

# Credit Characteristics, Credit Engagement, and Financial Well-Being

FWB Conference – November 13, 2019

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# Disclaimer

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# Credit Karma research pilot

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- Collaboration between CFPB
  - Office of Innovation
  - Office of Research
  - Office of Financial Education/CEE, and
- Credit Karma – a consumer technology company with a large membership base of more than 90 million Americans
  - provides free access to credit scores, reports, and monitoring through web and mobile interfaces
  - provides members context into their financial profile and access to free tools, including the Credit Score Simulator, loan calculators, and a direct-dispute process to challenge erroneous credit-report entries
  - offers product recommendations tailored to fit members' profiles through partnerships with financial institutions

# Research design

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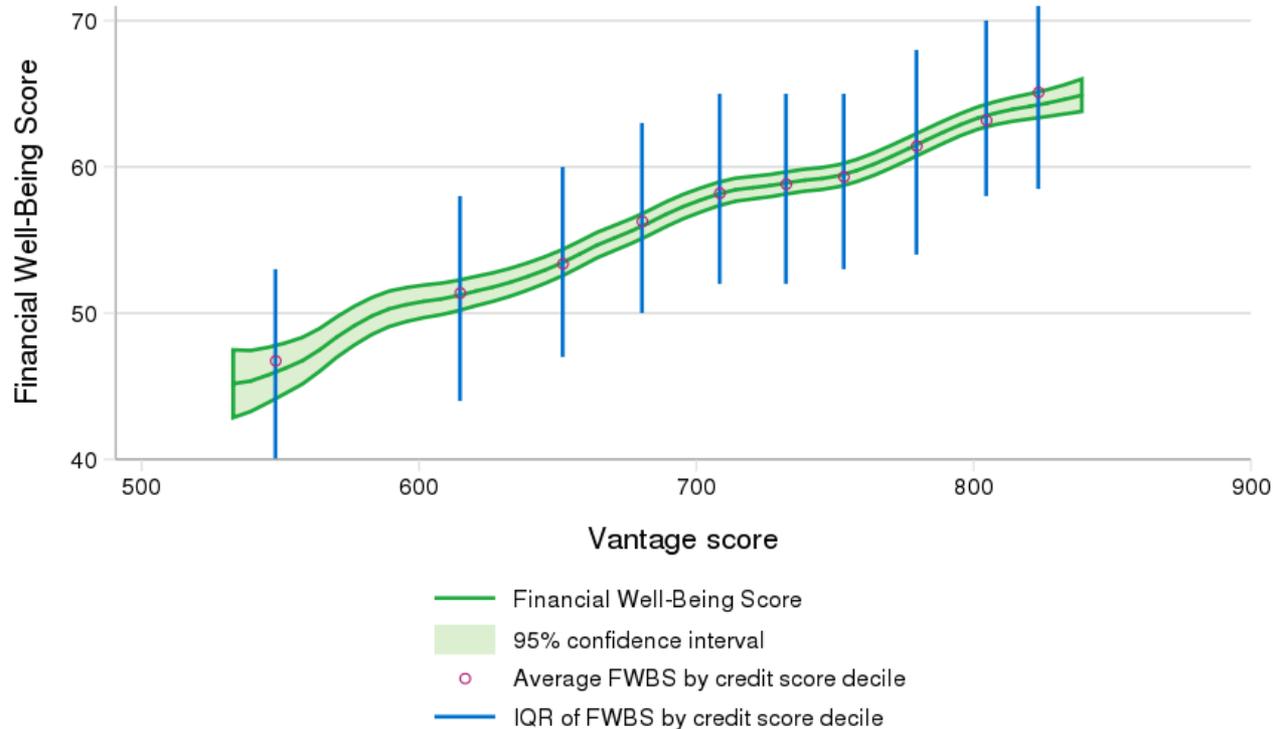
- CFPB's Financial Well-Being Scale administered to a sample of 3,000 Credit Karma users in 2017
- Objective: correlate **subjective** Financial Well-Being score with **objective** credit record and engagement measures
- Credit Karma provided CFPB with de-identified information:
  - FWB survey responses and basic demographics (age, geography)
  - Credit record variables (252 variables)
  - Engagement with CK platform and educational tools (75 variables)

# Financial Well-Being score distribution

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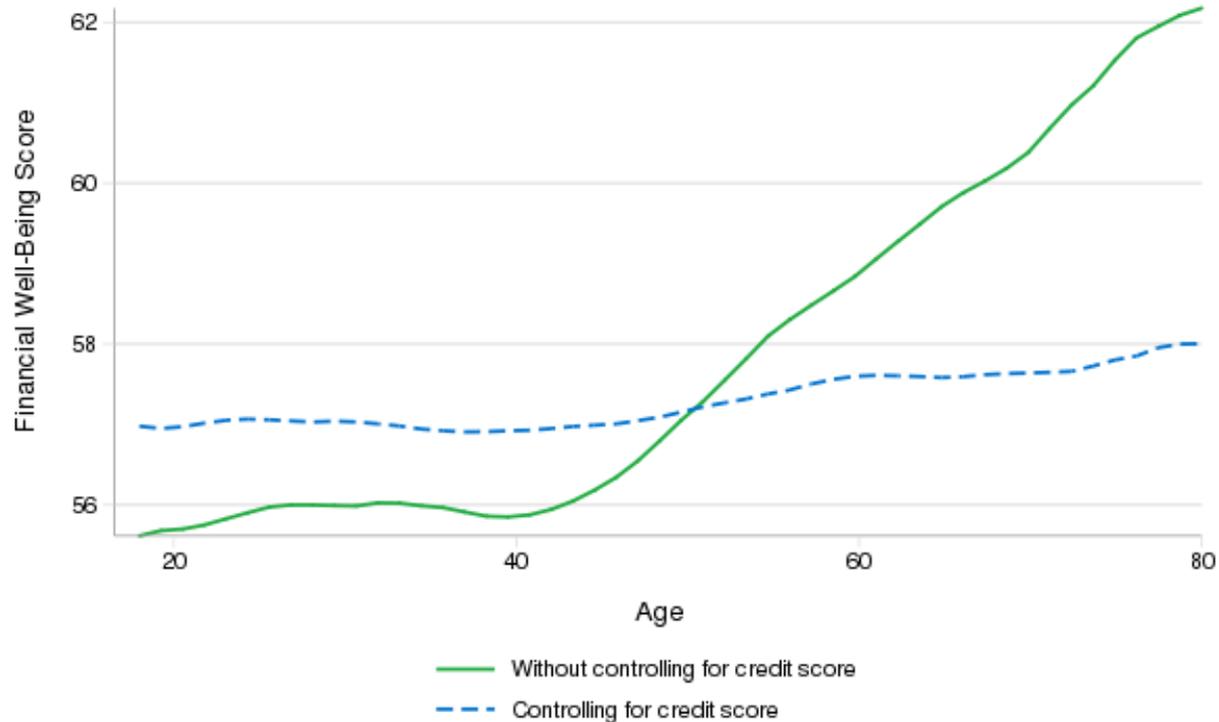
# Financial Well-Being score and credit score



Note: FWB Score is plotted as a local polynomial function of credit score with 95% confidence intervals and with average and IQR plotted by credit score deciles. Bottom 3 percent of credit score values are excluded due to noise in data.

Credit score explains 19.7% of variation in FWB score

# Financial Well-Being score and age



Note: FWB Score is plotted as a local polynomial function of age, without and with controlling for credit score.

Controlling for credit score makes age effect go away

# Methodology

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300+ initial variables



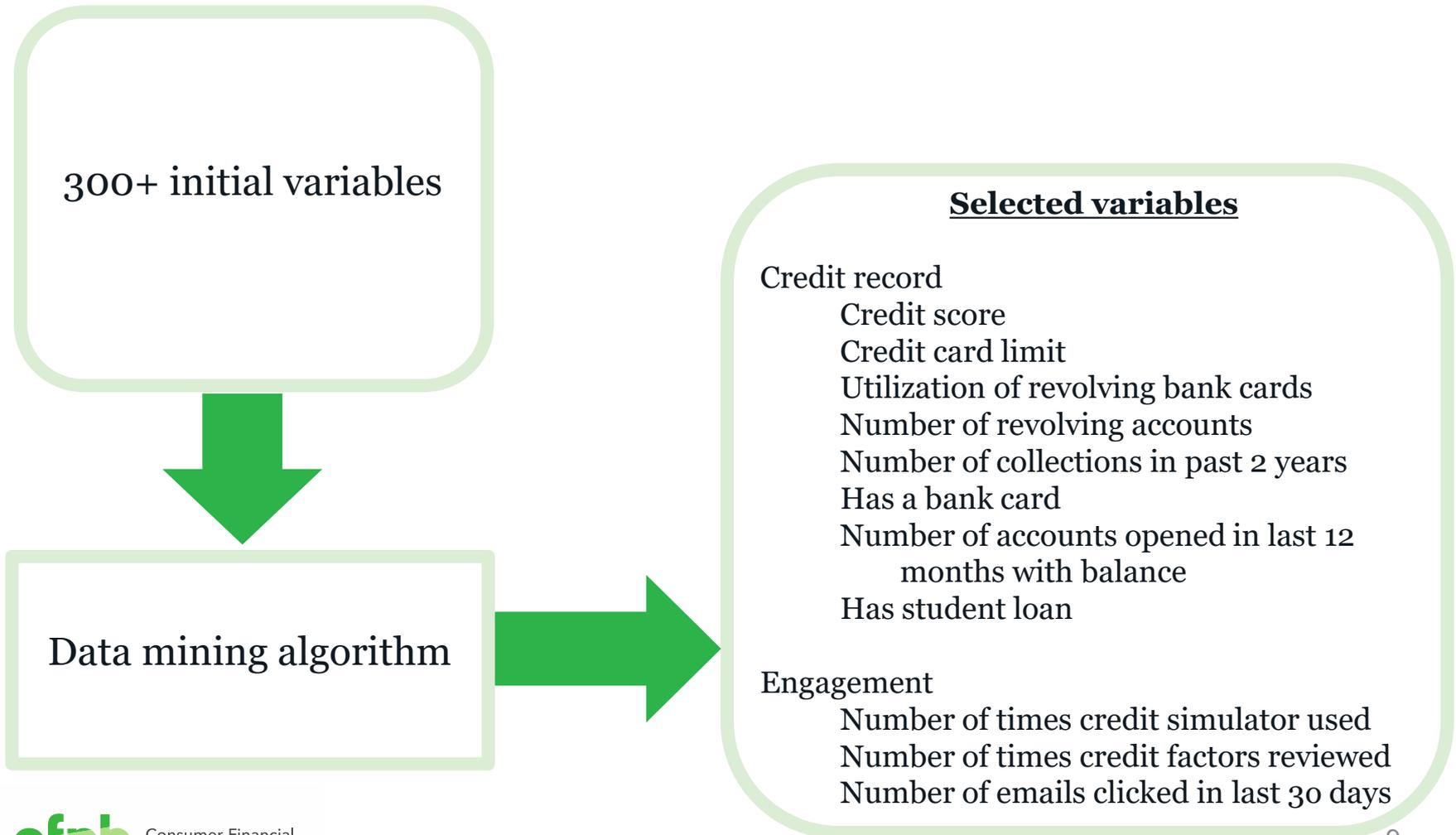
Data mining algorithm

**Algorithm:** Supervised block-wise forward selection

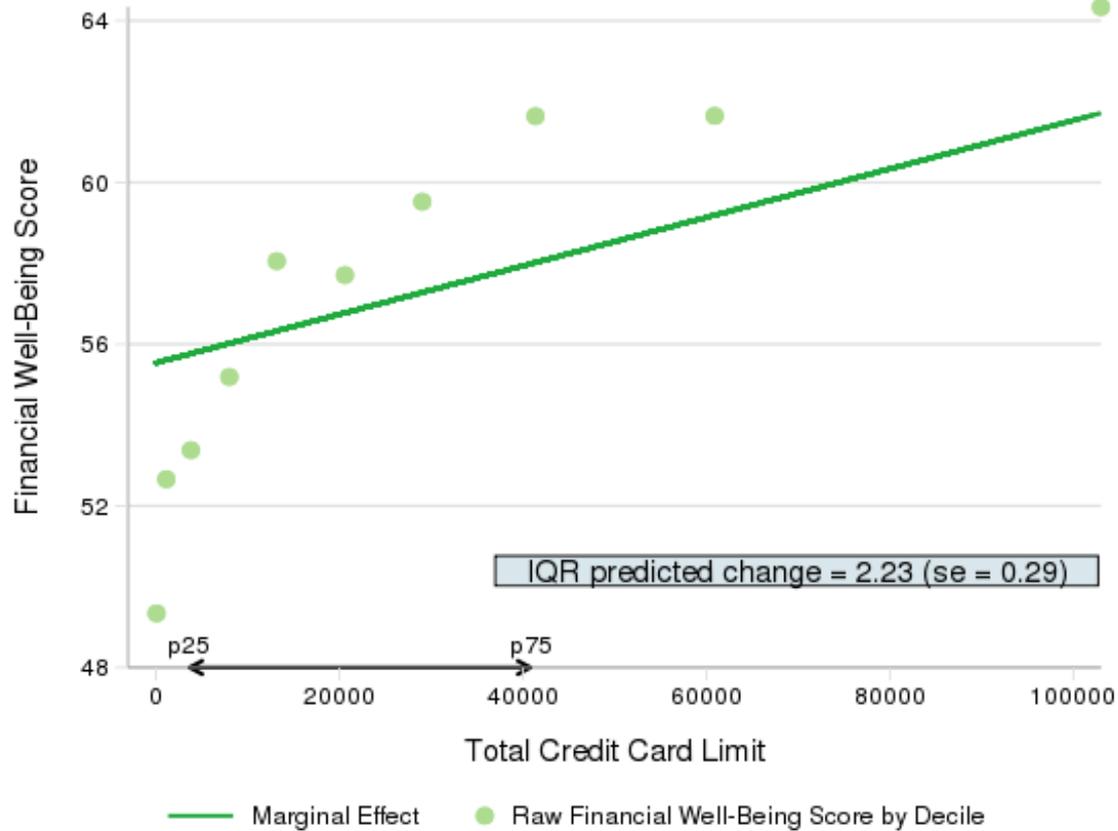
- used in exploratory analysis
- focuses attention on variables that correlate strongly with FWB – not causal!
- uses thematic groupings of variables
- uses consideration sets, order independent within sets
- limits impact of outliers
- considers credit variables first, then engagement variables

# Methodology

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# Credit card limit

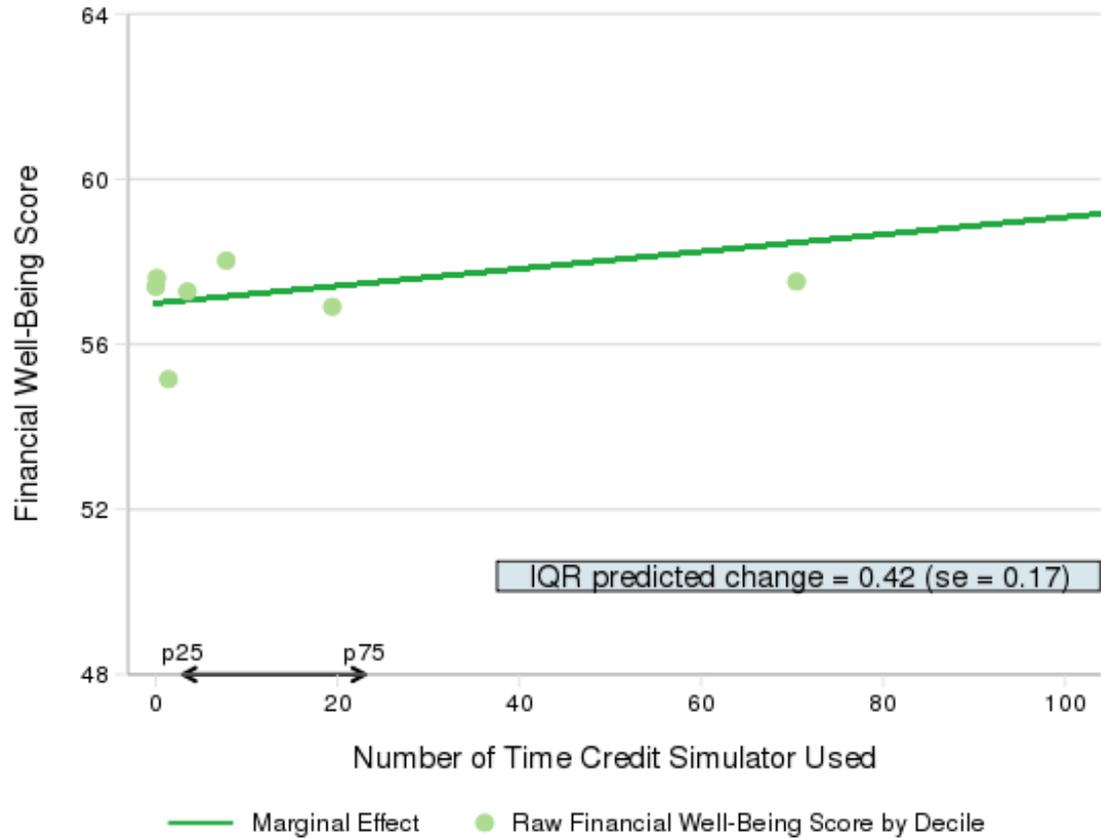


# Correlation of credit record variables

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<b>Selected variable</b>	<b>Conditional correlation</b>	<b>Interquartile effect</b>
Credit score	+	4.99
Credit card limit	+	2.23
Utilization of bank card	-	1.97
Number of revolving accounts	-	1.83
Number of collections in past 2 years	-	1.45
Has a bank card	+	2.48*
Number of accounts opened w/ balance	+	0.80
Has student loan	-	0.98*

# Number of times credit simulator used



# Correlation of engagement variables

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<b>Selected variable</b>	<b>Conditional correlation</b>	<b>Interquartile effect</b>
Number of times credit simulator used	+	0.42
Number of times credit factors reviewed	+	0.50
Number of emails clicked in last 30 days	-	0.53

# Interpretation

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- Intriguing and novel findings – guidance on where to look more deeply
- Cross-sectional correlations
  - Not necessarily causality!
  - Observed correlations could be explained by
    - Causality
    - Reverse causality
    - Omitted variable bias (e.g. propensity to plan)
- Very promising results for engagement, but to establish causality robustly, we need
  - Experiments
  - Panel data – examine dynamic stability and effect of any experiments/interventions