



Discussion of **The Rise of E-Wallets and Buy-Now-Pay-Later**  
by **Bian Lin, William Cong, and Yang Ji**  
&  
**A Helicopter Tour of Buy-Now-Pay-Later**

Deniz Aydın  
Olin Business School  
Washington University in St. Louis.

---



# Introduction

- Fintech revolution
    - Innovative approaches to payments and risk management.
    - Tremendous growth in e-Wallets and BNPL
    - Unfortunately, these innovative data sources are not accessible to academics
    - e.g., *Data Security Law* (2021)
  - Important questions and challenges
    - Does it expand access?
    - Is it safe? Does it lead to overspending and indebtedness?
    - What attracts borrowers to these plans?
    - Why are they 0% APR?
-



# What Lin, Cong, and Ji Do

- Unique and innovative data
  - Opening a lot of black boxes in e-Wallet and BNPL usage
  - Randomized BNPL Supply Shock
  
  - How BNPL interacts with other options and affects payment, spending, and borrowing behavior.
    - Complements bank credit.
    - Increases spending.
    - Benefit disadvantaged or underserved by banks.
    - Does not increase indebtedness or distress.
  
  - Main Comment: Streamline and Re-organize
    - Give random BNPL supply shock the center stage.
    - Link BNPL specifics (underwriting, contracts, interest rates) to outcomes (e.g., indebtedness)
-



# Outline for Discussion

- Helicopter Tour of BNPL
    - Transactional vs. Conventional Underwriting
    - Installment vs. Revolving Contracts
    - 0 %APR as a Special Price
    - Two-sided Markets
  
  - Comments on
    - Identification
    - Estimation
    - Interpretation
-



# What is BNPL

- How does the credit product differ from other ones that we usually know?
    - Short-term
    - Fixed payment schedule
    - Point-of-sale
    - Transaction level underwriting
    - 0% APR (in general)
  - BNPL is not new
    - 1920s in the U.S.: Pandemic, Credit Expansion, Great Depression
    - Turkey, Israel, Brazil etc.: Usury-aversion
-



## Ascent BNPL Survey

[www.fool.com/the-ascent/research/buy-now-pay-later-statistics/](http://www.fool.com/the-ascent/research/buy-now-pay-later-statistics/)

- 35% in U.S. use, down from 50% in 2022 and 56% in 2021.
    - 67%—think BNPL could replace credit cards
  - 37%—to avoid interest (borrow low save high)
  - 45%—otherwise wouldn't fit within their budget
  - 13% because they couldn't get approved for credit cards
  - 13% because credit cards were maxed out
  - Categories: 46% Electronics, 46% Clothing, 31% Furniture and Appliances
-



## How is BNPL different?

### BNPL is *Transactional Underwriting*

- Traditional underwriting
    - individual-level scores, histories, and metrics
    - FICO is for an individual, irrespective of purchase
  - Transactional underwriting—each transaction is individually analyzed.
    - $E[Y|X]$ , where  $Y$ ,  $X$ ,  $E[]$  all different.
    - Variables used:
      - What you buy
      - When you buy
      - Other footprints
-



## Nukala (WP) “Buy-Now, Pay-Later and Purchase-level Underwriting”

- Vasudha’s (WashU Olin) Job Market Paper (she is on the market this year)  
[www.vasudhanukala.com/research](http://www.vasudhanukala.com/research)
  - Unique dataset from a U.S.-based BNPL firm.
    - Does transaction-level underwriting improve classification accuracy?
    - What is the source of the information in the transaction?
    - How does supply change, and for whom?
    - What are the effects on consumer welfare?
-





# Nukala (WP) “Buy-Now, Pay-Later and Purchase-level Underwriting”

## What is the source of the information in the transaction?

- What did you buy? —Vissing-Jorgensen
- Digital footprints? —Berg, Burg, Gombovic, and Puri

	(1)	(2)	(3)	(4)	(5)	(6)	(7)
FICO score							
Internal score (residual)							
Product	✓	×	✓	×	✓	×	✓
FICO score	×	✓	✓	×	×	✓	✓
Internal score (residual)	×	×	×	✓	✓	✓	✓
AUC							
ΔAUC (%) - relative to Product	-	→ 13.38	→ 15.18	→ 17.72	→ 20.4	→ 32.00	→ 32.73
ΔAUC (%) - relative to FICO	-11.80	-	→ 1.59	→ 3.83	→ 6.22	→ 16.42	→ 17.06

- Transactional underwriting contributes to improved performance and lack of indebtedness.



## How is BNPL different?

### Preplanned (Installments)

- Revolving debt is accumulated through dynamic choice.
    - credit card = BN-think-you-will-PL
      - but underestimate they will revolve end-of-billing cycle
      - naivete about dynamic inconsistency
  - Installments preclude the opportunity to revise choices with the eventuality of the latter information set.
    - on the contrary, consumers forgo repayment flexibility.
    - it's (like) a commitment device
  - (I think) installments are a better 'safer' contract and contribute to a lack of indebtedness.
-



# What attracts borrowers to BNPL?

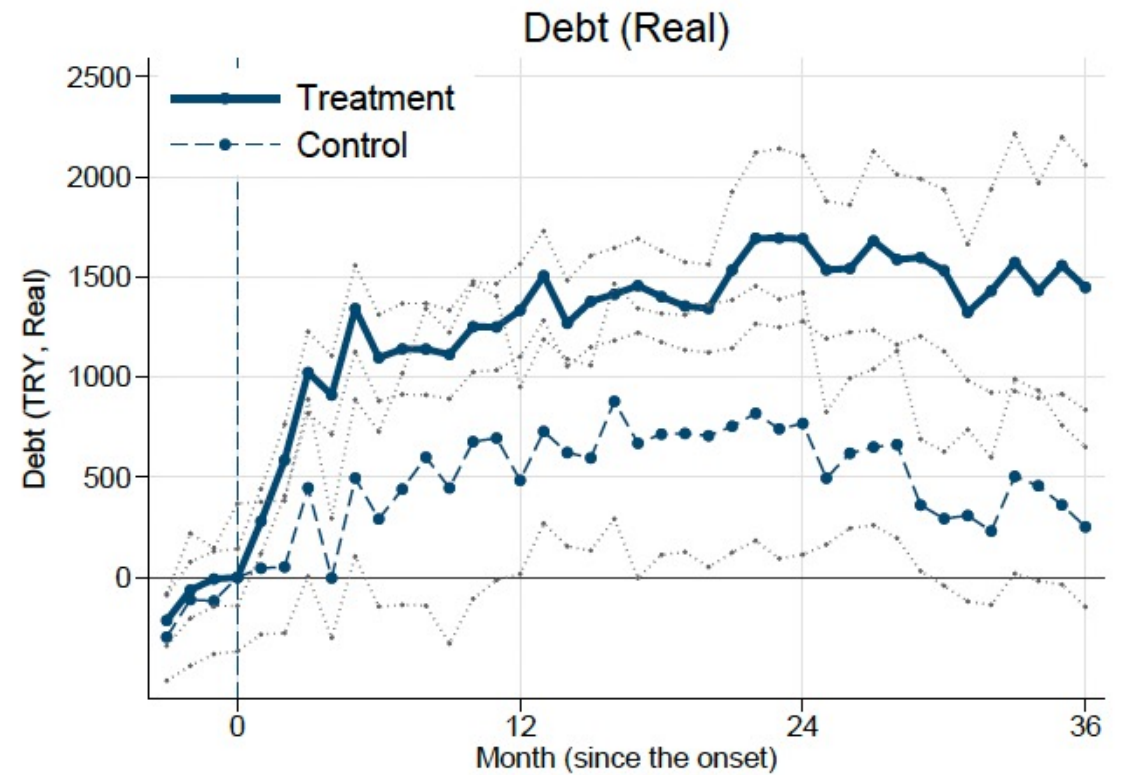
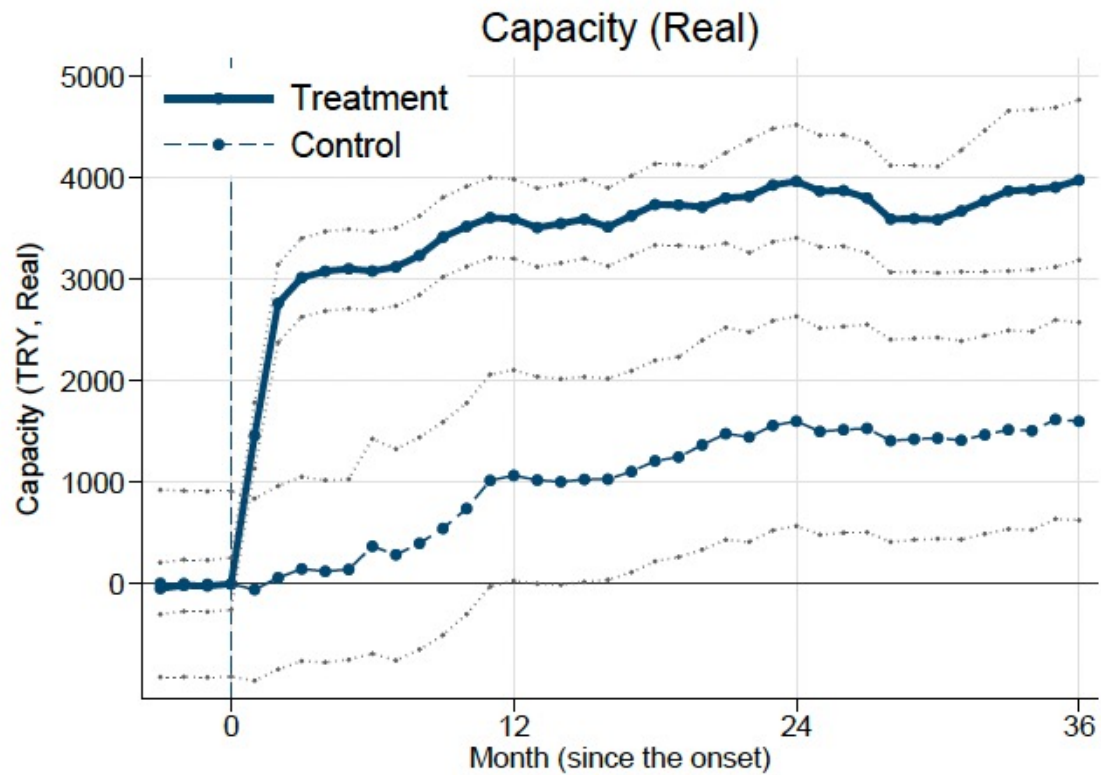
## 0% APR

- The paper studies debt choices from a menu of (cheap and expensive) options.
  - In a financing hierarchy in which the cost of financing is minimized
    - Borrow 0% BNPL and
      - do not use expensive debt
      - do not use debit or cash
  - There are short-run (static) and long-run (dynamic) financing hierarchy tests that could be conducted with this data.
    - In the long-run, all debt should be BNPL.
  - Digression—We provide such tests for SMEs in a working paper with Olivia Kim (HBS).
-



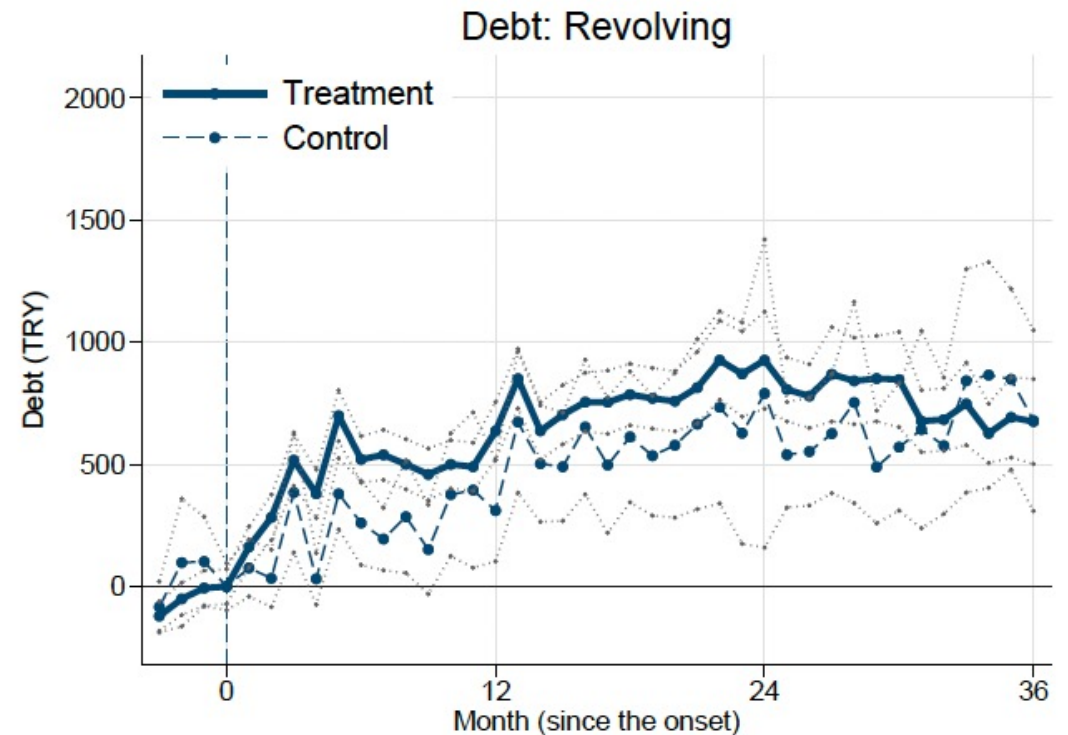
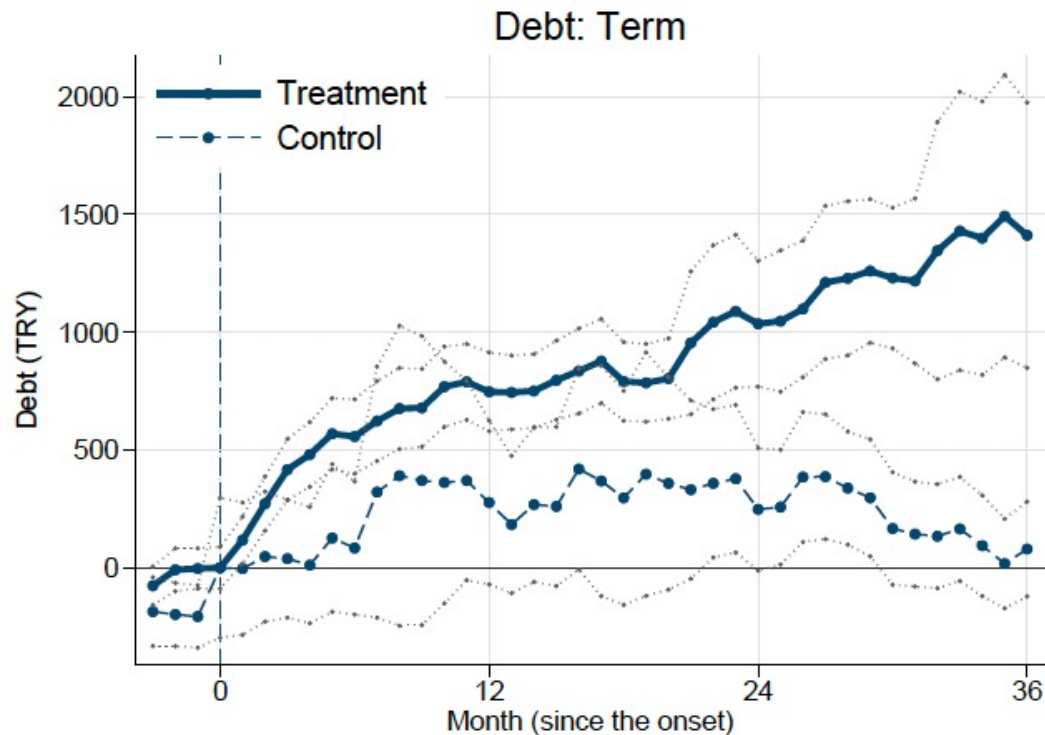
# Aydın and Kim (WP) “Finance and Investment”

## First-stage (Capacity) and Intent-to-treat (Debt) Effects





# Aydin and Kim (WP) “Finance and Investment” Debt Structure (Term vs. Revolving) Dynamics



In the long run, debt response with cheap term loans, directed to investment.



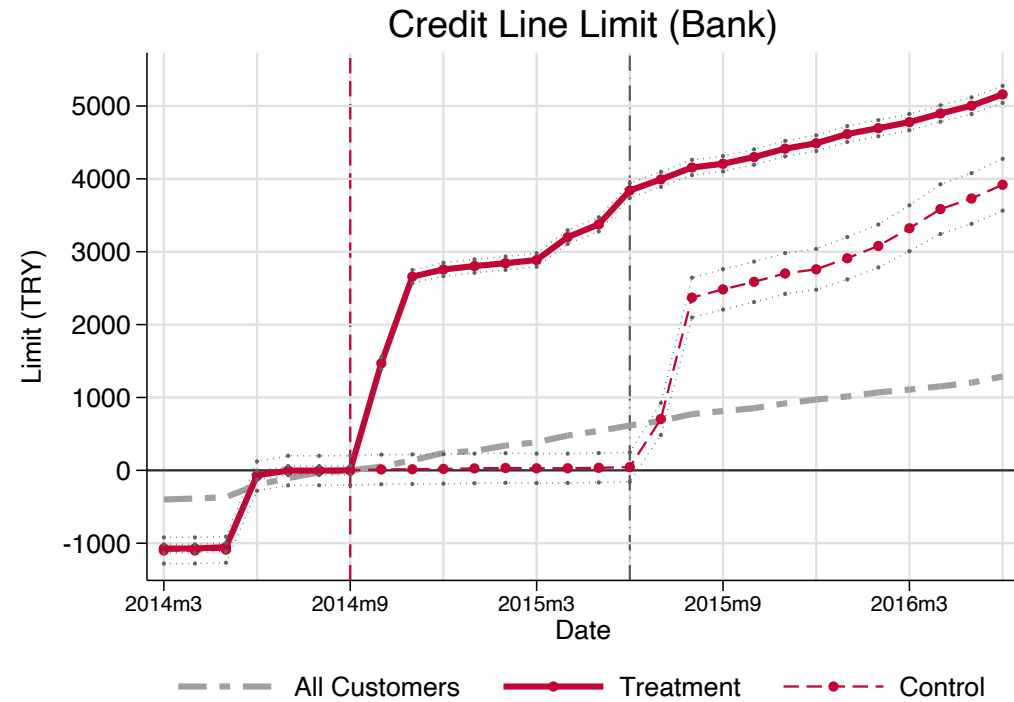
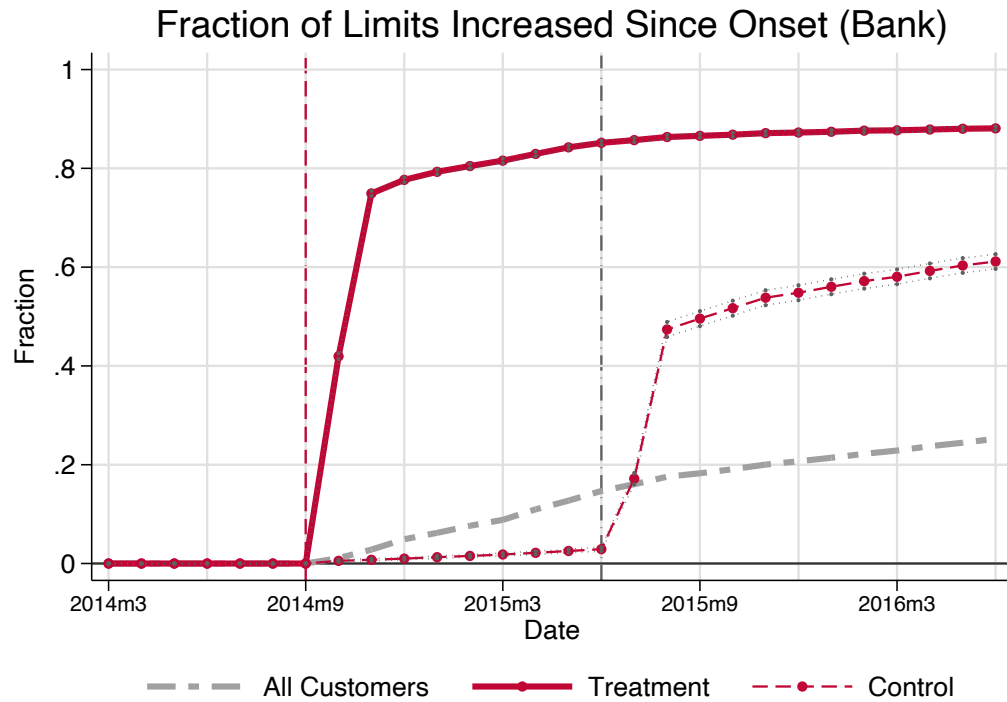
# Comment—Identification

## Randomization, Instrument, Empirical Specification

- Experiments can be constructed to randomize various aspects.
    - Who? How much? When?
  - This paper:
    - Treatment group offered BNPL and was notified immediately.
    - Control group offered BNPL two months later 2 months later.
  - What is random is timing (postponing), not whether or how much.
    - **Why not construct dynamic empirical specifications to use this feature?**
    - Similar to Aydin (2022); Parker et al. (2013) stimulus study
      - When stimulus payment is received depends on the last two digits of the SSN
-



# Aydın (2023) *AER* Consumption Response to Credit Expansions





# Final Words

- Streamline and re-organize
    - Give random BNPL supply shock the center stage.
    - Link BNPL specifics (underwriting, contracts, interest rates) to outcomes (e.g., indebtedness)
  - Other Comments
    - What do borrowers use this credit on (merchants)?
    - What are the specifics of this setting that make users carefully moderate their borrowing and spending?
    - How does pricing of rates and fees work in two-sided markets?
    - What other features attract borrowers to these plans? (e.g., budgeting)
    - How do default and bankruptcy work in China?
-





Thank you!

---