#### Credit Card Banking

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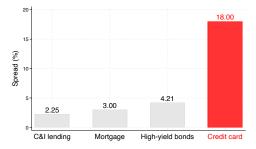
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#### Credit cards are central to consumers

- There are **548 million** credit card accounts in the US in 2023
- They are the main way consumers spend:
  - ► \$6T of purchase volume in 2023 (70% of retail consumer spending)
- Also main source of unsecured consumer borrowing
- 60% of credit card accounts (nearly half of households) are borrowers
  - ► credit card interest rate determines their marginal cost of consumption
  - ▶ are the low liquid wealth consumers that have been a focus in macro

# Credit card rates are very high

- Average annual percentage rate (APR) on credit cards in 2023 was 23%
  - ► Spread of 18% over Fed funds rate
- Credit card spread is much larger than spreads on other loans or bonds:



- 3 Despite the high rates, consumers borrow a lot on credit cards
  - ► Total US credit card balances: \$1.1T
  - ▶ 85% of balances are due to borrowers (accounts that are charged interest)

# Card lending is important for banks

- Credit card (CC) lending is only 4.5% of banks' balance sheets
- But because of their high rates they generate 16.6% of banks' interest income
- Main type of "personal lending"
- Is the riskiest form of lending banks do: unsecured consumer lending
- On average 53% of banks' annual default losses are due to CC lending
  - ▶ because CC charge-off rates are almost 10x higher than those on business or residential loans (3.96% vs. 0.46% and 0.43%)
- Aggregate CC default losses are similar in magnitude to aggregate losses on corporate bonds despite CC lending being much smaller (\$1T vs \$11T)

#### Research Questions

#### 1. Why are credit card interest rates so high?

- analyze CC lending as an asset class
- want to understand the pricing of credit card rates
- compare its pricing to that of other types of lending.

#### 2. What are the economics of credit card banking?

- ▶ investigate all the streams of revenues and costs
- ► is there market power in CC banking?
- ▶ helps answer question #1

# Why are credit card interest rates so high?

#### Potential explanations:

- Expected credit losses: interest spreads are compensation for high average default losses
- 2. "Rewards" costs: banks pay consumers large "rewards" (cash, airline miles)
- 3. Market power/rents: banks charge high rates due to market power
  - ► Imperfect competition (Ausubel 1991)
  - ► Search/switching costs (Calem and Mester 1995, Stango and Zinman 2016)
- 4. Risk premium: CC default losses carry a high risk price
  - ▶ if default risk is undiversifiable and losses are high in bad economic states
  - ▶ is the risk premium consistent with risk pricing in other asset markets?

#### Data

#### • Federal Reserve Y-14M Capital Assessments and Stress Testing data

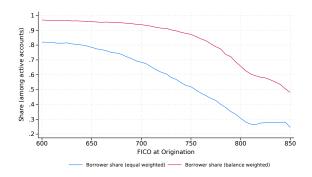
- Comprehensive loan-level and portfolio data on domestic credit card operations of U.S. banks with > \$100 billion in assets (i.e., included in stress tests)
- 20 unique BHCs accounting for > 90% of card lending
- Account-level data includes: APR, FICO score, balance, credit limit, purchase volume, promotion status (teaser rate), fees, customer information
- Portfolio-level data includes: interest expenses, rewards, interchange income, operating expenses, fraud charges
- 330 million observations/month
- **o** Sample: 2015m01 to 2023m12
- Most detailed data available on credit card banking that allows us to calculate various components of revenues and expenses at the individual account level

#### Account-level analysis

- We extract account-level information for accounts originated over 2015m1-2017m12 and track their lifetime performance until 2023m12
  - focus on general purpose cards, remove non-rewards and private-label ("store") cards
  - examine all revenue and cost components: interest, charge-offs, interchange, fees, rewards, operating costs
- 2. In each month, we classify accounts into borrowers and transactors
  - ▶ borrowers: carry balance → pay interest (unless under promotion)
  - lacktriangle transactors: pay balance within 21-day "grace period" ightarrow no interest
- 3. We further sort the borrower/transactor accounts by their FICO score at origination into portfolios that we follow over time:
  - ► Sorting on original FICO creates a large spread in default risk
  - ► APR spread set based on original FICO and is usually fixed over account's life
  - Use portfolios' cash flows to analyze return and risk to CC lending for different credit risks

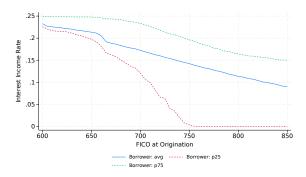
Borrowers and Credit Card Rates

# Share of borrowers by original FICO score



- Below 750 FICO the majority of accounts are borrowers (blue line)
- Borrower's share of balances > 50% at all FICOs (red line)
- Borrowers account for more than 85% of balance sheet

#### Effective interest rate paid by borrowers (2015-17 cohorts)

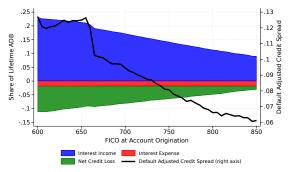


- Average rate is high for all FICO scores
  - even the highest FICO borrowers pay a very high rate/spread
  - very large compared to rates on other bonds/loans
- Credit card rate is strongly increasing in credit risk: from 10% for highest FICO to 23% lowest FICO
- 25th percentile = 0 for FICO > 750 because some accounts only borrow during 0% interest promotional period

# Interest Spread and Defaults

# Do credit spreads equal average charge-offs?

- 1. For each original FICO borrower portfolio, we calculate the average rate of interest income, expense, and net charge-offs as a share of lifetime balances
  - ► Balance = Average Daily Balance (ADB)

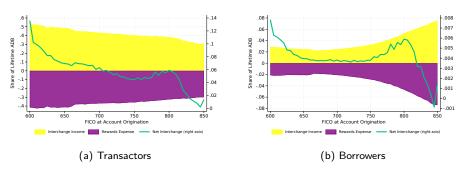


- 2. Net charge-offs increase substantially for lower original FICO socres
- 3. But interest spreads increase even more
- ⇒ Default-adj. credit spread (interest spread charge-off rate) is strongly *increasing* in default risk: from 6% for highest FICO to 12% for low FICO



#### Interchange and rewards

On average, interchange is 1.82% and rewards are 1.57% of purchase volume



- 1. Transactors: net interchange income +5% of balances for almost all FICOs
- 2. Borrowers: interchange and rewards are much smaller relative to balances, but the net interchange is still *positive*
- ⇒ Rewards are covered by interchange income and not funded by interest income

  Purchase Volume Fee Income

# Operating Expenses and Market Power

#### Operating expenses

- 1. Banking is in large part a retail business, incurs high operating expenses
- 2. Due to its intensely retail orientation, credit card banking is especially high in operating expenses: 4-5% of balances (Capital One: 8.9%)
  - ightharpoonup Much larger than for banking in general, where it is  $\approx 1.5\%$  of assets
  - ► Credit card banks spend a lot on marketing: 1–2% of assets vs 0.1%

• Capital One: \$4B American Express: \$5.5B

Coca-Cola: \$5BNike: \$4B

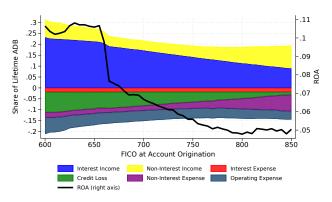
⇒ Suggests significant market power in credit card banking

#### Operating expenses and profit components

	Interest Spread (1)	Net Charge-off (2)	Gross Margin (3)
Operating Expense	0.622***	0.139	1.127**
	(0.119)	(0.149)	(0.528)
Origination FICO FE	Υ	Υ	Υ
Observations $R^2$	919	908	908
	0.895	0.734	0.489

- Bank's operating expenses are strongly related to the interest spreads they charge and gross margins they earns on borrowers at a given FICO score
  - ⇒ operating expenses incurred to obtain pricing power
- No relationship between operating expenses and default losses
  - $\Rightarrow$  higher operating expenses are *not* used for improving screening of borrower creditworthiness

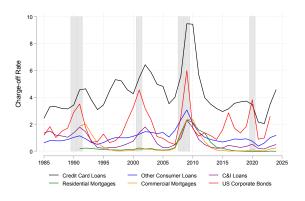
#### Borrower ROA



- 1. ROA increases from 5% (800 FICO) to 8% (660) to 11% (625)
- $\Rightarrow$  ROA is high and increasing in default risk  $\rightarrow$  suggests default risk premium
- 2. Consistent with high ROA of CC banks: 3X the average bank's ROA (FDIC Quarterly Report, 2024Q2) ROA CC Banks

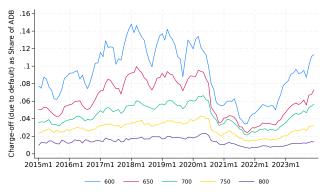


# Charge-off rates on types of loans/bonds



- 1. Credit losses co-move strongly, especially in recessions
  - $\Rightarrow$  CC default risk is undiversifiable across loan/bond markets
- 2. CC lending has the highest and most sensitive charge-off rates
- ⇒ High ROA of CC lending may be a default risk premium

#### Credit card charge-off rates across FICO over time



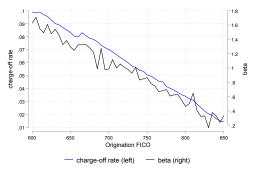
- Charge-off rates covary strongly across FICO scores
   ⇒ charge-off rates load on a common default risk factor in CC market
- 2. Lower FICO portfolio's charge-off rate is higher and more volatile ⇒ greater sensitivity to the default risk factor
- 3. We estimate a one-factor model of default risk & risk premia

# Risk exposure by FICO

1. For each FICO portfolio *i* we estimate:

$$\Delta \mathsf{Charge} ext{-off Rate}_{i,t} = \alpha_i + \beta_i \Delta \mathsf{Charge} ext{-off Rate}_t + \epsilon_{i,t}$$

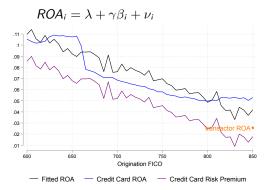
Charge-off rate<sub>t</sub>: the charge-off rate on aggregate credit card lending
 our proxy for the aggregate default risk factor



- ⇒ FICO portfolios' charge-off risk has a strong 1-factor structure
- 3. Charge-off beta  $\beta_i$  is strongly increasing in portfolio's average charge-off rate

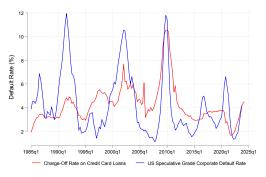
#### Estimated risk premium

We estimate:



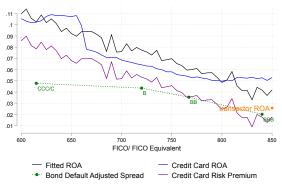
- 1. Aggregate Default Risk Premium = Price of default risk  $\gamma = 5.3\%$
- 2. Zero-beta rate  $\lambda = 2.41\%$ 
  - close to ROA of transactor portfolio (no default risk) = 2.57%
- 3. Banking sector ROA = 1.5%  $\rightarrow$  adj. for default risk: 0.97% to 1.24%
- $\Rightarrow$  CC lending earns a 1.17% to 1.44% alpha relative to the overall banking sector

# Commonality with corporate bond defaults



- 1. Speculative-grade bonds' default rates co-move strongly with credit card defaults and are similar in magnitude
  - ► corporate bond recovery rates (40%) are much higher than credit cards' (15%)
- 2. Corporate bonds market is very large, sensitive to default cycle
- ⇒ We compare risk premiums of corporate bonds with credit cards

# Comparison to high-yield bonds



- 1. Map bond ratings to comparable FICO scores
- 2. BBB to B bonds have similar risk premiums to matching FICO credit card portfolios ⇒ price in similar compensation for default risk
- 3. However, lowest-rated bonds (CCC/C) have  $\sim\!\!3\%$  lower risk premium than matching FICO credit card portfolio (620 FICO)

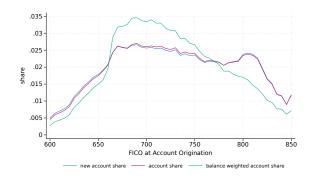


#### **Takeaways**

- Credit card interest spreads are far higher than those on other types of loans/bonds
- There are large cross-sectional differences in FICO portfolio ROAs, which can be explained by a large default risk premium
  - risk premium is similar to that in corporate bonds
- Interest spreads can be decomposed into: defaults (5.75%) + operating expenses (4.85%) + risk premium (5.26%) + alpha (1.17%)
  - $\blacktriangleright$  net interchange (+0.4%) and fees (+2.31%) add to interest spreads
- $\bullet$  Card lending's ROA is four times the banking sector average  $\to$  due to default risk premium + alpha

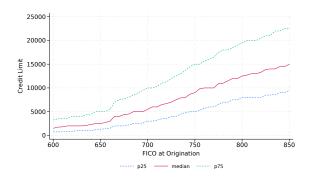


#### Distribution of FICO scores



- FICO score estimates borrower's expected default probability over next 2 years
- ullet New accounts FICOs (blue) are in 600-850, mode is 695, prime is > 660
- Aggregate balances are highest for 660-750 FICOs

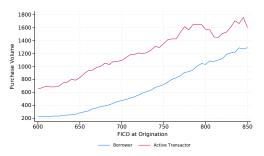
#### Credit limits



- Banks use credit limits to manage adverse selection
- Credit limit increases strongly with FICO Back

#### Purchase volume

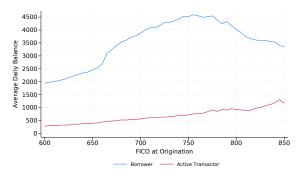
- 1. Interchange fees are paid to the issuing bank and the credit card network
- 2. Interchange fees and rewards are a fraction of the purchase volume ADB
- 3. Banks pass through a large share of interchange to cardholders as rewards
  - On average, interchange is 1.82% and rewards are 1.57% of purchase volume



- 3. Transactors have much higher purchase volumes than borrowers Credit Limits
- - ightharpoonup don't accumulate a balance  $\rightarrow$  can do a lot more purchasing
  - interchange and rewards are much more important for transactors



#### Average balances of borrowers and transactors



- Borrowers' balances are much larger than transactors'
  - ▶ Highest average borrowing balance is about \$4,500 for 740-770 FICOs
  - ► Transactors' balance is due to previous month's purchase volume
- Borrowers account for more than 85% of balance sheet

# FICO score and APR spreads

	APR Spread						
	(1)	(2)	(3)	(4)	(5)	(6)	(7)
Controls		FICO	FICO, FICO <sup>2</sup>				
Cohort FE	Υ	Υ	Υ	Υ	Υ		
Origination FICO FE				Υ	Υ		
Bank FE					Υ	Υ	
Origination FICO × Cohort FE						Υ	Υ
Origination FICO $\times$ Bank FE							Υ
Observations	30,366	30,366	30,366	30,366	30,366	30,366	30,332
$R^2$	0.021	0.474	0.505	0.547	0.709	0.722	0.871

- Account's origination FICO score strongly predicts its APR spread, which is set at origination and usually remains fixed for the account's life.
- This is due to the CARD Act, which prohibits banks from increasing an account's APR spread on outstanding borrowing.

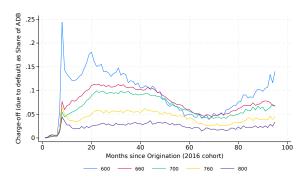
#### FICO score and charge-off rates

	Charge-off Rate						
	(1)	(2)	(3)	(4)	(5)	(6)	(7)
Controls		FICO	FICO, FICO <sup>2</sup>				
Cohort FE	Υ	Υ	Υ	Υ	Υ		
Origination FICO FE				Υ	Υ		
Bank FE					Υ	Υ	
Origination FICO × Cohort FE						Υ	Υ
Origination FICO $\times$ Bank FE							Υ
Observations	32,173	32,173	32,173	32,173	32,173	32,173	32,132
$R^2$	0.007	0.085	0.277	0.311	0.489	0.508	0.728

• FICO score has significant predictive power for ex-post default rates (Back)

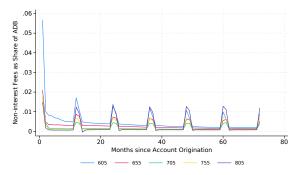


#### Life cycle of charge-offs



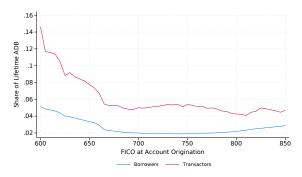
- Origination FICO predicts charge-off rates over accounts' life cycle
  - ► annual charge-offs increase from around 3% (800 fico) to 10% (660 fico) and 15% (600 fico) Back

#### Fee Income over account lifetime



- 1. Fee income: annual fees, balance transfer fees, and late penalties
  - ▶ are seasonal, e.g. annual fees are charged every 12 months
- 2. Fee income is large, particularly for highest and lowest FICO borrowers
- 3. Low FICO borrowers pay very high balance transfer fees at the beginning

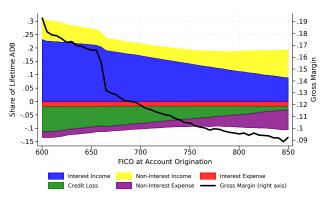
# Fee income by origination FICO



- Fee income (as a share of balance) is high for transactors, driven by annual fees and relatively low ADB
- For both transactors and borrowers, fee income is highest for subprime FICO, driven by balance transfer fees and late penalties

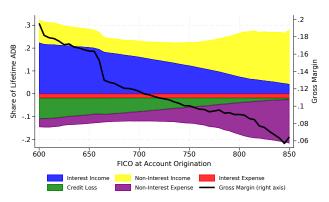


# Gross margin (Borrowers)



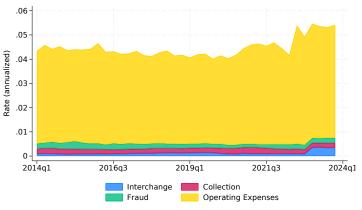
- 1. Default-adjusted credit spread + net non-interest income
- 2. Gross lending margin increases from 9.5% (850 FICO) to 13% (660) and 19% (600)
- ⇒ Gross Margins are very large and increase strongly with accounts' credit risk
- 3. Borrowers are paying very high all-in costs net margin borrower
  - ▶ Even the safest borrowers pay 10% default-adjusted spread over the short rate

# Gross margin (All Accounts)



- Gross lending margin: profits before fixed operating costs = default-adjusted cost of borrowing
- Default-adjusted borrowing costs are uniformly high
- Default-adjusted cost is higher for lower FICOs net margin borrower

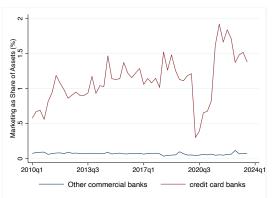
#### Operating expenses



- 1. Fed's Y14M data reports operating expenses
- 2. Operating expenses are 4-5% of balances
  - lacktriangle Much larger than for banking in general, where it is  $\approx 1.5\%$  of assets
- 3. Fraud and collection expenses are small



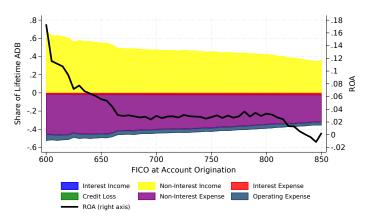
#### Marketing expenses



- 1. Credit card banks spend a lot on marketing: 1-2% of assets (call reports)
- 2. They are some of the largest marketers (2023):
  - ► Capital One: \$4B American Express: \$5.5B
  - ► Coca-Cola: \$5B Nike: \$4B
- ⇒ Suggests significant market power in credit card banking



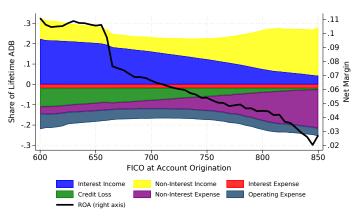
# ROA (Transactors)



- Higher for low FICO transactors due to transfer and late fees
- Transactor profits are flat at around 3.5% from 680<FICO<820

net margin horrowers

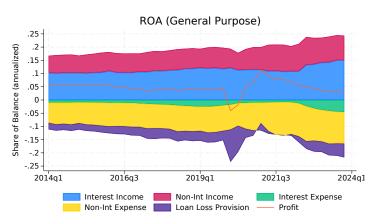
# ROA (All accounts)



• Average credit card ROA is 6.24%



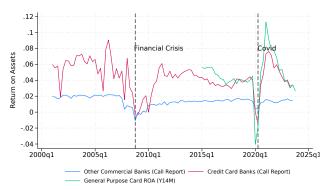
#### General purpose credit card portfolio ROA



- Credit card ROA is stable at around 5% for the past 10 years
- Large provision for loan losses during Covid was not realized and quickly reverted

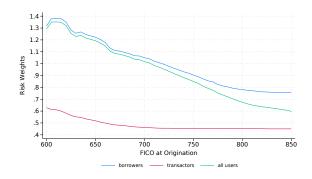


#### Credit card bank ROA



- 1. ROA from Call Reports of banks with high credit card share
- 2. ROA is 3X the average bank's ROA
- 3. Not as high as acc-level ROA as banks have other, lower-return, business segments
- 4. FDIC Quarterly Report (2024Q2):
  - ► Credit card banks: ROA 3.18% ROE 31.03%
  - ► Average bank: ROA 1.20% ROE 12.26% net margin borrowers

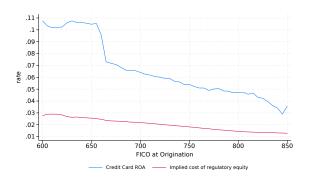
#### Credit card loan risk weights



- Risk weight is determined by bank's internal assessments of account's probability of default
  - ▶ subject to a lower bound of 45% for transactors and 75% for borrowers
  - ▶ Borrower risk weight is more than twice as high as transactors



#### Credit card cost of regulatory capital



- 1. CC cost of reg. capital = CC risk weight  $\times$  bank's cost of reg. capital
- 2. Bank's pre-tax ROA (1.5%) divided by risk-weighted asset (70%) gives the banking sector cost of reg. capital (2.14%)
- 3. Required return on regulatory equity does  $\underline{not}$  bind  $\Rightarrow$  does  $\underline{not}$  drive ROA

