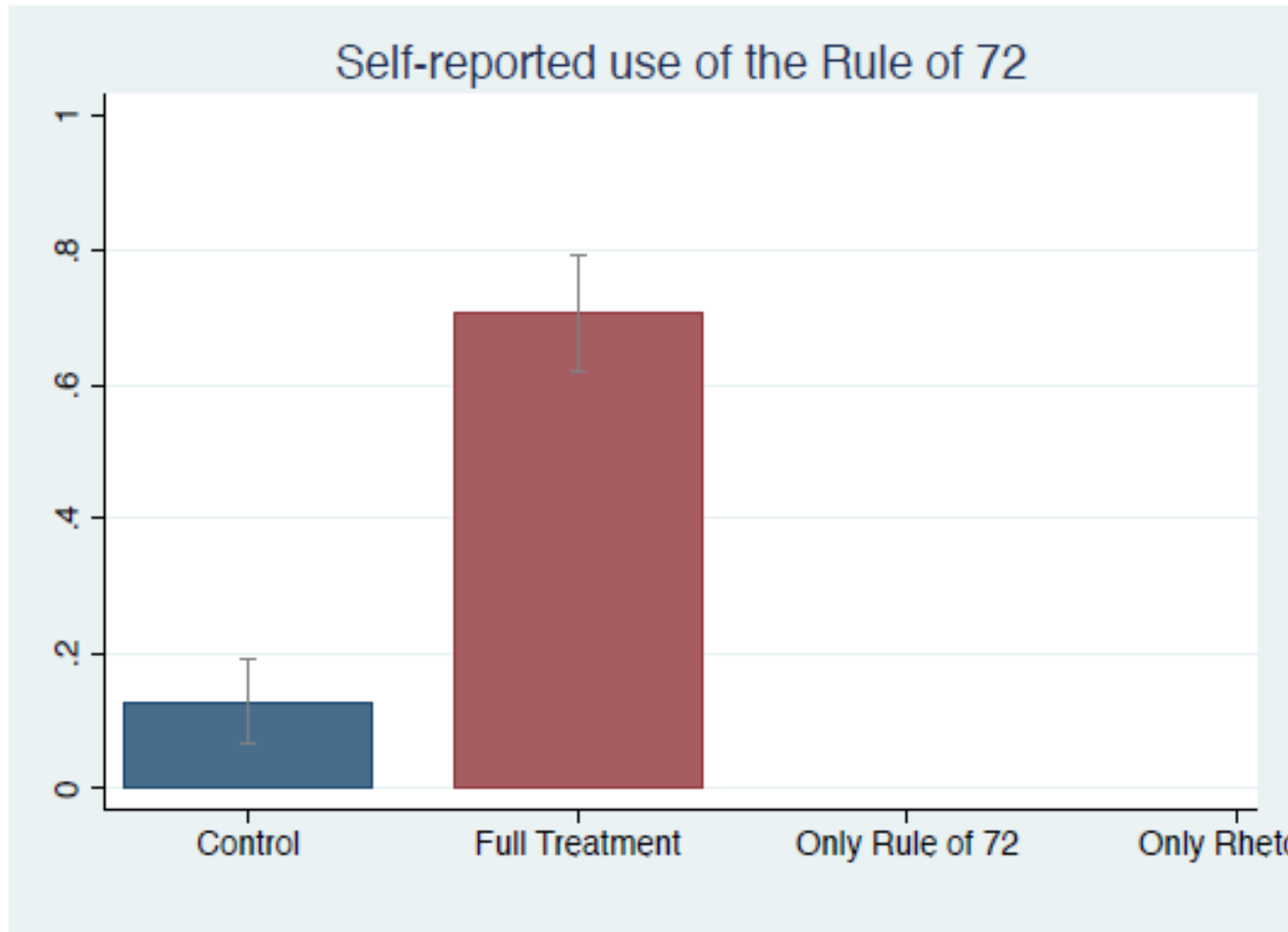
# Test Scores



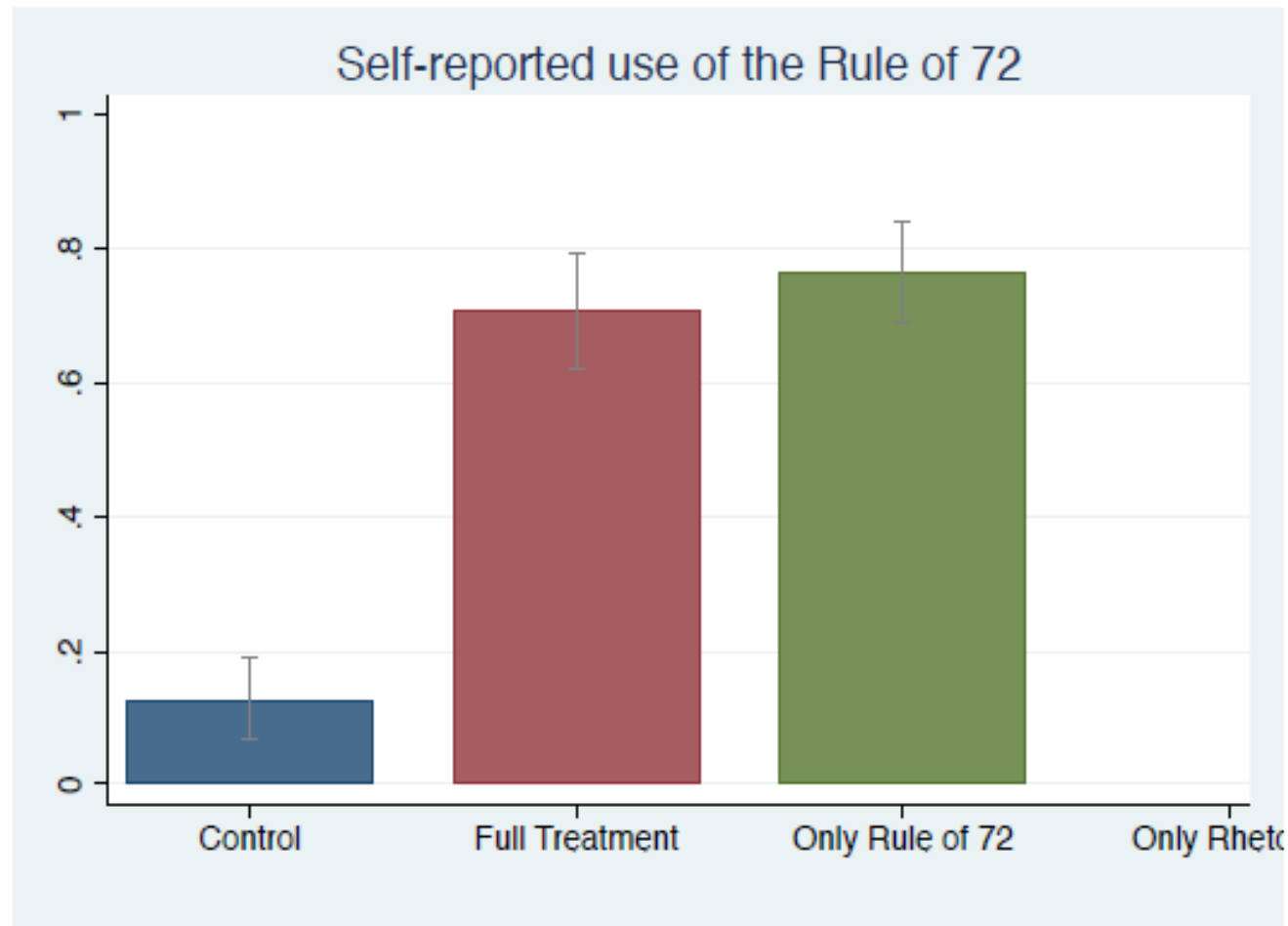
# Self-reported use of the rule of 72 for complex framing



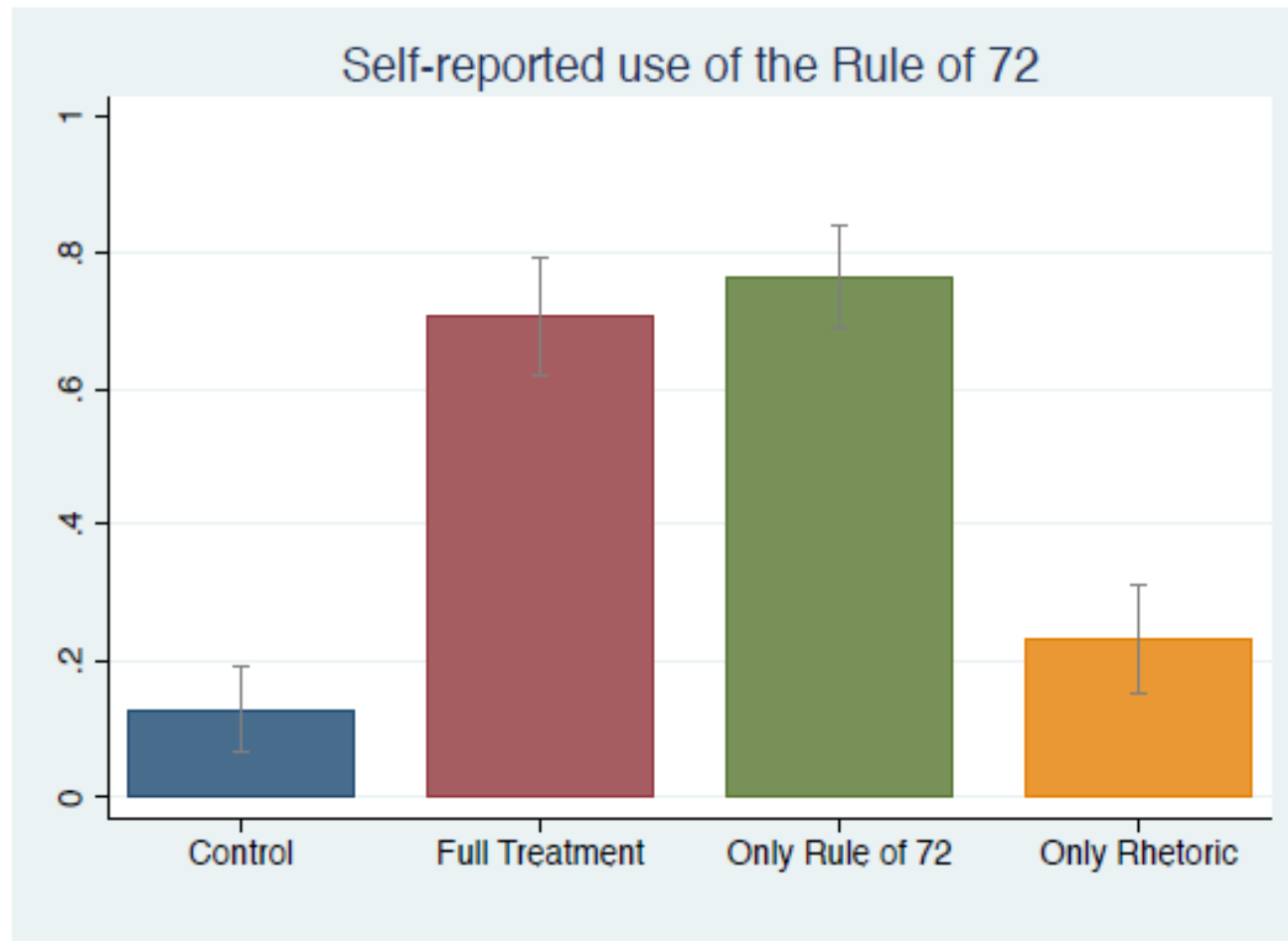
# Self-reported use of the rule of 72 for complex framing



# Self-reported use of the rule of 72 for complex framing



# Self-reported use of the rule of 72 for complex framing



## Some related findings

- Results for “using explicit calculations” is very similar to results for “using Rule of 72”
  - Effects for full and substance-only treatments are large, significant, and about the same
  - Effect for rhetoric only treatment is small and insignificant
  - No indication that people are substituting away from other types of calculations (such as use of the exponential formula or iteration)

## Some related findings

- Results for “using explicit calculations” is very similar to results for “using Rule of 72”
  - Effects for full and substance-only treatments are large, significant, and about the same
  - Effect for rhetoric only treatment is small and insignificant
  - No indication that people are substituting away from other types of calculations (such as use of the exponential formula or iteration)
- Use of external help was low in the control group (around 20%), and was not affected by the treatments
  - Financial literacy is therefore relevant (because people are not turning to authoritative sources)
  - Education does not displace advice

## Average framing distortion

- Define the *discount factor* as the ratio of current value to future value



## Average framing distortion

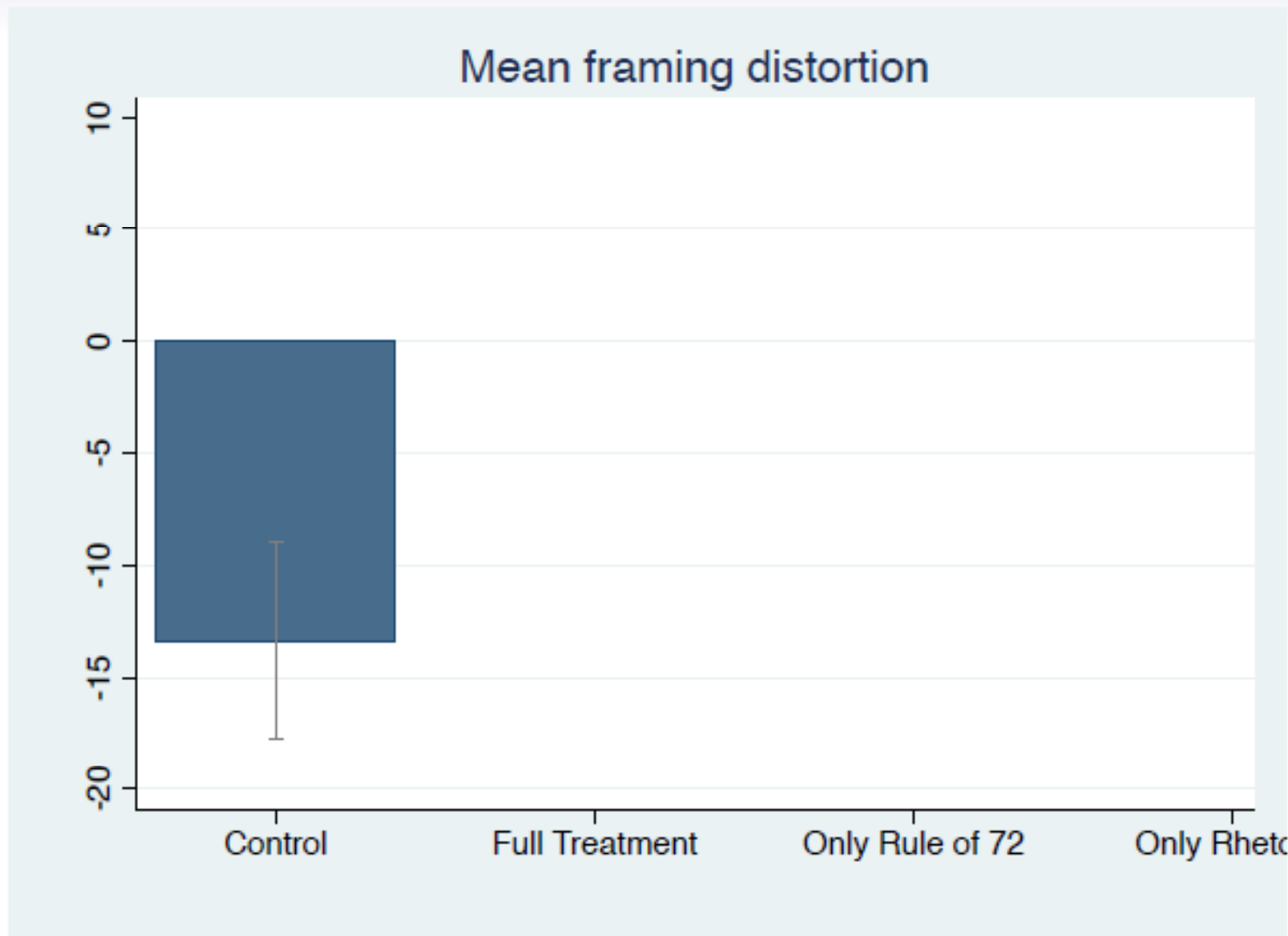
- Define the *discount factor* as the ratio of current value to future value
- For a given task, let  $d_s$  be the discount factor with simple framing, and let  $d_c$  be the discount factor with complex framing

## Average framing distortion

- Define the *discount factor* as the ratio of current value to future value
- For a given task, let  $d_s$  be the discount factor with simple framing, and let  $d_c$  be the discount factor with complex framing
- The *framing distortion* is  $d_c - d_s$

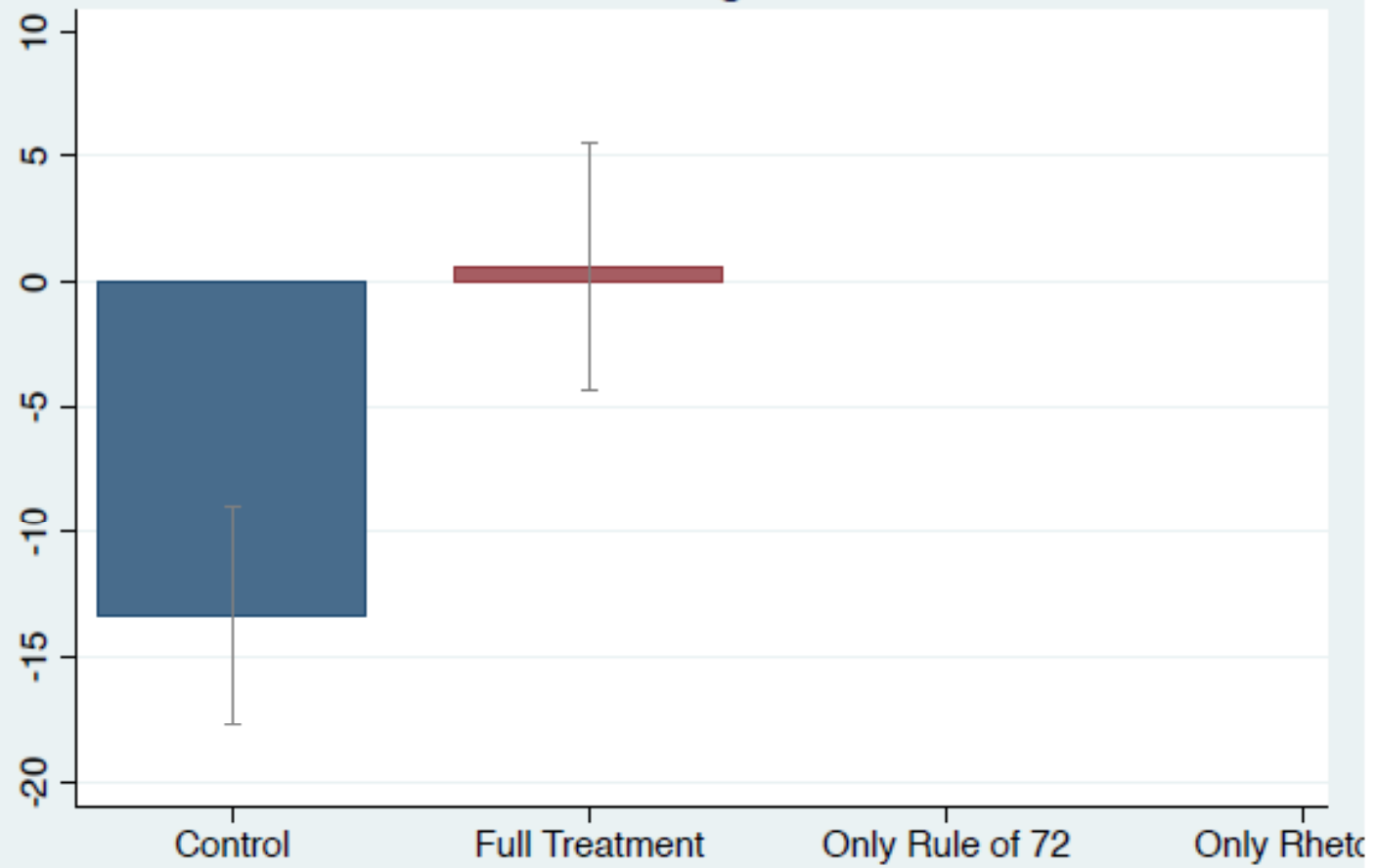
## Average framing distortion

- Define the *discount factor* as the ratio of current value to future value
- For a given task, let  $d_s$  be the discount factor with simple framing, and let  $d_c$  be the discount factor with complex framing
- The *framing distortion* is  $d_c - d_s$
- For someone who underappreciates compound interest (suffers from exponential growth bias), the framing distortion will be negative



(pooled over time horizons)

Mean framing distortion



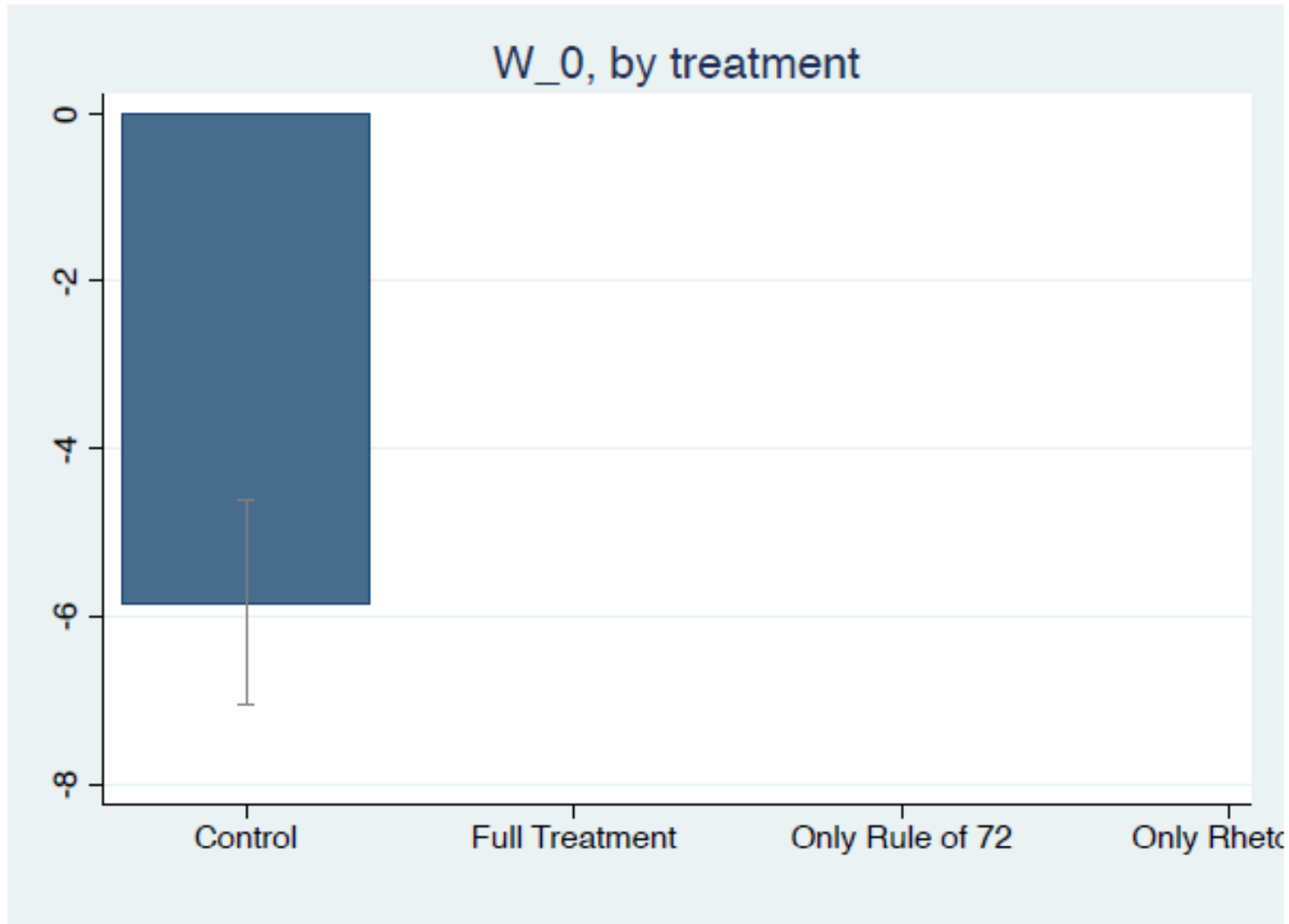
## *Pause to consider results so far*

- Effects of financial education:
  - Improves financial literacy
  - Increases the (self-reported) use of the Rule of 72 in decisions
  - Increases the (self-reported) use of explicit calculations
  - The preceding results are due to substantive content, and not to rhetoric
  - Does not reduce other sources of assistance
  - On average, *eliminates* the framing distortion in decisions

## *Pause to consider results so far*

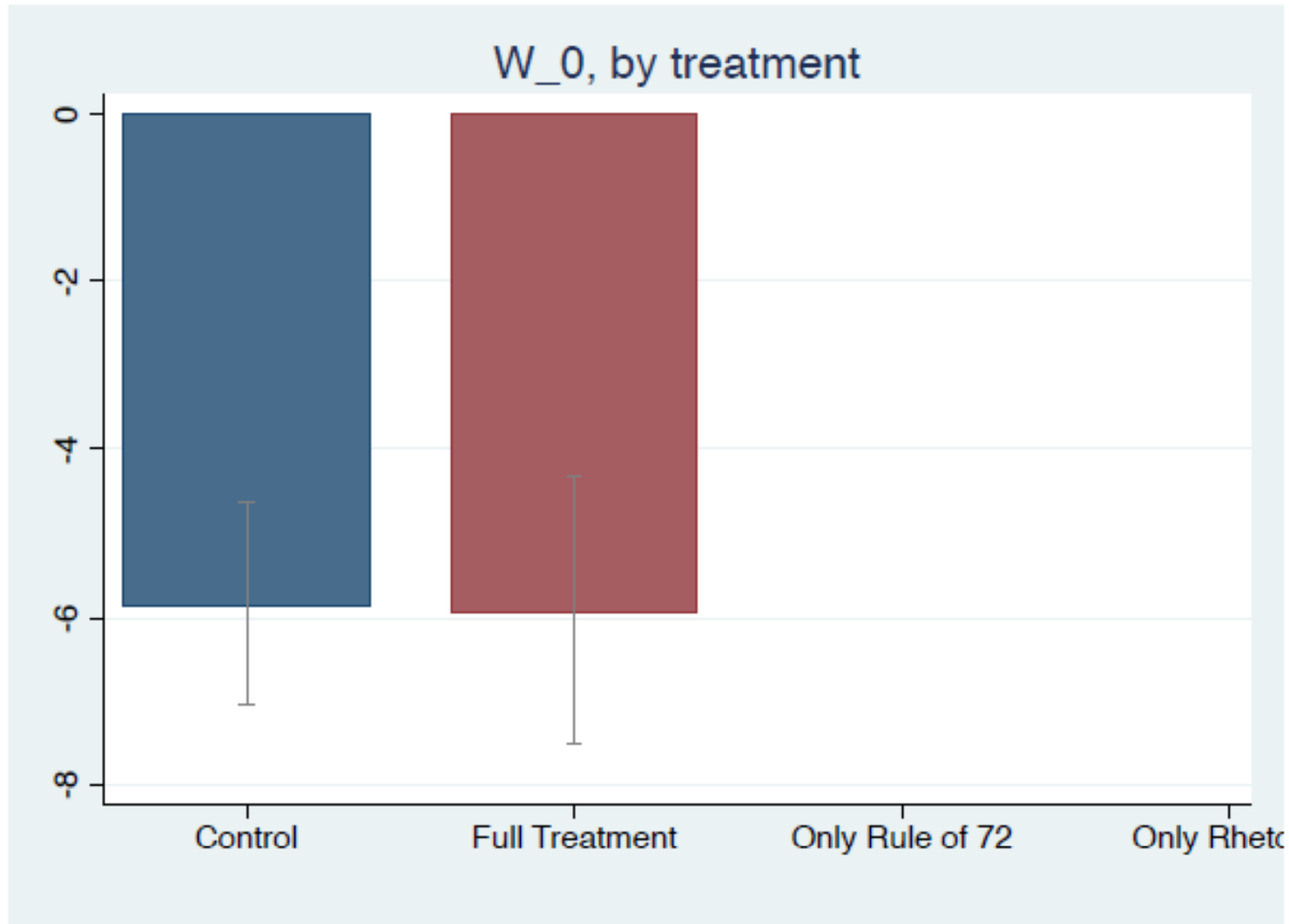
- Effects of financial education:
  - Improves financial literacy
  - Increases the (self-reported) use of the Rule of 72 in decisions
  - Increases the (self-reported) use of explicit calculations
  - The preceding results are due to substantive content, and not to rhetoric
  - Does not reduce other sources of assistance
  - On average, *eliminates* the framing distortion in decisions
- Sounds like full treatment has the right effect on behavior for all the right reasons. So let's look at welfare.

## Effect of treatments on welfare



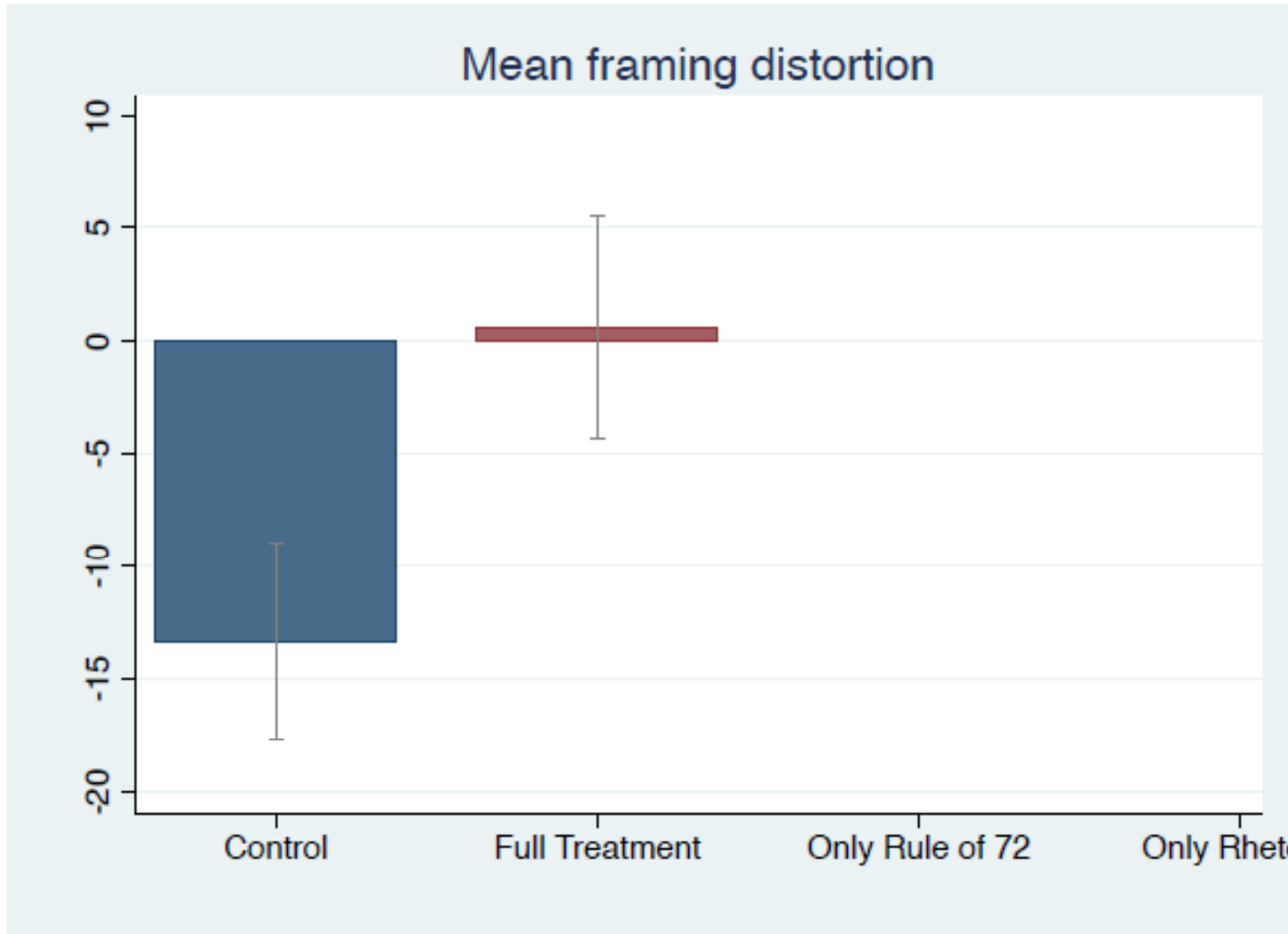


## Effect of treatments on welfare

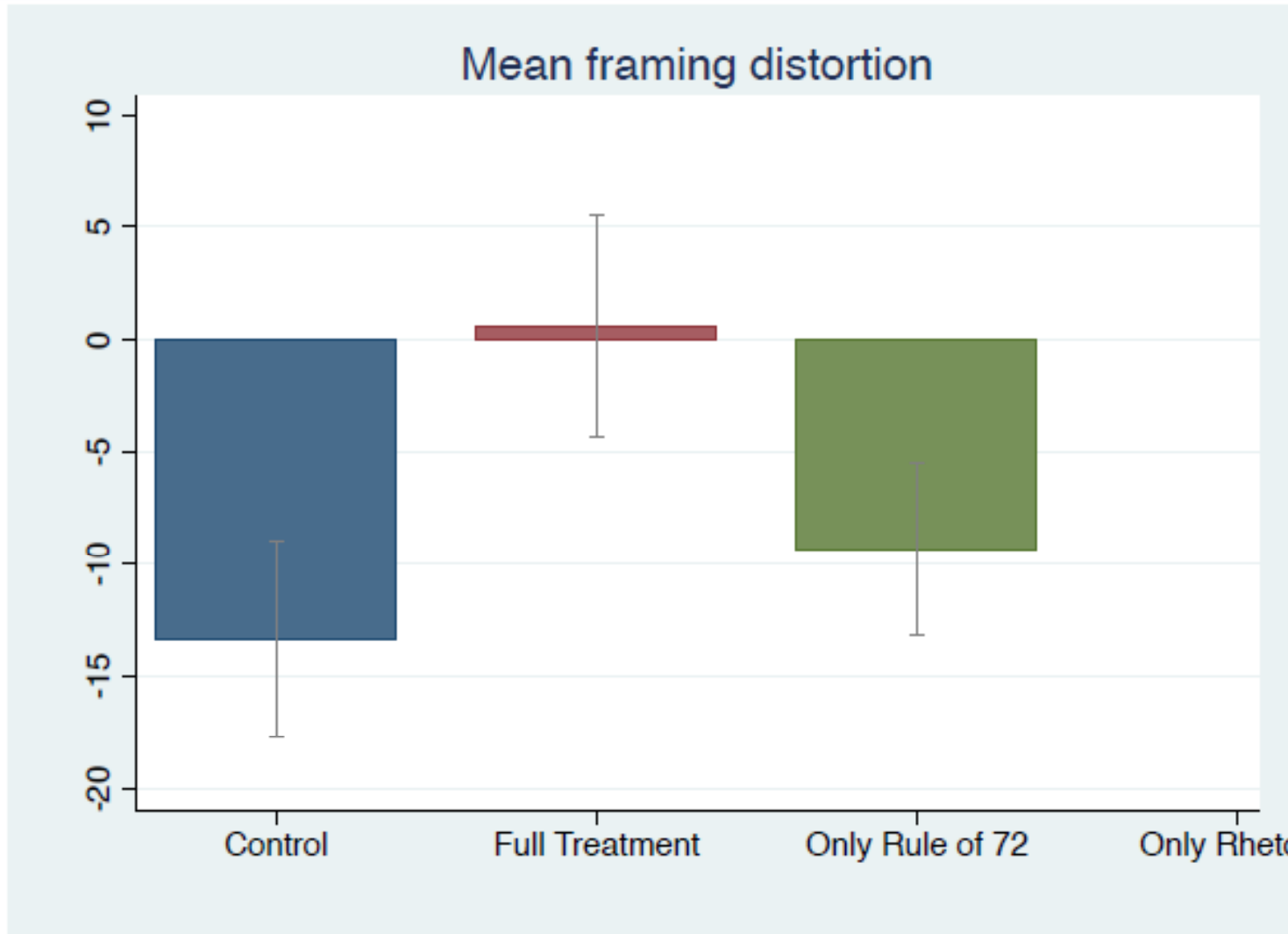


*WHAT???*

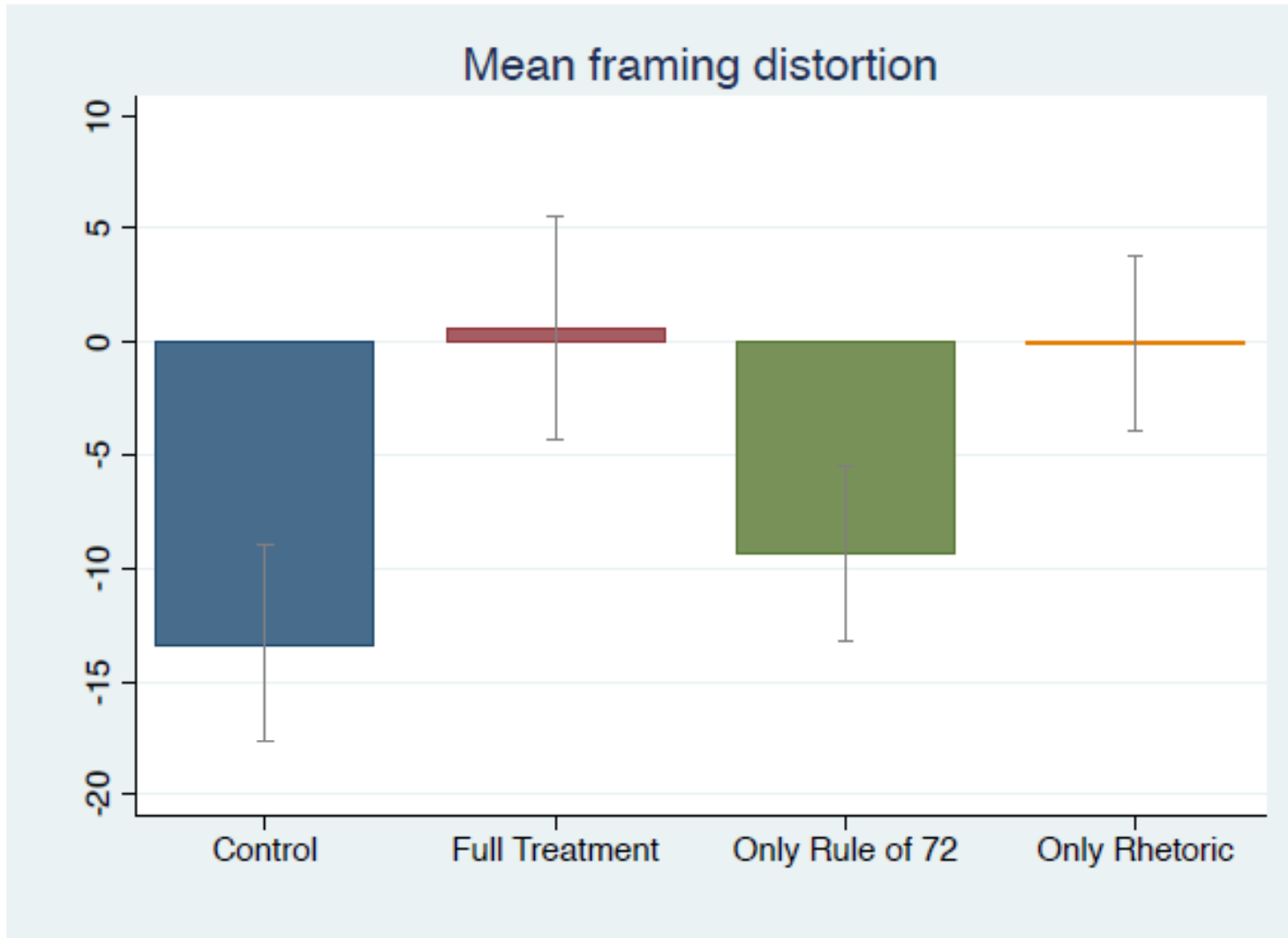
Let's have another look at the mean framing distortion:



Let's have another look at the mean framing distortion:



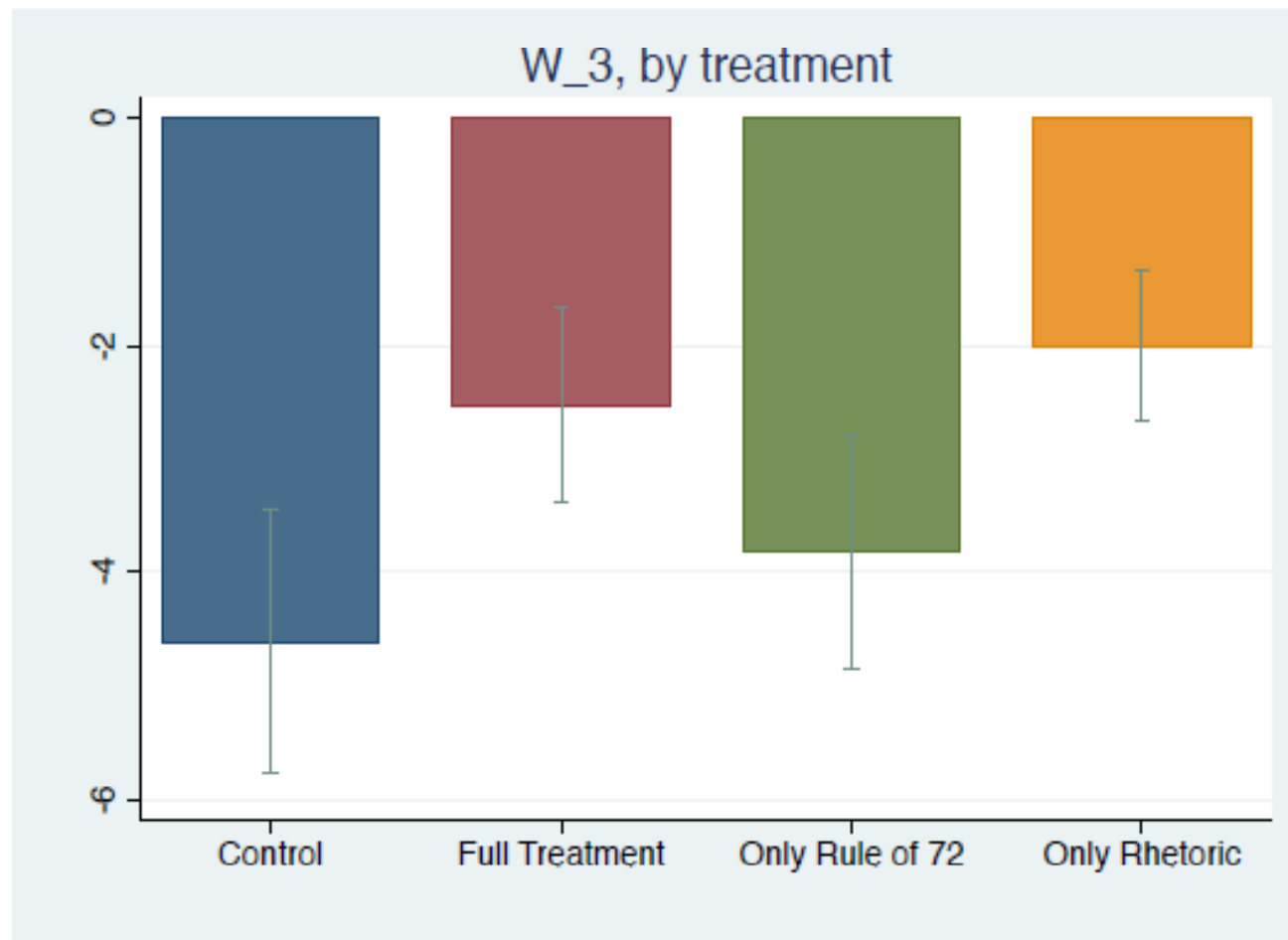
Let's have another look at the mean framing distortion:



- So despite the effects on literacy, self-reported decision making strategies, and the elimination (on average) of exponential growth bias, the effect on *decisions* comes from motivational rhetoric, not substance
- Moreover, the effect of rhetoric is apparently haphazard and unrelated to the initial degree of bias

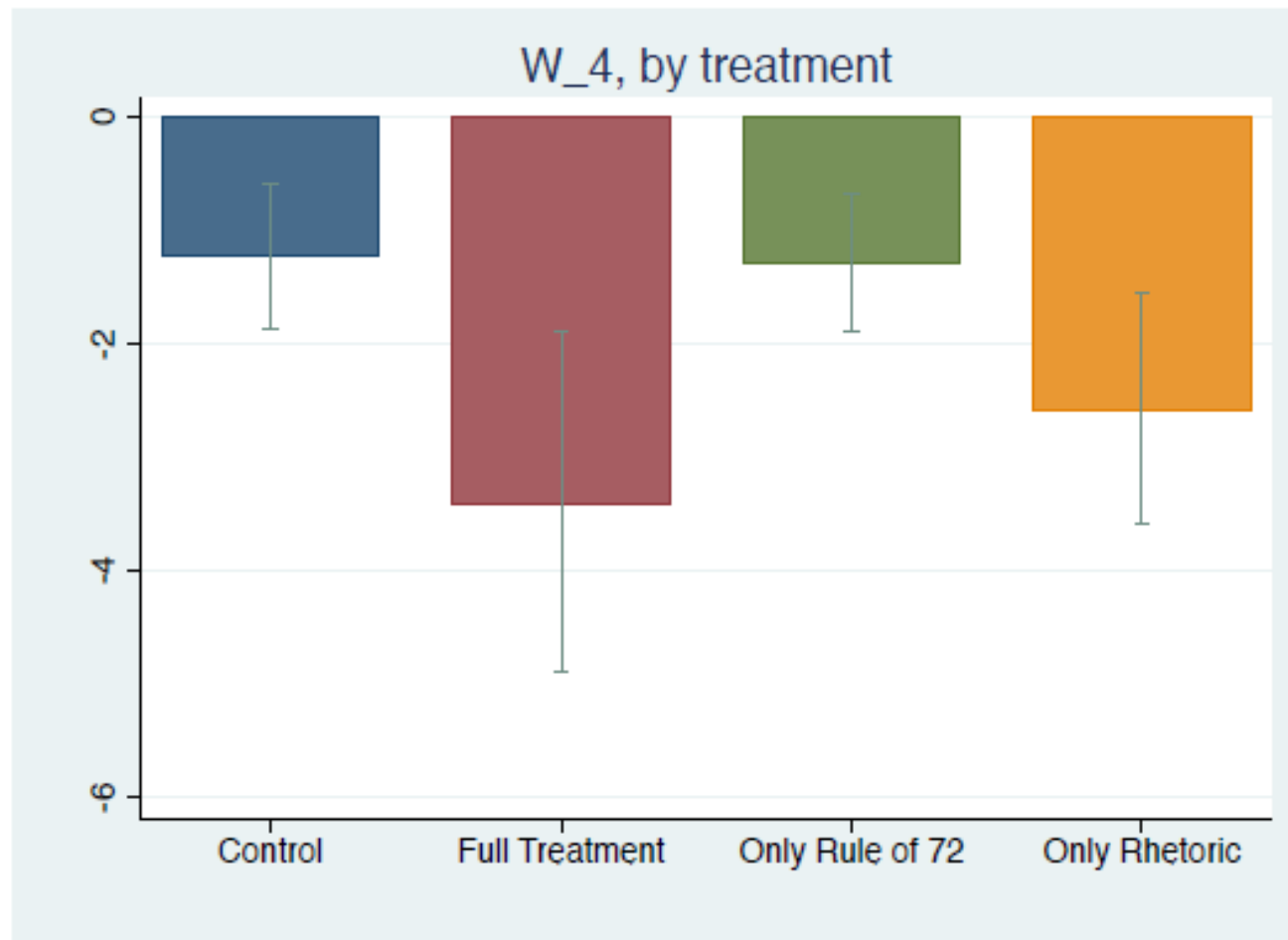
Counting only *under-estimation* of compound interest:

$$W_3 = \frac{1}{2}(\min\{d_{i,r,t}, 0\})^2$$



Counting only *over-estimation* of compound interest:

$$W_4 = \frac{1}{2}(\min\{0, -d_{i,r,t}\})^2$$

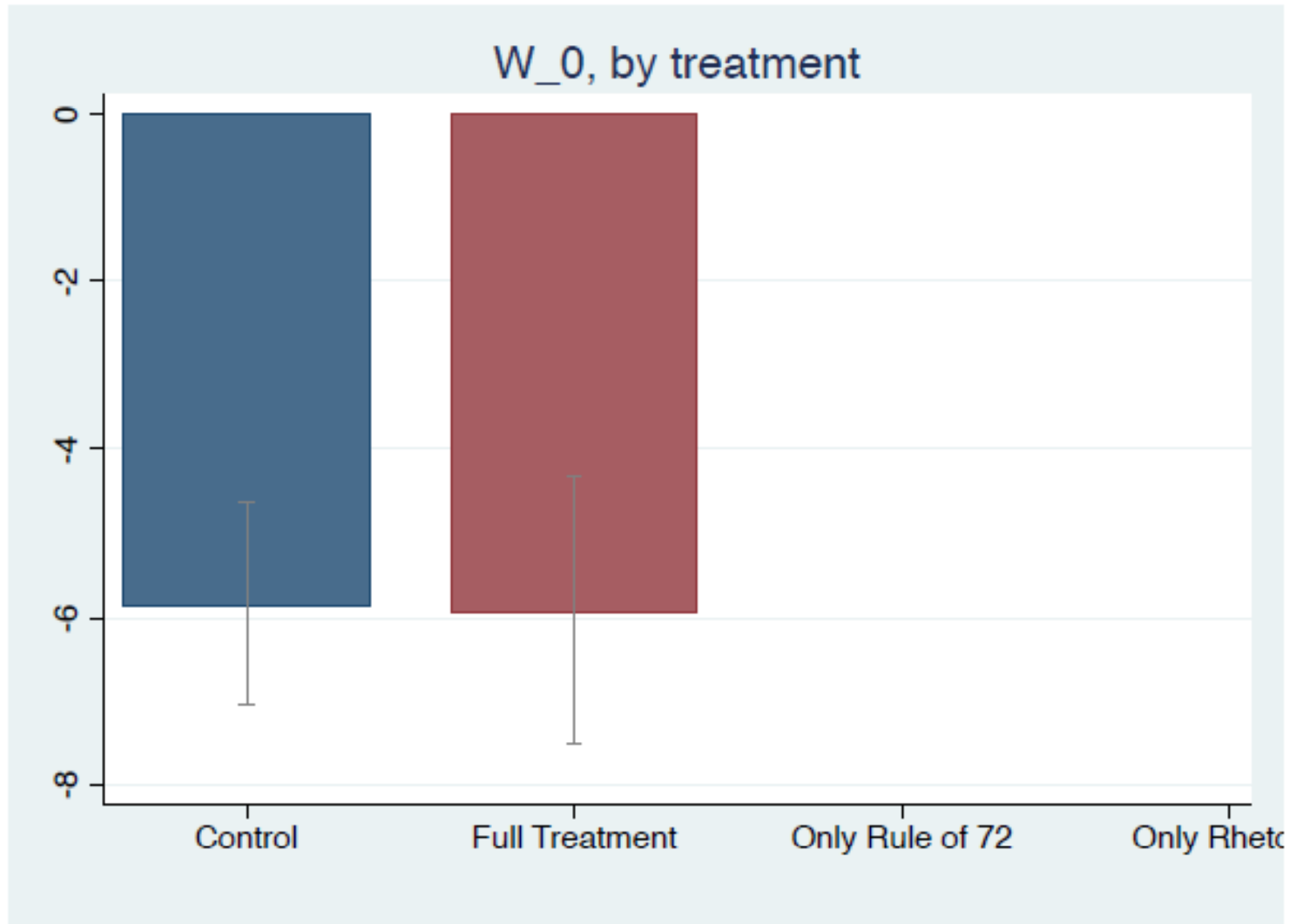


The Full and Rhetoric treatments change behavior by introducing a *countervailing bias*.

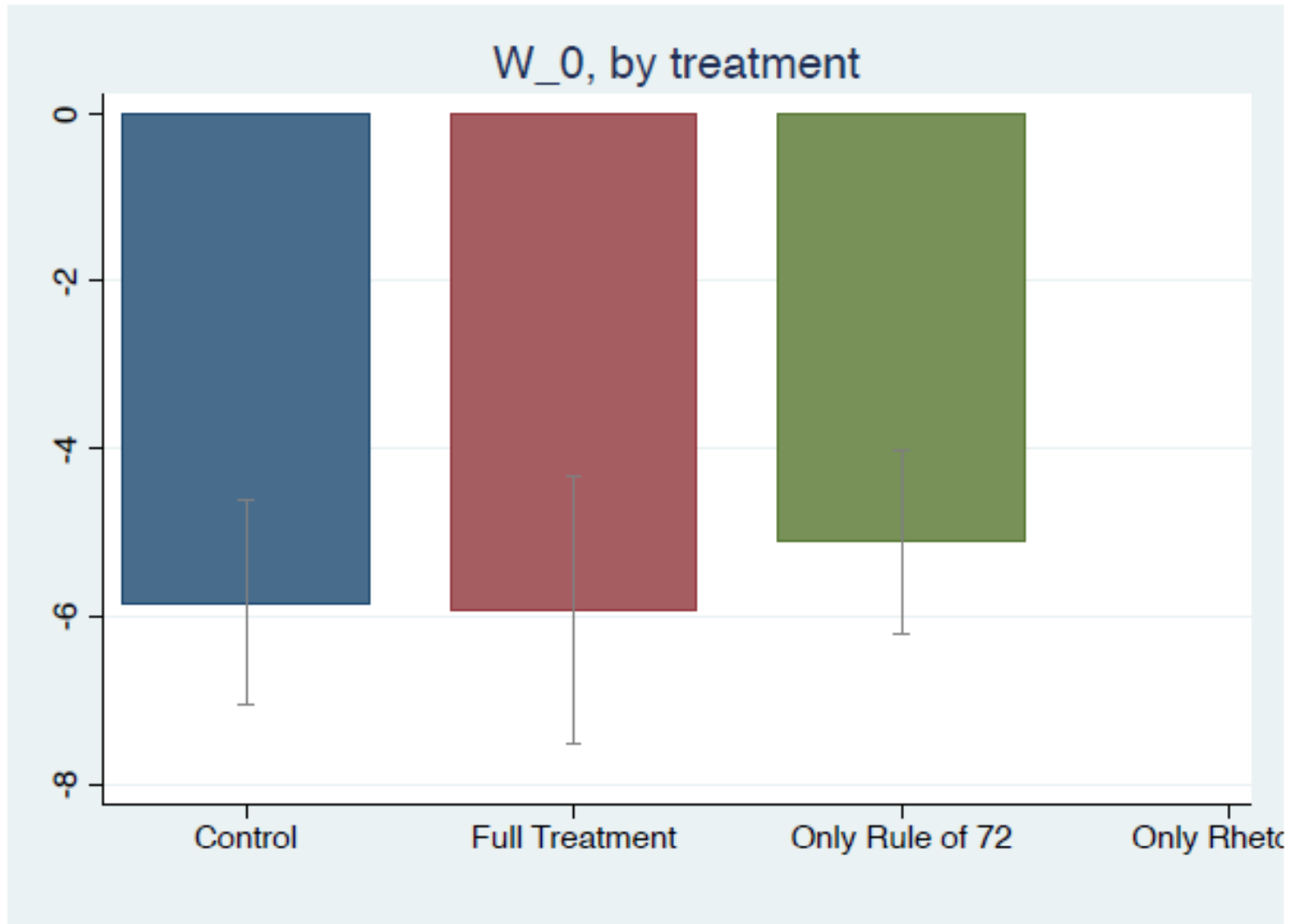


So let's return to the welfare results – what about the other treatments?

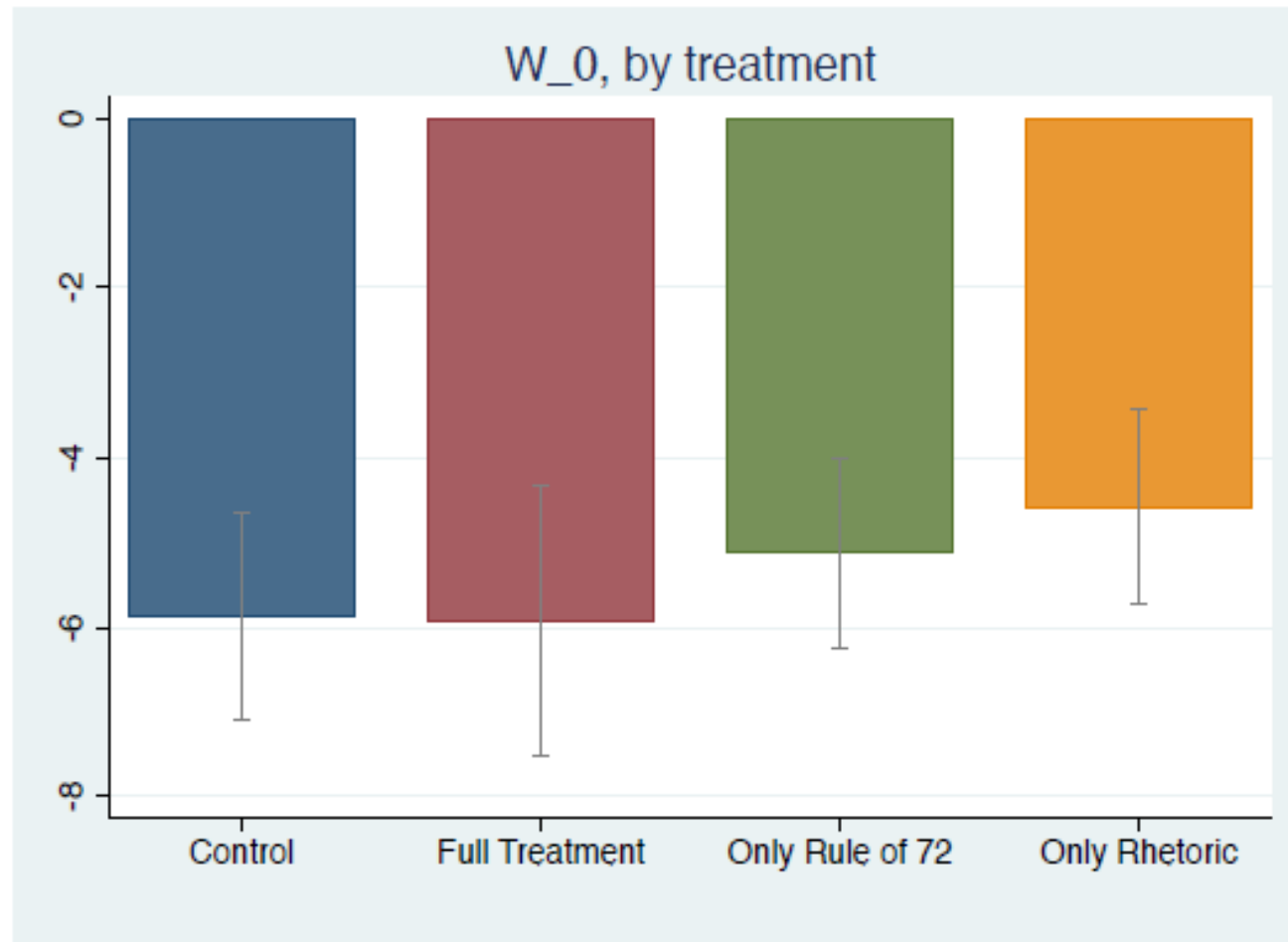
## Effect of treatments on welfare



## Effect of treatments on welfare

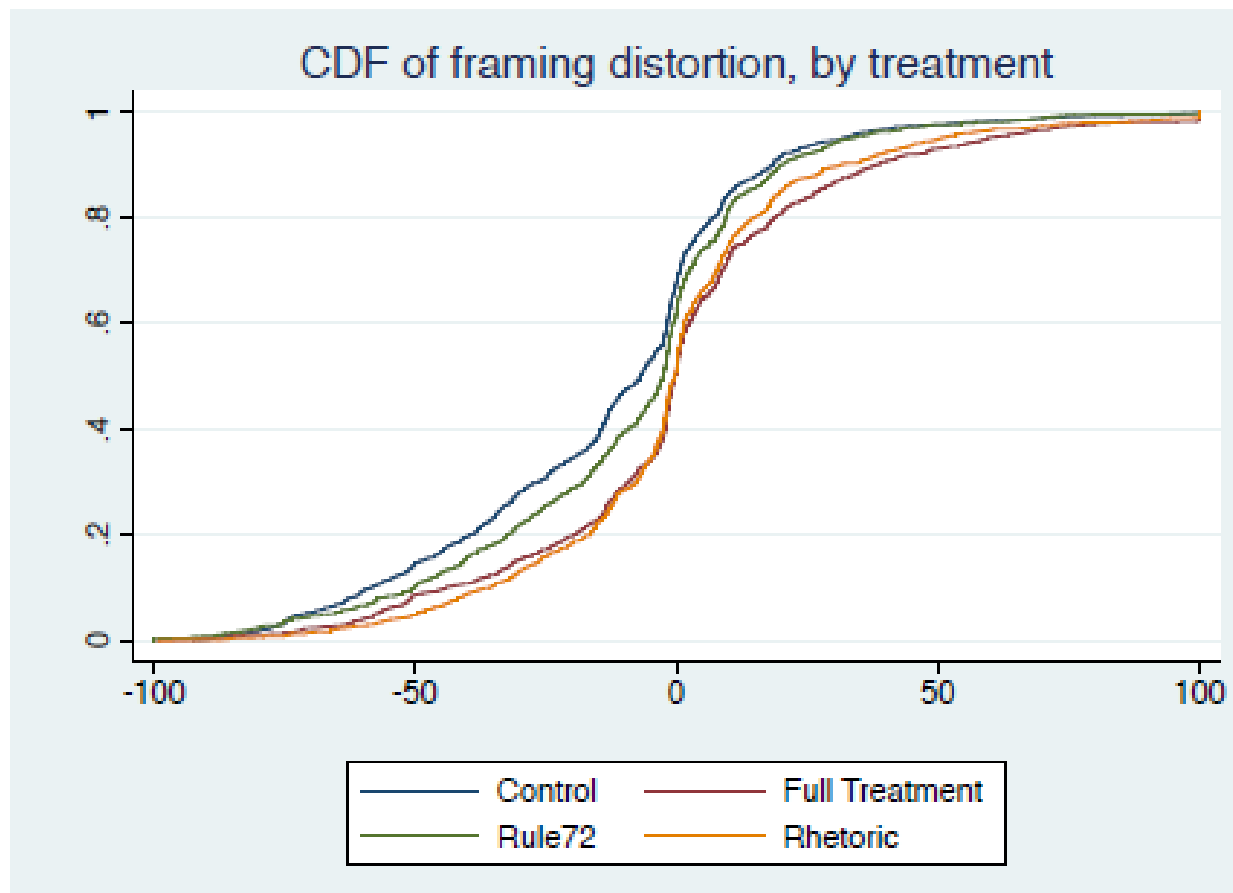


## Effect of treatments on welfare



$P(\text{joint insignificance}) = 0.390$

- Notice that greatest welfare gain is achieved for the treatment that has the smallest effect on financial literacy
- Rhetoric sets up the most effective countervailing bias, and substance just gets in the way



## Additional findings concerning mechanisms

- How do the interventions affect response times?
  - Substance-only treatment causes subjects to make complexly framed decisions more slowly
  - When motivational rhetoric is added, the effect on response time disappears
  - Corroborates that motivational rhetoric plays a dominant role when it is included

## Additional findings concerning mechanisms

- How do the interventions affect response times?
  - Substance-only treatment causes subjects to make complexly framed decisions more slowly
  - When motivational rhetoric is added, the effect on response time disappears
  - Corroborates that motivational rhetoric plays a dominant role when it is included
- Do the welfare effects of the interventions depend on the difficulty of applying the rule of 72?
  - Difficulty varies according to whether there is one doubling, an integer number of doublings, or a non-integer number of doublings
  - The welfare effects do not differ by the difficulty of the problem
  - Implies that our findings are not due to a mismatch between the depth of the intervention and the difficulty of the decision tasks

## Additional findings concerning mechanisms

- Do interventions reduce reliance on simple interest calculations?
  - Evaluate by using a regression framework to compare the variation in the ratio of valuations for complexly and simply framed decision problems to the ratio of valuations based on simple interest and compound interest
  - All treatments reduce reliance on simple interest calculations
  - Indicates that the problem is not one of intellectual stubbornness. People migrate to new heuristics that are equally inappropriate.



## Summary

- According to conventional measures, a representative financial education intervention appears to have all the desired effects for all the right reasons
- In fact, it does not improve the quality of financial decision making (financial competence)
- Explanation: contrary to the appearances, the effect on behavior is driven by rhetoric, not substance, and the effect is indiscriminate
- Improvements in financial literacy not sufficient for improvements in welfare (and possibly not even necessary)
- Underscores importance of evaluating financial competence

## Implications for policy strategies

- Devise educational strategies that more effectively lead people to put knowledge into practice when they make decisions
- Use education for “targeting debiasing”
- Develop better visualization tools to turn complexly framed decisions problems into simply framed ones

# Intervention #2: Portfolio Diversification

Ambuehl, Bernheim, Ersoy, and Lusardi (2015)

- Another core topic in most financial education courses
- Interventions are generally designed to address the concern that people insufficiently diversify

# Research Question

- How does an education intervention on diversification affect behavior and welfare?
- What are the mechanisms driving these effects?
  - Do people follow the “1/N” heuristic?
  - Do people care about the correlation structure of assets in a given portfolio?

# Experiment Structure

(Web-based experiment)

The same structure with the first project:

1. Educational video

# Experiment Structure

(Web-based experiment)

The same structure with the first project:

1. Educational video

- Main Treatment: Topic of *Portfolio Allocation*, starts with the story of an Enron secretary and explains

# Experiment Structure

(Web-based experiment)

The same structure with the first project:

## 1. Educational video

- Main Treatment: Topic of *Portfolio Allocation*, starts with the story of an Enron secretary and explains
  - the concept of average return and variability of returns

# Experiment Structure

(Web-based experiment)

The same structure with the first project:

## 1. Educational video

- Main Treatment: Topic of *Portfolio Allocation*, starts with the story of an Enron secretary and explains
  - the concept of average return and variability of returns
  - how diversification reduces risk



# Experiment Structure

(Web-based experiment)

The same structure with the first project:

## 1. Educational video

- Main Treatment: Topic of *Portfolio Allocation*, starts with the story of an Enron secretary and explains
  - the concept of average return and variability of returns
  - how diversification reduces risk
  - the link between correlation structure of the assets in a portfolio and risk reduction

# Experiment Structure

(Web-based experiment)

The same structure with the first project:

## 1. Educational video

- Main Treatment: Topic of *Portfolio Allocation*, starts with the story of an Enron secretary and explains
  - the concept of average return and variability of returns
  - how diversification reduces risk
  - the link between correlation structure of the assets in a portfolio and risk reduction
- Control: Compound Interest, importance of savings

# Experiment Structure

(Web-based experiment)

The same structure with the first project:

## 1. Educational video

- Main Treatment: Topic of *Portfolio Allocation*, starts with the story of an Enron secretary and explains
  - the concept of average return and variability of returns
  - how diversification reduces risk
  - the link between correlation structure of the assets in a portfolio and risk reduction
- Control: Compound Interest, importance of savings

## 2. 20 Valuation Tasks

# Experiment Structure

(Web-based experiment)

The same structure with the first project:

## 1. Educational video

- Main Treatment: Topic of *Portfolio Allocation*, starts with the story of an Enron secretary and explains
  - the concept of average return and variability of returns
  - how diversification reduces risk
  - the link between correlation structure of the assets in a portfolio and risk reduction
- Control: Compound Interest, importance of savings

## 2. 20 Valuation Tasks

- 10 equivalent pairs

# Experiment Structure

(Web-based experiment)

The same structure with the first project:

## 1. Educational video

- Main Treatment: Topic of *Portfolio Allocation*, starts with the story of an Enron secretary and explains
  - the concept of average return and variability of returns
  - how diversification reduces risk
  - the link between correlation structure of the assets in a portfolio and risk reduction
- Control: Compound Interest, importance of savings

## 2. 20 Valuation Tasks

- 10 equivalent pairs
- Simple framing

# Experiment Structure

(Web-based experiment)

The same structure with the first project:

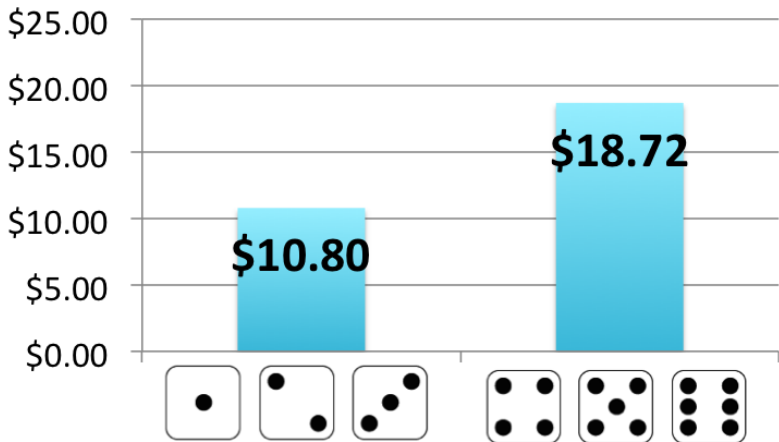
## 1. Educational video

- Main Treatment: Topic of *Portfolio Allocation*, starts with the story of an Enron secretary and explains
  - the concept of average return and variability of returns
  - how diversification reduces risk
  - the link between correlation structure of the assets in a portfolio and risk reduction
- Control: Compound Interest, importance of savings

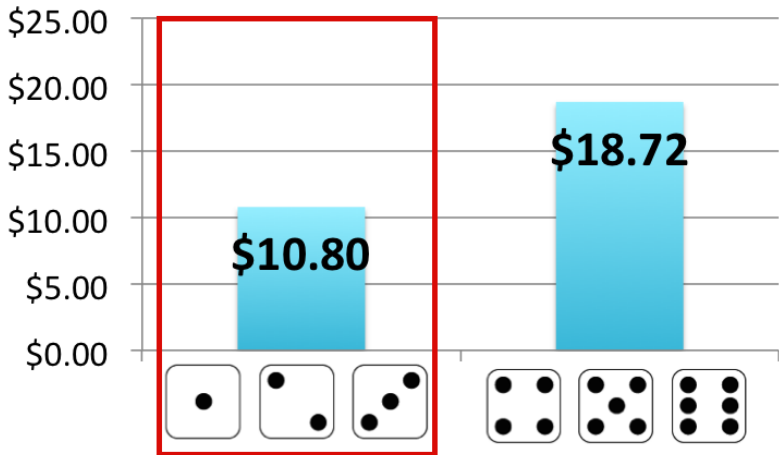
## 2. 20 Valuation Tasks

- 10 equivalent pairs
- Simple framing
- Complex framing

## Simple Frame

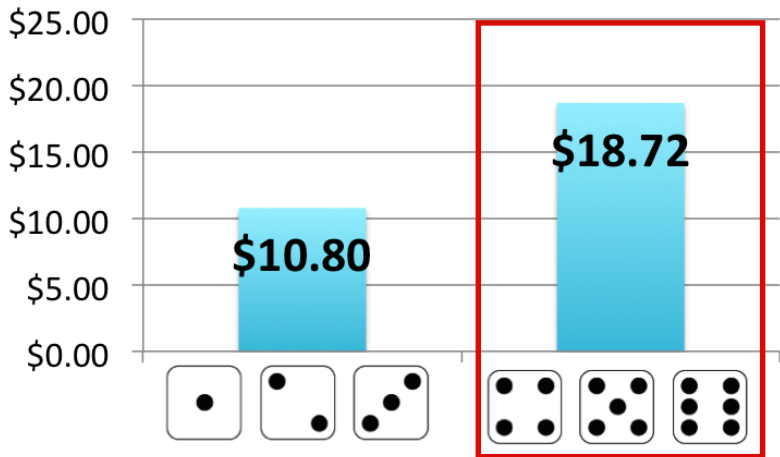


## Simple Frame



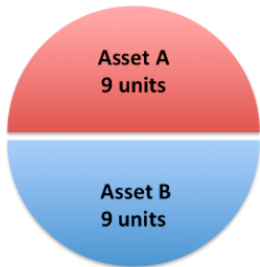


## Simple Frame

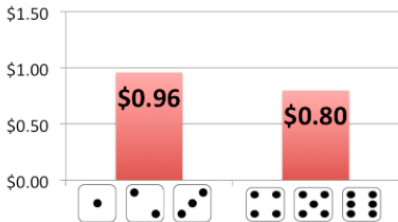


# Complex Frame

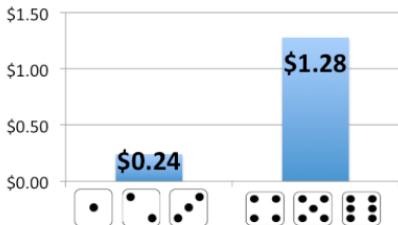
## Portfolio 1



## Each Unit of Asset A

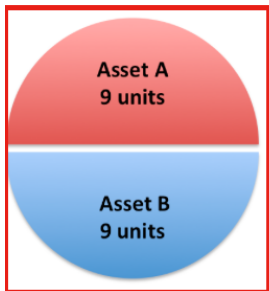


## Each Unit of Asset B

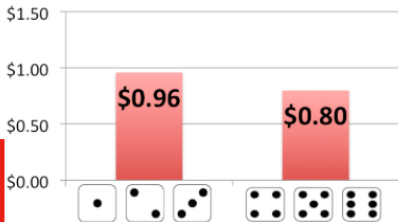


# Complex Frame

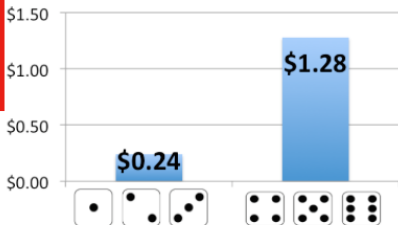
## Portfolio 1



## Each Unit of Asset A

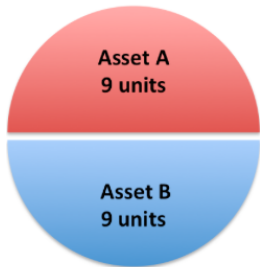


## Each Unit of Asset B

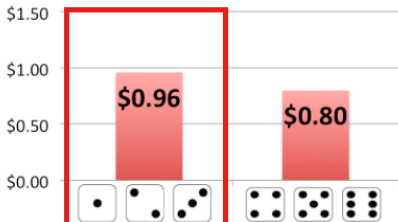


# Complex Frame

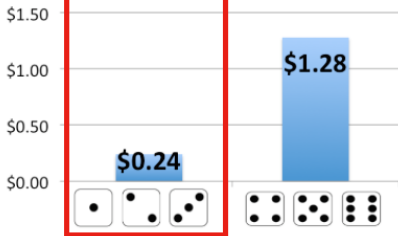
## Portfolio 1



## Each Unit of Asset A

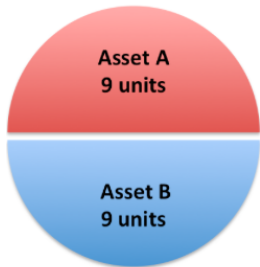


## Each Unit of Asset B

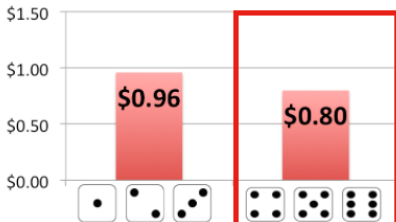


# Complex Frame

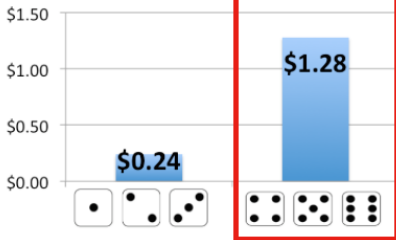
## Portfolio 1



## Each Unit of Asset A



## Each Unit of Asset B



# Experiment Structure

(Web-based experiment)

The same structure with the first project:

## 1. Educational video

- Main Treatment: Topic of *Portfolio Allocation*, starts with the story of an Enron secretary and explains
  - the concept of average return and variability of returns
  - how diversification reduces risk
  - the link between correlation structure of the assets in a portfolio and risk reduction
- Control: Compound Interest, importance of savings

## 2. 20 Valuation Tasks

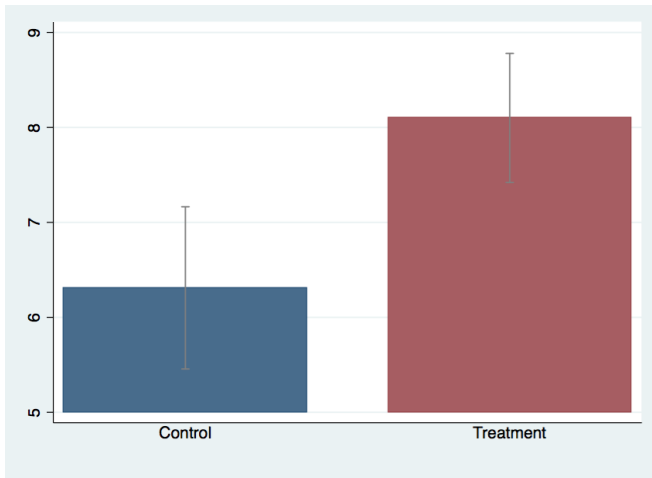
- 10 equivalent pairs
- Simple framing
- Complex framing

## 3. Incentivized test and surveys

- 10 questions on portfolio allocation
- 10 additional questions on compound interest
- Self reports about decision process

# Results: Financial Literacy

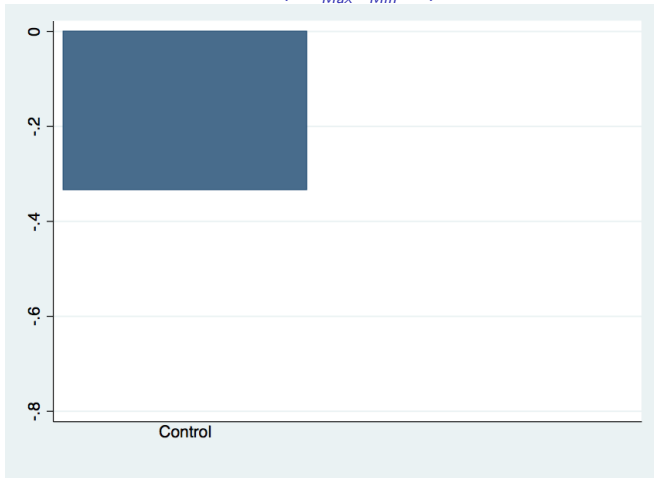
Caution! Pilot Data (Only 60 subjects) [Details](#)



Improvement in test scores

## Results: Choices

$$\left( \frac{V^{\text{complex}} - V^{\text{simple}}}{\text{Max} - \text{Min}} \right)$$

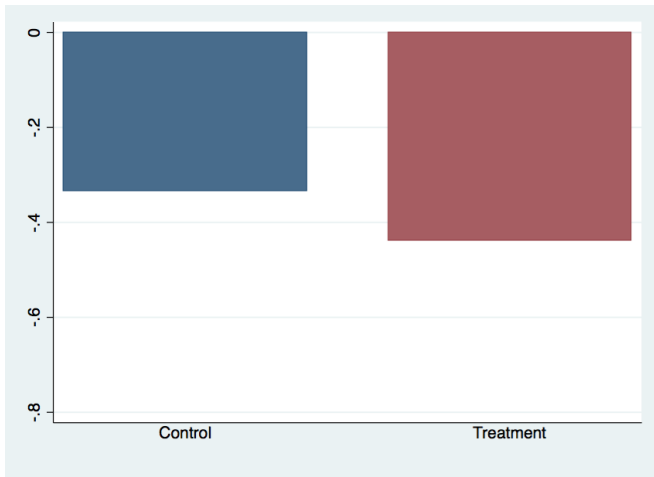


Subjects in the control treatment undervalue the complexly framed lotteries.



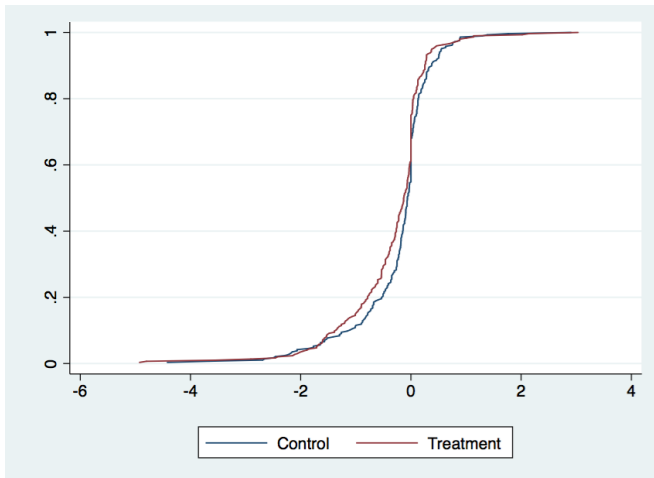
## Results: Choices

$$\left( \frac{V^{\text{complex}} - V^{\text{simple}}}{\text{Max} - \text{Min}} \right)$$



Subjects in the treatment undervalue them even more.

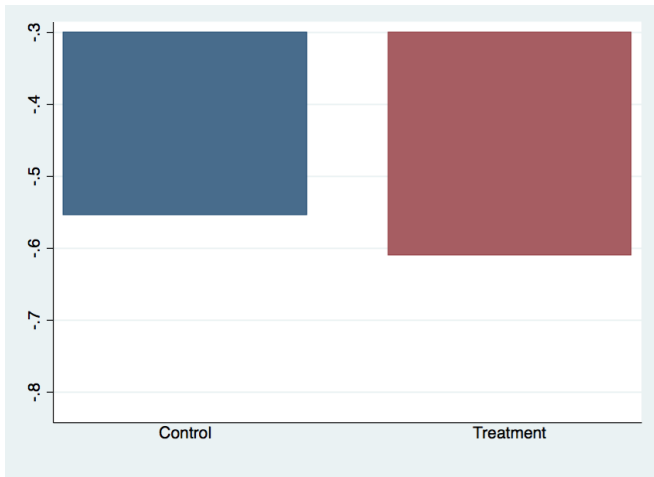
C.D.F. of  $\frac{V^{complex} - V^{simple}}{Max - Min}$



Effect of intervention is indiscriminate

## Results: Welfare Loss

$$\left(-\left|\frac{V^{\text{complex}} - V^{\text{simple}}}{\text{Max} - \text{Min}}\right|\right)$$



Hence, the treatment is welfare decreasing.

## Next Steps

- How much do people know about how much they know or don't know (**financial meta-competence**)?
- How does education affect financial meta-competence?

## Next Steps

- How much do people know about how much they know or don't know (**financial meta-competence**)?
- How does education affect financial meta-competence?

Education may scare people off from making their own financial decisions. But

## Next Steps

- How much do people know about how much they know or don't know (**financial meta-competence**)?
- How does education affect financial meta-competence?

Education may scare people off from making their own financial decisions. But

- if it teaches them that they need to ask for advice, they may be better off.

## Next Steps

- How much do people know about how much they know or don't know (**financial meta-competence**)?
- How does education affect financial meta-competence?

Education may scare people off from making their own financial decisions. But

- if it teaches them that they need to ask for advice, they may be better off.
- if it simply scares them off making any financial decisions and scares them off seeking for advice, they may be worse off.

## Next Steps

- How much do people know about how much they know or don't know (**financial meta-competence**)?
- How does education affect financial meta-competence?

Education may scare people off from making their own financial decisions. But

- if it teaches them that they need to ask for advice, they may be better off.
- if it simply scares them off making any financial decisions and scares them off seeking for advice, they may be worse off.

Next Step:

Measure financial meta-competence in addition to financial competence.



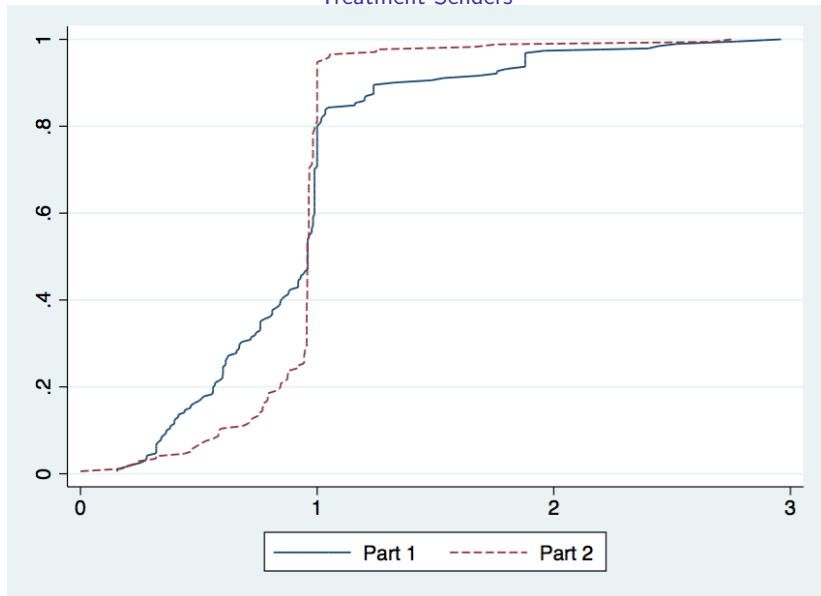
# Social Transmission of Financial Competence

Ambuehl, Bernheim, Ersoy, and Harris (2015)

- How does social environment effect social competence and mediate the effects of financial education?
- Pilot study on *compound interest* at the University of Birmingham
- Intervention includes *practice*
- Three stages of decision making
  - Part 1: “Raw” choices
  - Part 2: Choices after an informational intervention (educational module or control)
  - Part 3: Choices after interaction (educated-uneducated, or uneducated-uneducated)

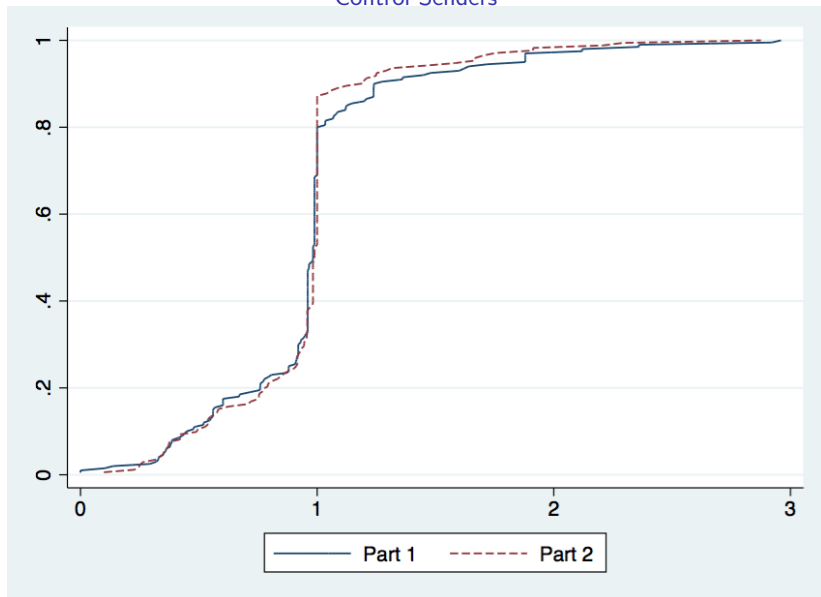
# Is education effective for teaching compound interest?

Treatment Senders

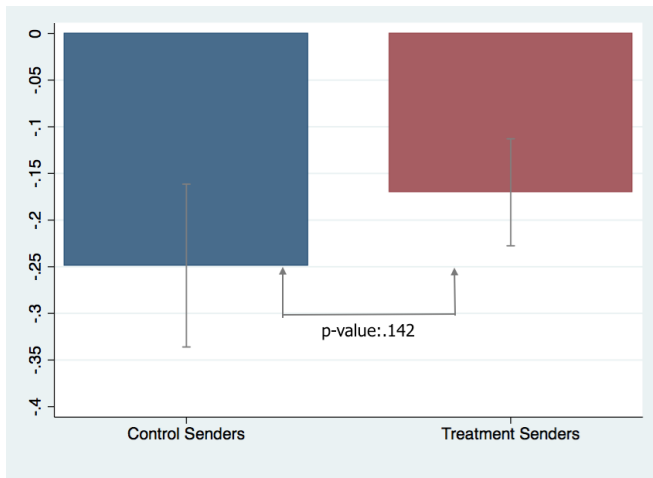


# Is education effective for teaching compound interest?

Control Senders

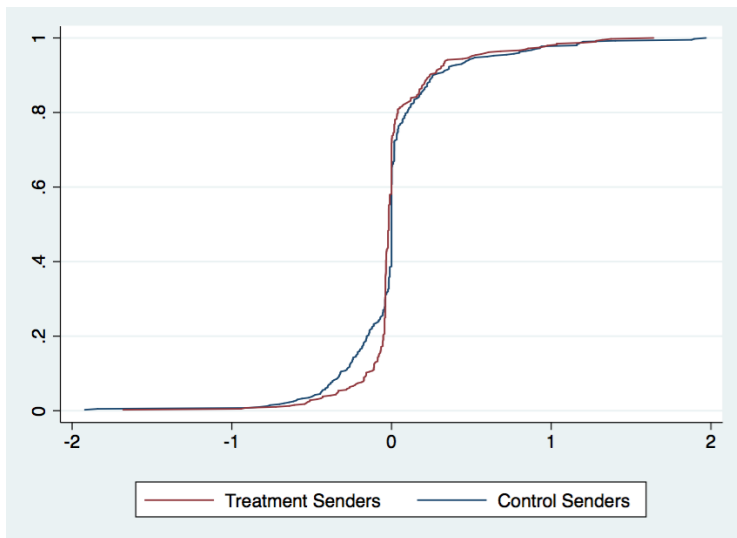


# Does **education** affect financial competence?

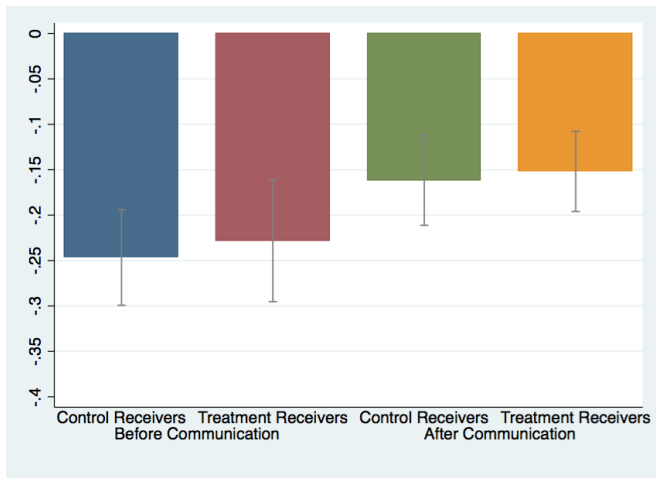


Education results in 32% reduction in welfare loss.

# Does **education** affect financial competence?

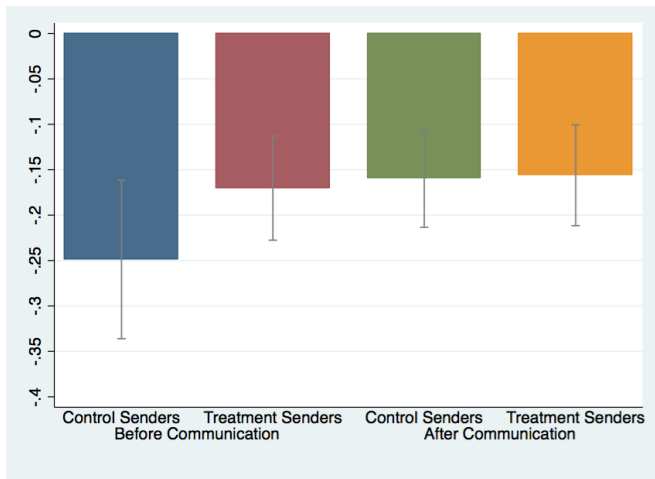


## Does **communication** affect financial competence?



Communicating with an educated partner does not affect welfare differently than communicating with an uneducated partner.

## Does **communication** affect financial competence?



Being a sender in the treatment group and communicating leads to 7.50 percentage points welfare loss (p-value: .053).

## Conclusions

- Educational measures that look great according to conventional outcome measures may not improve the quality of decision making
- There appears to be a gap between understanding principles and operationalizing principles
- People are more likely to operationalize motivational rhetoric
- The prominent role that motivational rhetoric has played in adult financial education may be counterproductive
- Social interaction improves the quality of financial decision making irrespective of the qualifications of social contacts, and can even render a beneficial effective intervention redundant