

# What do financial inclusion indexes measure?

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## Broad consensus on objectives of a financial inclusion index

1. Be household centric
2. Should capture *input* – *output* – *outcome*
3. Should be applicable to identify gaps across different customer types
4. Should be *timely* – regularity and frequency of measurement.

## A proposed approach

- ▶ Consumer Pyramids Household Survey captures information for
  - ▶ Financial participation
  - ▶ Income
  - ▶ Consumption

at the level of the household, thrice a year.

- ▶ We propose to measure:
  1. household financial participation as a measure of *input*.
  2. changes in participation as a proxy measure for usage of financial instruments as *output*.
  3. household consumption level and volatility as a proxy measure of *outcome*.

# Measuring financial inclusion for a household

- ▶ Financial inclusion can be visualised as

the gap in *input – output – outcome*

between a high percentile household and a low percentile household by income.

- ▶ The higher the gap, the *worse* the inclusion.  
The lower the gap, the *better* the inclusion.
- ▶ For example, what does this approach tell us about financial inclusion between the 25<sup>th</sup>, 75<sup>th</sup> percentile households by income?

# Data work

# CPHS financial variables for households and their members

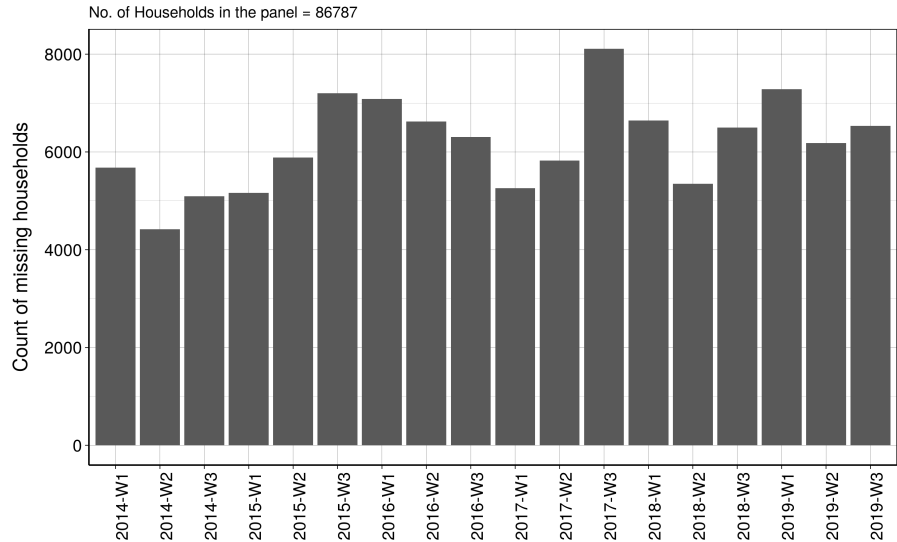
- 01 Household ownership of at least one **bank account**
- 02 Household ownership of at least one **health insurance**
- 03 Household ownership of at least one **life insurance**
- 04 Household ownership of at least one **employee provident fund account**
- 05 Outstanding investment at a household level in **fixed deposit**
- 06 Outstanding investment at a household level in **kisan vikas patra**
- 07 Outstanding investment at a household level in **national savings certificate**
- 08 Outstanding investment at a household level in **post office savings account**
- 09 Outstanding investment at a household level in **mutual funds**
- 10 Outstanding investment at a household level in **listed shares**

**Note:** We do not include debt in this list.

## Picking a sample

- ▶ If we want to understand how financial inclusion matters for a household, we should ideally observe the same household over a period of time.
- ▶ What sample should we pick?
- ▶ Identify households in the 'balanced' panel:  
→ those observed in **at least two waves** every year.
- ▶ Calculate the financial participation score per household per year.
- ▶ We can calculate this from 2014 to 2019

# Sample size: How many households in the balanced panel?





# A simple financial participation score for a household

## **A simple score:**

average of the 10 binary variables.

**Possible values:** range from 0 to 1.

**Inference:** the closer the score is to 1, the higher the household participation or inclusion.

(The above score can be replaced by other approaches such as the PCA.)

# A simple output measure: change in state of financial participation

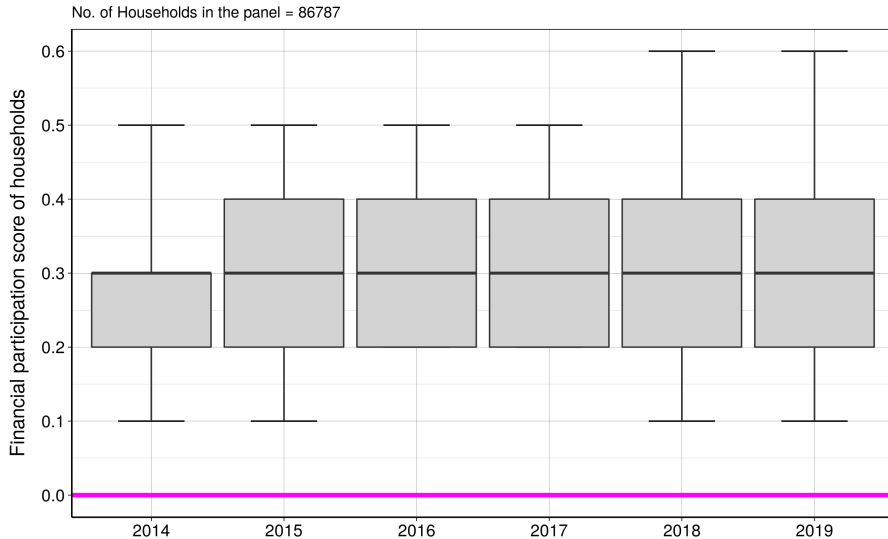
Calculate the following per year per household:

1.  $C$  = Average change in financial participation score (can be +, -, 0)
2.  $D$  = Standard deviation of change in financial participation score (can be +, 0)
3. Identify a household as a non-user of finance in a year if:  
 $D = 0$  in a year  
Else, identify a household as a user of finance.
4. Capture the direction of usage for a household which uses finance:
  - ▶ Positive if  $C > 0$
  - ▶ Negative if  $C < 0$
  - ▶ Both if  $C = 0$

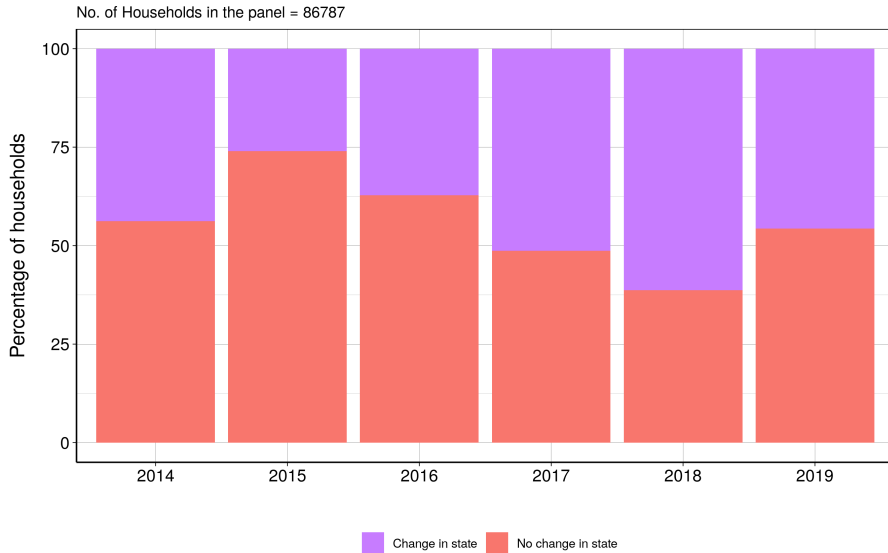
**What does the balanced panel data look like?**

# Financial participation score by year

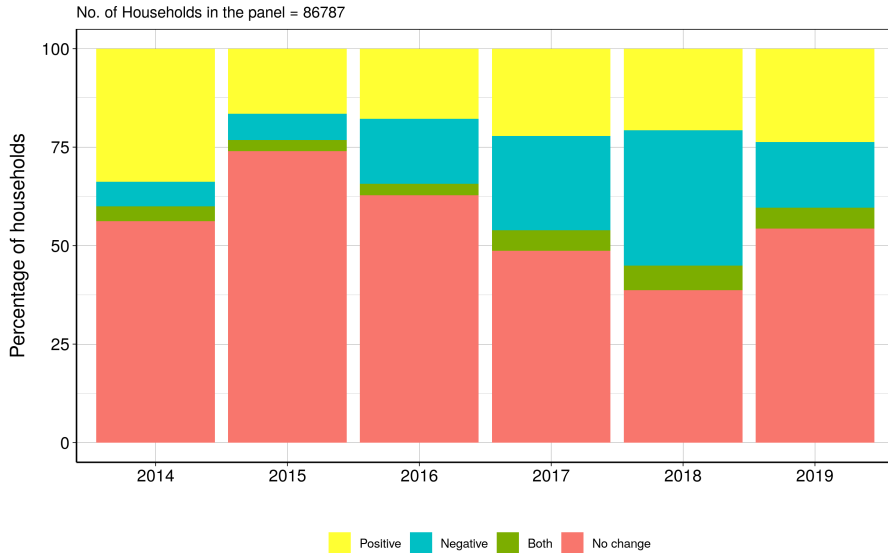
Balanced panel



## C: Change in state of financial participation

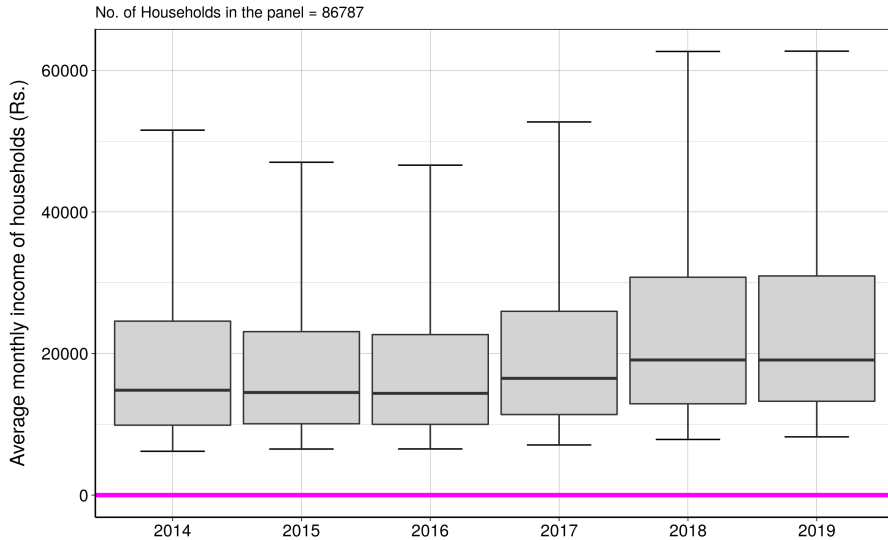


## D: Direction of change in state of financial participation



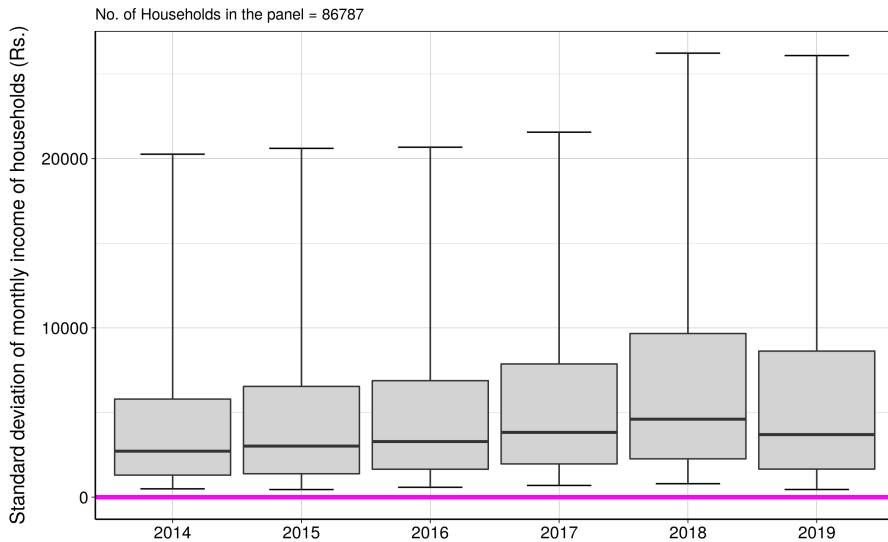
# Household income by year

Balanced panel



# Income volatility by year

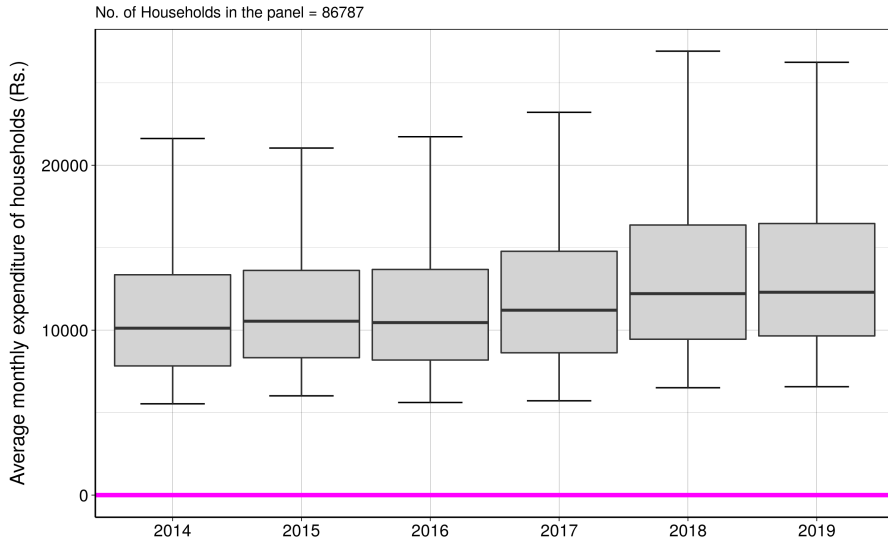
Balanced panel





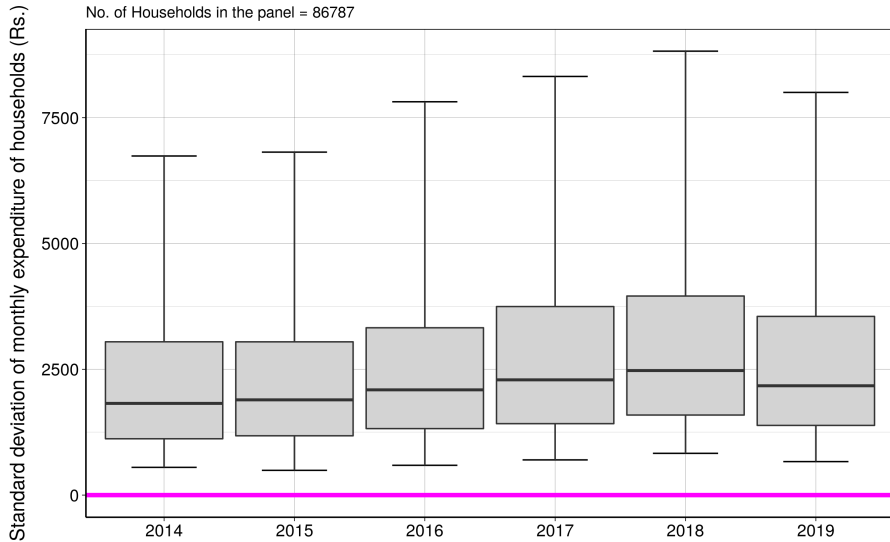
# Expenditure levels by year

Balanced panel



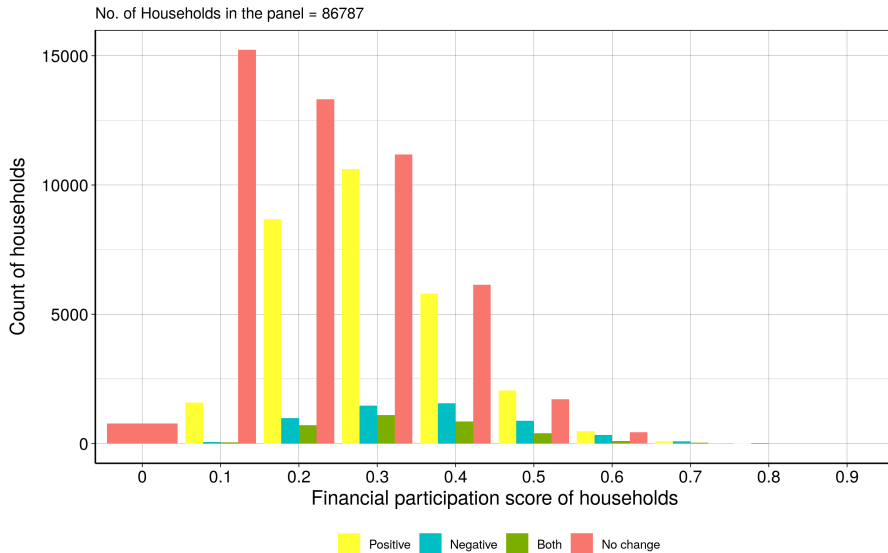
# Volatility of expenditure by year

Balanced panel

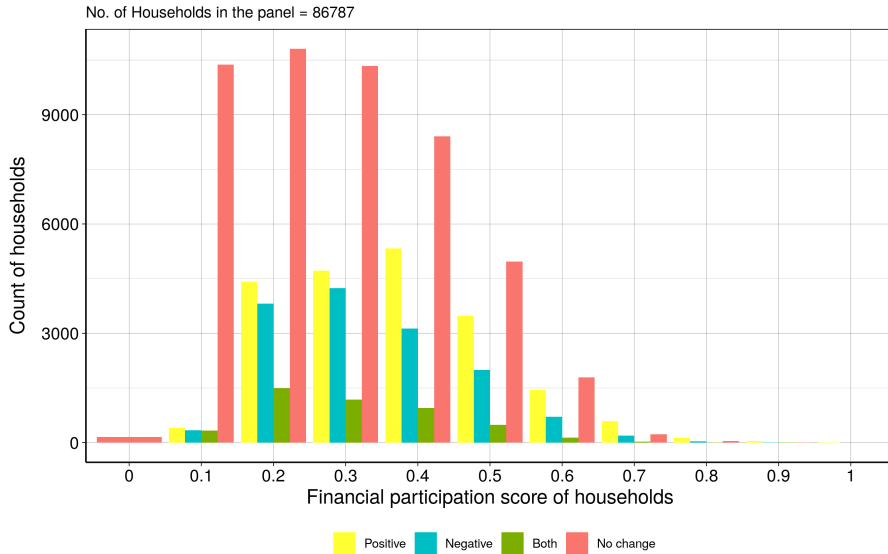


# Financial inclusion by participation and usage

# Variation in financial usage by participation, 2014

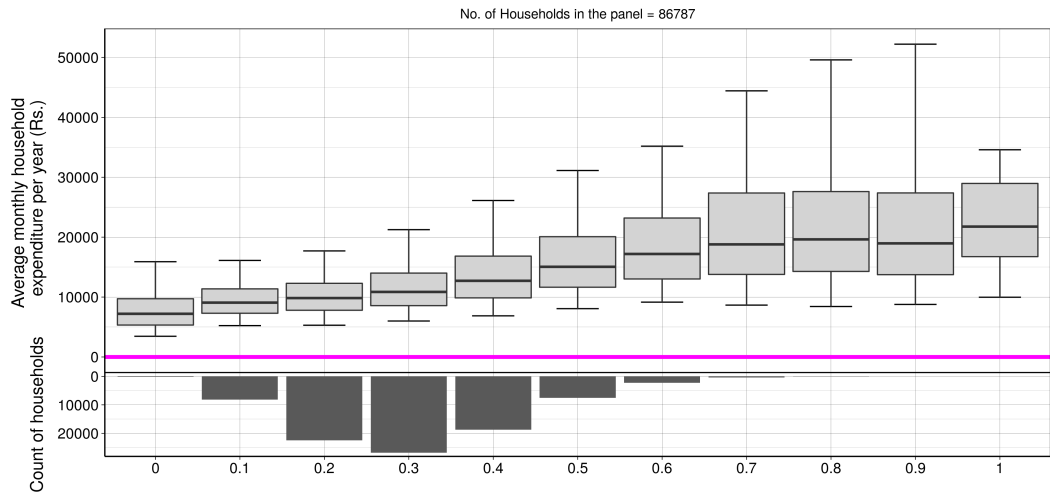


# Variation in financial usage by participation, 2019

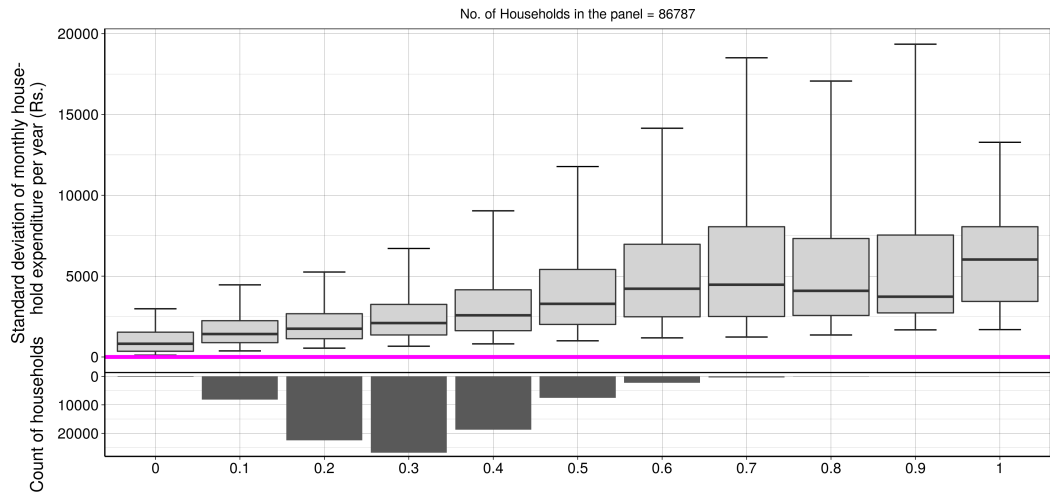


## **Variation of household consumption by financial inclusion measures, balanced panel**

# Average consumption and financial participation

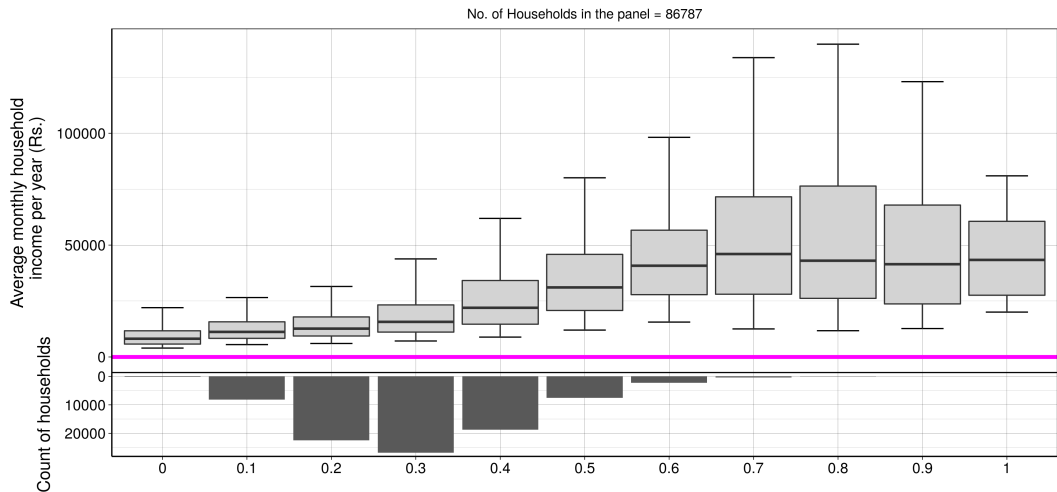


# Consumption volatility and financial participation

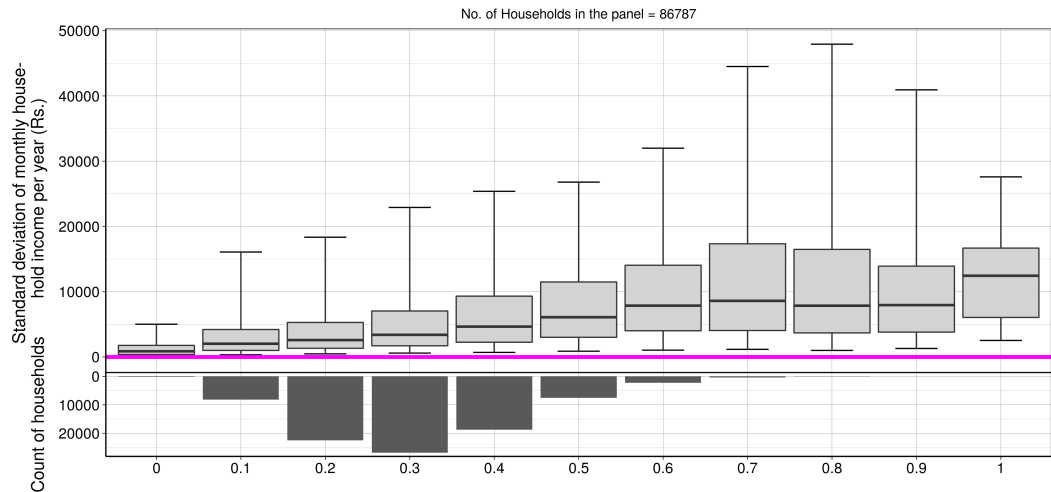




# Average income and financial participation



# Income volatility and financial participation



## Next steps

- ▶ Disentangling confounding effects:
  1. Income and financial participation
  2. Wealth, income and financial participation

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- ▶ Applying participation and usage scores to households at the ends of the income distribution:  
10<sup>th</sup> vs. 90<sup>th</sup> percentile, 25<sup>th</sup> vs. 75<sup>th</sup> percentile.

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- ▶ Changes as proxy for usage: how does the *type of change* matter?  
For example, shift in household participation from Fixed Deposits to Insurance vs. Life insurance to Health insurance.

Thank you

Questions? Comments?

<http://www.xkdr.org/>