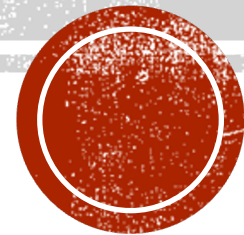


# HIDDEN MEDICAL DEBT AND CONSUMER ACCESS TO CREDIT

By Elena Loutskina and Joonsung (Francis) Won

*University of Virginia, Darden School*

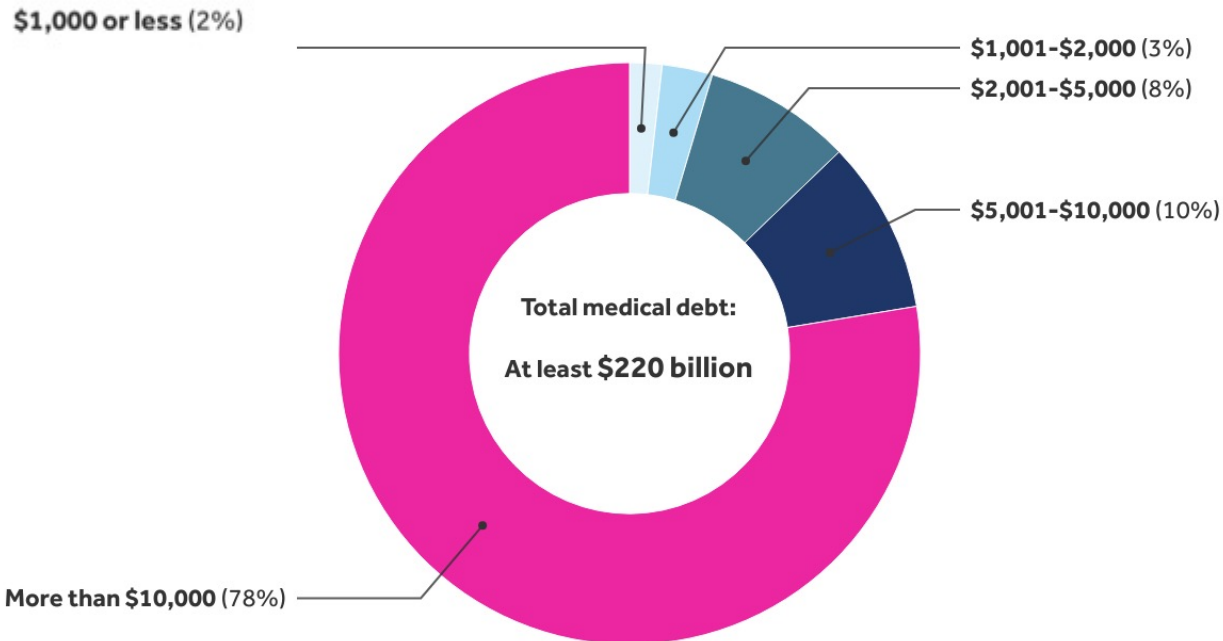
June 11<sup>th</sup>, 2026



# HEALTHCARE COSTS IMPLICATIONS

## ■ Kaiser Family Foundation

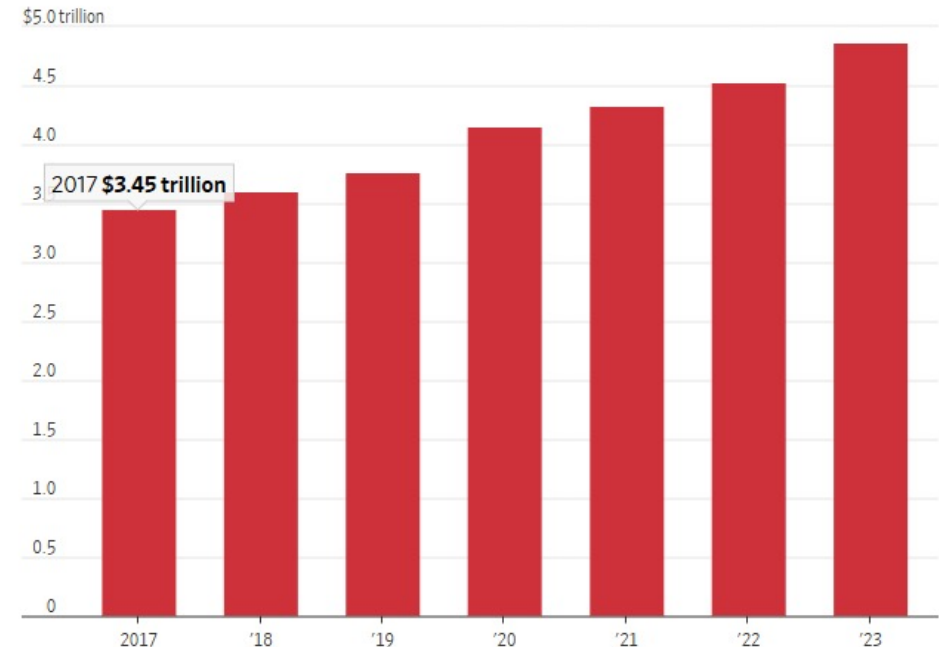
- U.S. consumers owe at least **\$220 billion** in medical debt (2021)—about 29% of credit card debt
- Most of that debt is owed by people with over \$10,000 in debt



Source: [Kaiser Family Foundation](#)

## ■ Rising healthcare costs in the U.S.

National Health Expenditures



Source: Centers for Medicare & Medicaid Services

Source: [Wall Street Journal](#)

# LIMITED MEDICAL DEBT/COLLECTIONS REPORTING

---

## Kaiser Family Foundation

U.S. consumers owe at least **\$220 billion** in medical debt (2021)—about 29% of credit card debt

## Credit Bureau Files

About **\$60.6 billion** of medical debt was recorded by a credit bureau in September 2021

Based on 5% random sample of consumers in Experian (2017-2023)

- **Medical debt and collections are not systematically reported to credit bureaus**

## ■ Why?

1. Insurance adjustments, disputes, and delays in processing make it difficult to determine the final amount a patient owes.
2. Medical debt is processed “in-house” by healthcare providers
  - Reputational concerns
  - Cost efficiency
3. Long cycles of debt collection and renegotiation
4. Ultimately transfer to (small) collection agencies that have little to no ties with credit bureaus

# POLICY DEBATE

## Policymakers:

- Medical debt data are imprecise and put undue pressure on consumers
- 2022 Policy Shift
  - Limited reporting of medical debt and related collection balances to credit bureaus
- 2025 Biden admin introduced full ban

## Lending industry advocates:

- Medical debt data are *incomplete*
  - Impedes the ability to assess consumers' true indebtedness
- Advocate better, timely reporting practices

## BOTH: Lenders are unaware

- Implications on consumer access to credit

### Biden Administration Moves to Ban Medical Debt From Credit Reports

The future of the new rule remains in question, however, with President-elect Donald J. Trump set to return to the White House this month.

OPINION EDITORIALS

*Our View: Debt-relief plan is a good, but temporary, fix*

Listen to this article · 4:09 min [Learn more](#)

Share full article

### New federal rule will remove medical debt from credit reports

A new rule on medical debt could affect millions of Americans' credit scores.

By [Elizabeth Schulze](#)

January 7, 2025, 5:07 AM



GOVERNMENT

### Oklahoma House bill would lessen

### McHenry Says CFPB Proposal Would 'Severely Impair' Credit Report Accuracy

"People who get sick shouldn't have their credit scores hurt by the new rule." Michael A. McCoy/Getty Images

By [Madeleine Ngo](#)  
Reporting from Washington  
Jan. 7, 2025

BY PYMNTS | JUNE 11, 2024



### The big business that opposes wiping medical debt from credit reports

Investors have been buying up medical debt collectors. A proposal championed by Vice President Harris would make their jobs harder.

October 18, 2024

# ECONOMIC RATIONALE

---

**Limiting negative public information** increases credit access for **direct beneficiaries**

- Bankruptcy flag removal increases credit limits, credit scores, borrowing, and entrepreneurial activities
  - Dobbie et al. (2020); Gross et al. (2020); Herkenhoff et al. (2021)
- Removing medical collection data (2022 Policy Shift):
  - CFPB (2024) reports credit score increase by 20 points, on average
  - Duarte et al. (2025)

**Incomplete credit information** is associated with **lower overall social welfare**

- Aggregate access to credit and social welfare declines
  - Liberman et al. (2018); Jansen et al. (2025)
- Adverse selection framework predicts **risk pooling behavior by lenders**
  - Chatterjee et al. (2023, 2025)

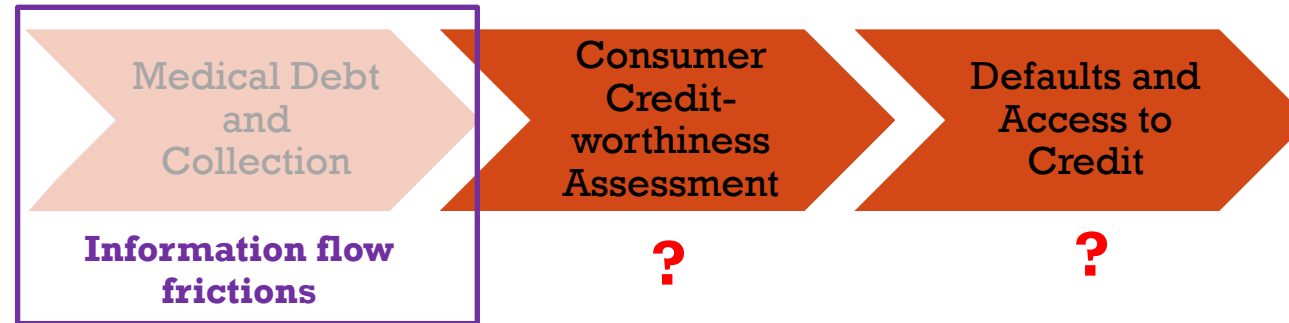
# THIS PAPER

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# THIS PAPER

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- 1. Does hidden medical debt affect informativeness of consumer creditworthiness measures?**
    - Credit scores and DTIs' ability to predict defaults
  - 2. Are lenders aware of the impact of hidden medical debt?**
    - Effects on credit supply
- ❖ Leverage the *2022 Policy Shift* (information friction shock)

# RESULTS IN A NUTSHELL

---

## **Introduce a new HCC measure that captures geographic heterogeneity in healthcare cost**

- Validate this measure using available data on medical debt and collections
  - Assumption: observable medical debt and related collections are not randomly distributed

### **1. Credit scores overestimate the quality of borrowers in high HCC CBSAs:**

- Consumers in high HCC geographies default more conditional on their credit scores
  - More so for low credit score borrowers
  - More so for high DTI borrowers

### **2. Lenders internalize the borrower risk associated with local HCC**

- Mortgage approval rates are lower in high HCC markets, conditional on observables
  - More so for low credit score borrowers
  - More so for high DTI borrowers

### **3. Economic channel: information frictions**

- Results are stronger after Q1 2022 government regulation restriction on medical debt collection reporting



# HEALTHCARE COSTS MEASURES

# MSPB HEALTHCARE COSTS DATA

---

## Medicare Spending Per Beneficiary - Hospital

Data.CMS.gov  
Centers for Medicare & Medicaid Services

The Medicare Spending Per Beneficiary (MSPB) Measure shows whether Medicare spends more, less, or about the same for an episode of care (episode) at a specific hospital compared to all hospitals nationally. An MSPB episode includes Medicare Part A and Part B payments for services provided by hospitals and other healthcare providers the 3 days prior to, during, and 30 days following a patient's inpatient stay. This measure evaluates hospitals' costs compared to the costs of the national median (or midpoint) hospital. This measure takes into account important factors like patient age and health status (risk adjustment) and geographic payment differences (payment-standardization).

- **Created by CMS to evaluate hospitals' cost (in)efficiencies (Norton et al., 2018; Currie et al., 2023).**

# DISTRIBUTION OF MSPB

- Hospital level (mapped to CBSA)
- Annual
- Costs per patient, per hospitalization incident:
  - Pre-hospital
  - Hospital stay
  - Post-discharge
- Based on Medicare data:
  - Homogenous population
  - Less likely to borrow to fund medical expenses
  - Not affected by insurance coverage

Period	Type of services	Percent of costs per incident
1 to 3 days Prior to Index Hospital Admission	Home Health Agency	0.06%
	Hospice	0.00%
	Inpatient	0.03%
	Outpatient	0.73%
	Skilled Nursing Facility	0.01%
	Durable Medical Equipment	0.04%
	Carrier	2.72%
During Index Hospital Admission	Home Health Agency	0.00%
	Hospice	0.00%
	Inpatient	47.16%
	Outpatient	0.00%
	Skilled Nursing Facility	0.00%
	Durable Medical Equipment	0.09%
	Carrier	7.06%
1 through 30 days After Discharge from Index Hospital Admission	Home Health Agency	3.75%
	Hospice	0.70%
	Inpatient	13.24%
	Outpatient	4.01%
	Skilled Nursing Facility	14.50%
	Durable Medical Equipment	0.43%
	Carrier	5.47%



# ADVANTAGES OF THE MSPB BASED MEASURES

---

## 1. Price-standardized

- Regional payment differences are adjusted out.

## 2. Free of potential biases stemming from geographical variations in healthcare utilization by patients

- It reports costs *per hospitalization incident* (Skinner, 2011).

## 3. Adjusted for patient risk factors, including:

- Age
- Severity of illness

Core MSPB variation: *hospital inefficiency*  
(overprovision of services & service quality )

# OUR HCC PROXIES

---

## 1. Baseline measure:

$$MSPB\ Costs_{CBSA,t} = \frac{Avg\ Medicare\ Spending\ per\ Beneficiary\ per\ Incident_{CBSA,t}}{National\ Avg_t}$$

## 2. Post-hospitalization care-based measure:

- Das et al. (2016); Norton et al. (2018); Einav et al. (2023): inefficiencies in post-hospital care

$$Post-Discharge\ MSPB\ Costs_{CBSA,t} = \frac{Avg\ Post\ Discharge\ MSPB_{CBSA,t}}{National\ Avg_t}$$

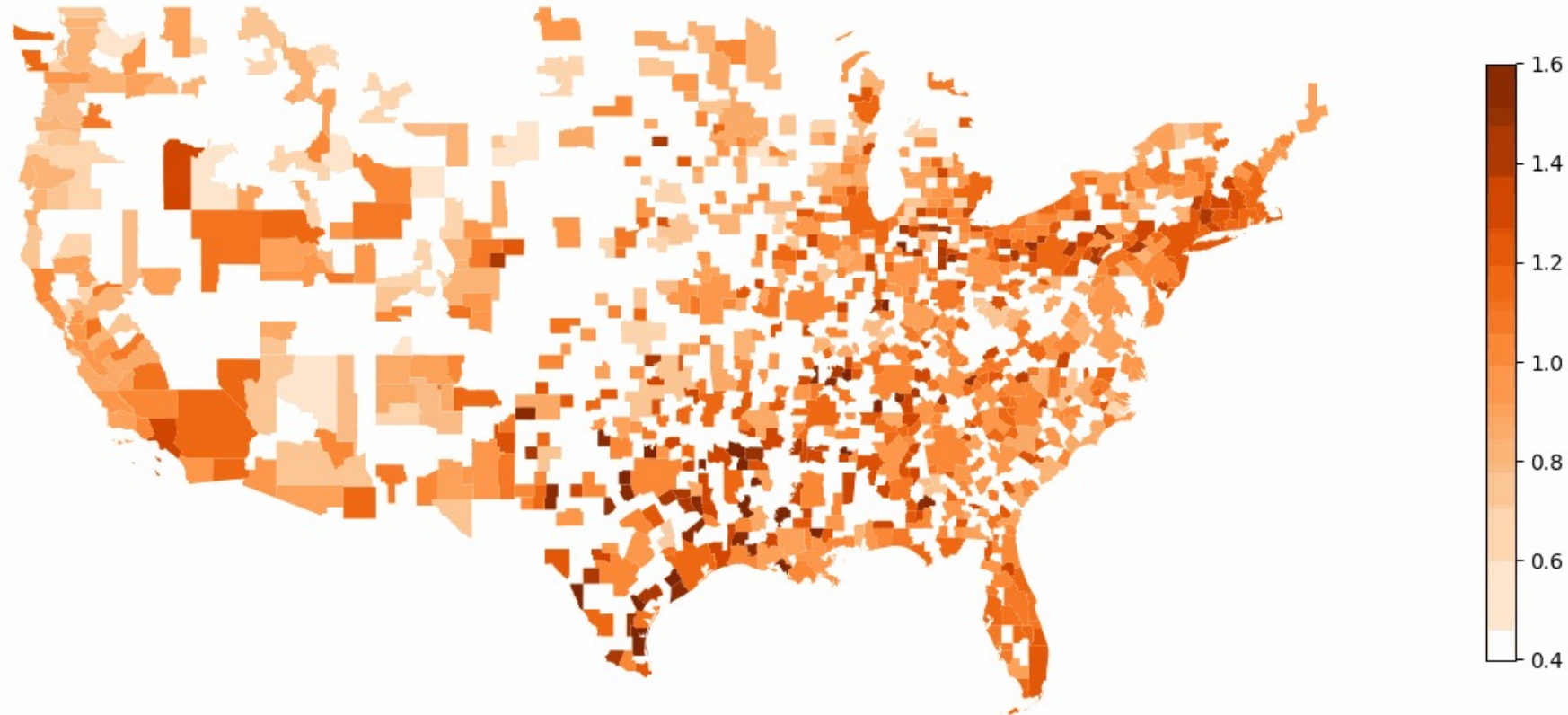
## 3. Post-hospitalization costs overruns measure:

$$\left( \frac{Ratio\ of\ Post-Discharge}{to\ Pre-Discharge\ MSPB\ Costs} \right)_{CBSA,t} = \left( \frac{Post-Discharge\ MSPB\ Costs}{Pre-Discharge\ MSPB\ Costs} \right)_{CBSA,t} / National\ Avg_t$$

# GEOGRAPHIC VARIATION OF HEALTHCARE COST

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Heatmap  
Post-Hospital to Pre-Hospital MSPB Costs  
CBSA-Year level  
**Year: 2016**



# DO HCC PROXIES EXPLAIN MEDICAL DEBT AND COLLECTIONS?

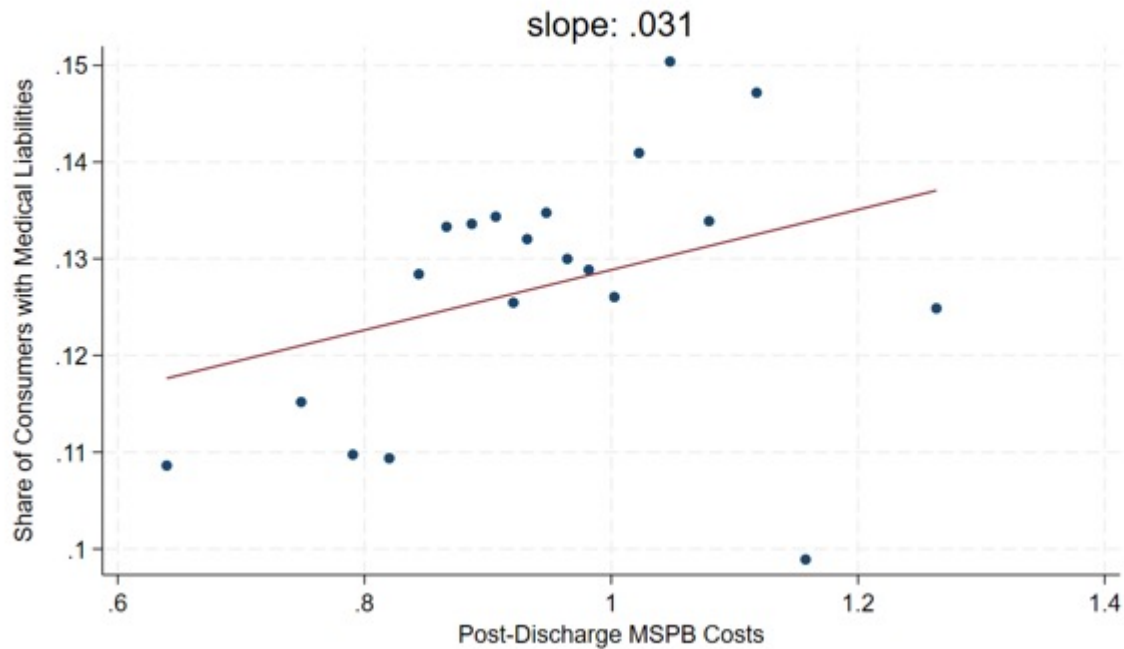
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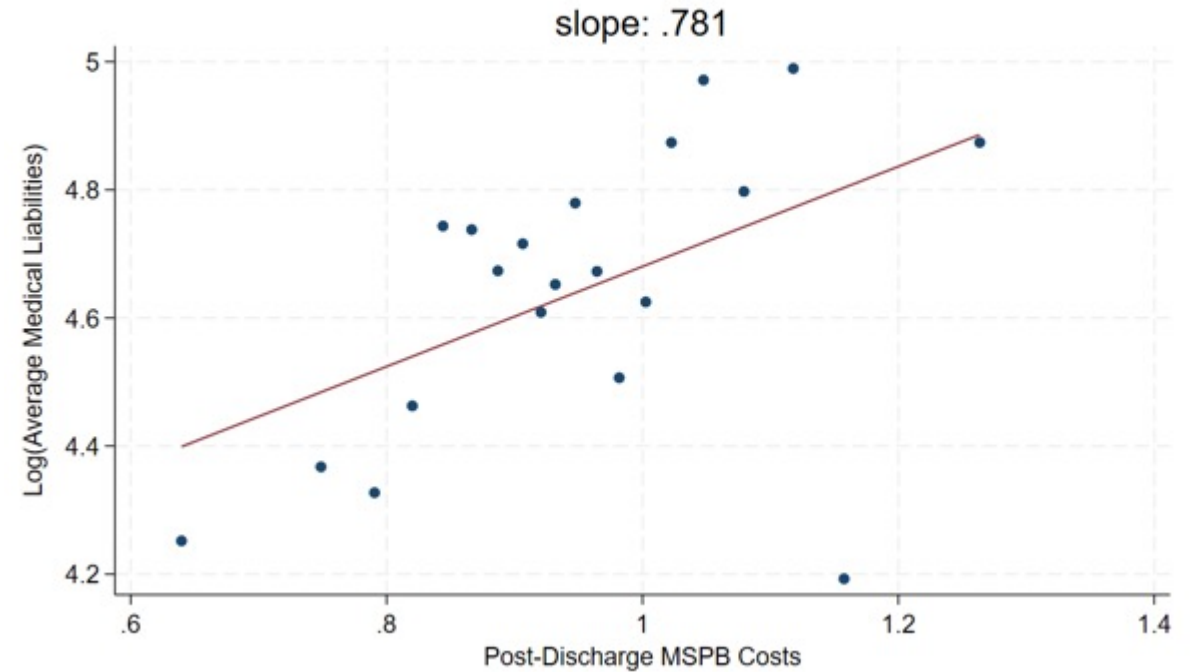
- HCC proxy
  1. Contributes to HCC heterogeneity across markets ✓
  2. Reasonably unrelated to
    - a. Local consumer financial health ✓
    - b. Demographic characteristics ✓
    - c. Insurance coverage ✓
  3. Drives medical debt and related collection ?
- Notably: does not (have to) capture all sources in healthcare costs heterogeneity

# FIG 4: HCC AND MEDICAL DEBT COLLECTIONS

Panel A: Healthcare Costs and the Share of Consumers with Medical Liabilities



Panel B: Healthcare Costs and the Average Medical Liabilities




# T2: VALIDATION: HCC AND MEDICAL DEBT COLLECTIONS

- 5% random sample of individuals in Experian aggregated to ZIP code level
- **Limited** medical debt and medical debt collections data

<i>Dependent Variable (ZIP,t)</i>	<i>Share of Consumers With Medical Debt</i>			<i>ln(Average Medical Debt)</i>		
	<i>(1)</i>	<i>(2)</i>	<i>(3)</i>	<i>(4)</i>	<i>(5)</i>	<i>(6)</i>
<b>Panel B: HCC Proxy = Post-Discharge MSPB Costs</b>						
Post-Discharge MSPB Costs <sub>(CBSA, t)</sub>	0.099*** (5.90)	0.071*** (4.90)	0.040*** (3.20)	1.498*** (5.44)	1.169*** (4.61)	0.610*** (2.84)
Consumer Financials <sub>(ZIP, t)</sub>	-	Y	Y	-	Y	Y
Insurance Coverage Controls <sub>(County, t)</sub>	-	-	Y	-	-	Y
Local Economy Controls <sub>(CBSA, t)</sub>	Y	Y	Y	Y	Y	Y
Time FE	Y	Y	Y	Y	Y	Y
Observations	341,673	341,673	341,673	341,673	341,673	341,673
R-squared	0.14	0.29	0.33	0.09	0.15	0.19
Within R-squared	0.10	0.26	0.30	0.07	0.13	0.17

$\beta = 0.099$  (Column 1):

- 1% higher healthcare cost than the national average is associated with a 0.099% increase in the share of consumers with medical debt accounts

A stethoscope is positioned on the right side of the image, resting on a blue surface. In the background, a document with a grid pattern is visible. The overall color scheme is a deep blue with a subtle grid pattern.

**DO HIDDEN MEDICAL DEBT  
AFFECT CONSUMER  
CREDITWORTHINESS MEASURES?**

# DATA

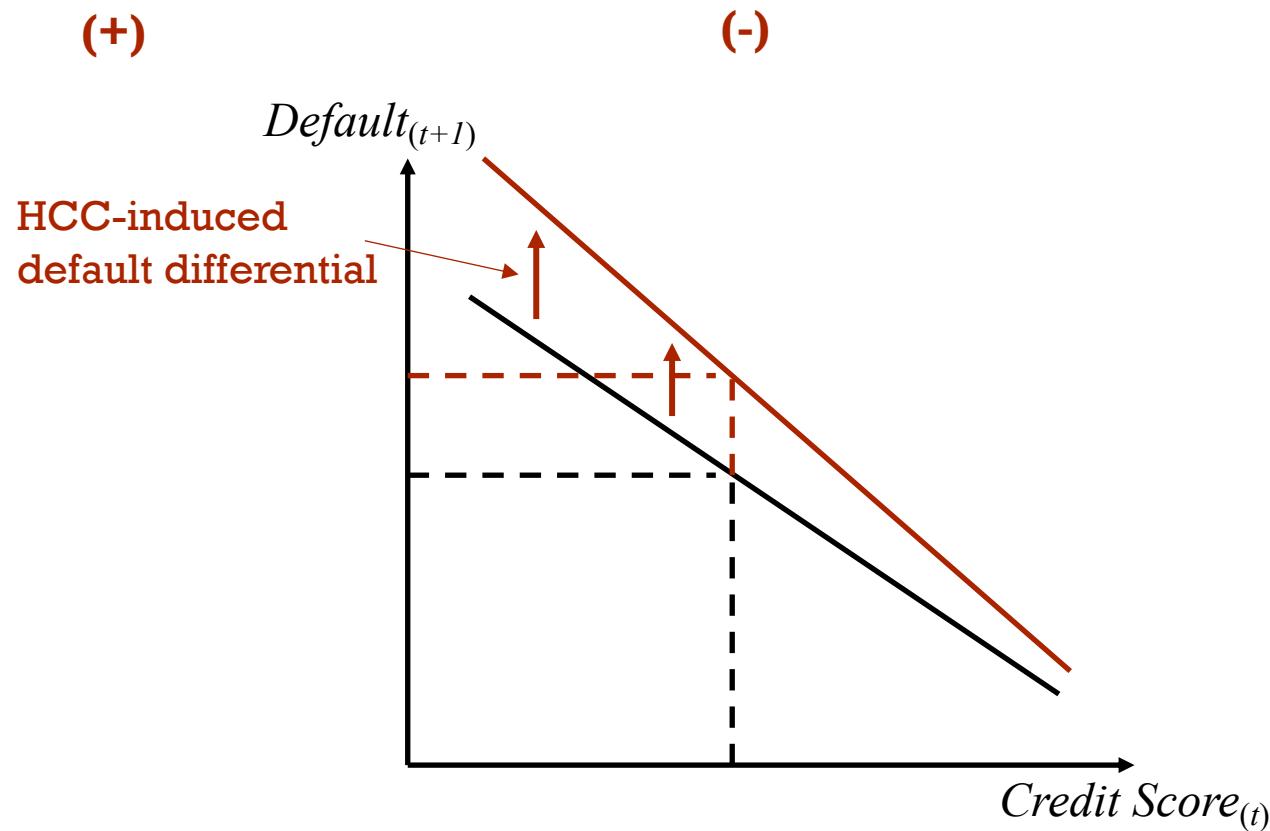
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- Experian data :
  - 5% random sample of consumer credit records
  - Unbalanced panel of ~14 million consumers
  - Measure financial outcomes for the *representative ZIP-code level consumer*
  - Sample extends from 2017 to 2023 semiannually
- Core variables of interest (at ZIP code level)
  - Consumer financial conditions
    - Credit Score, DTI, income level, ...
  - Default rates
    - Share of consumers in an area with more than 5% of outstanding debt balance in delinquent or derogatory conditions

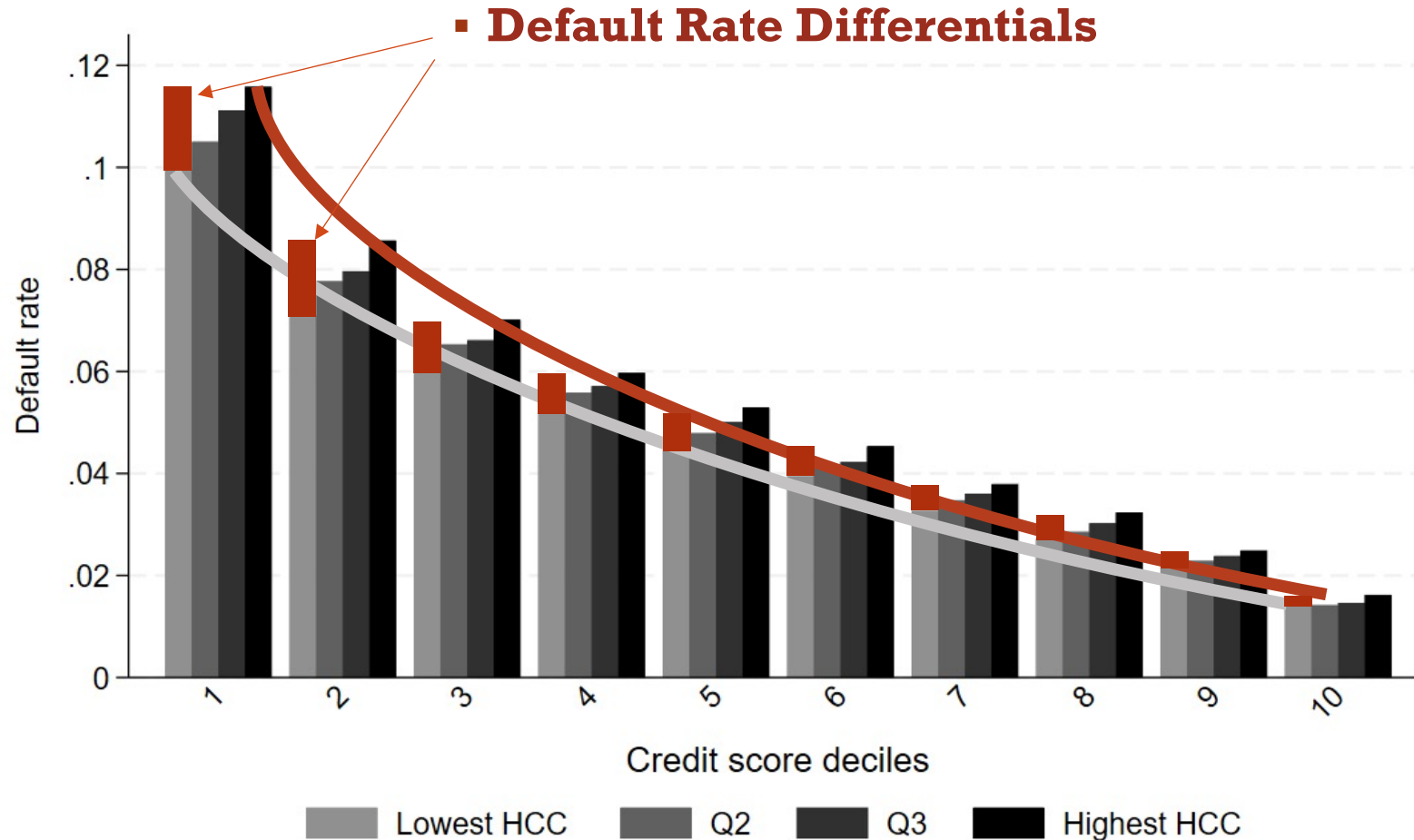
# EMPIRICAL DESIGN

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$$Default_{ZIP,t+1} = \beta_0 CreditScore_{ZIP,t} + CONTROLS + \gamma_t + \mu_{CBSA} + \varepsilon_{ZIP,t+1}$$

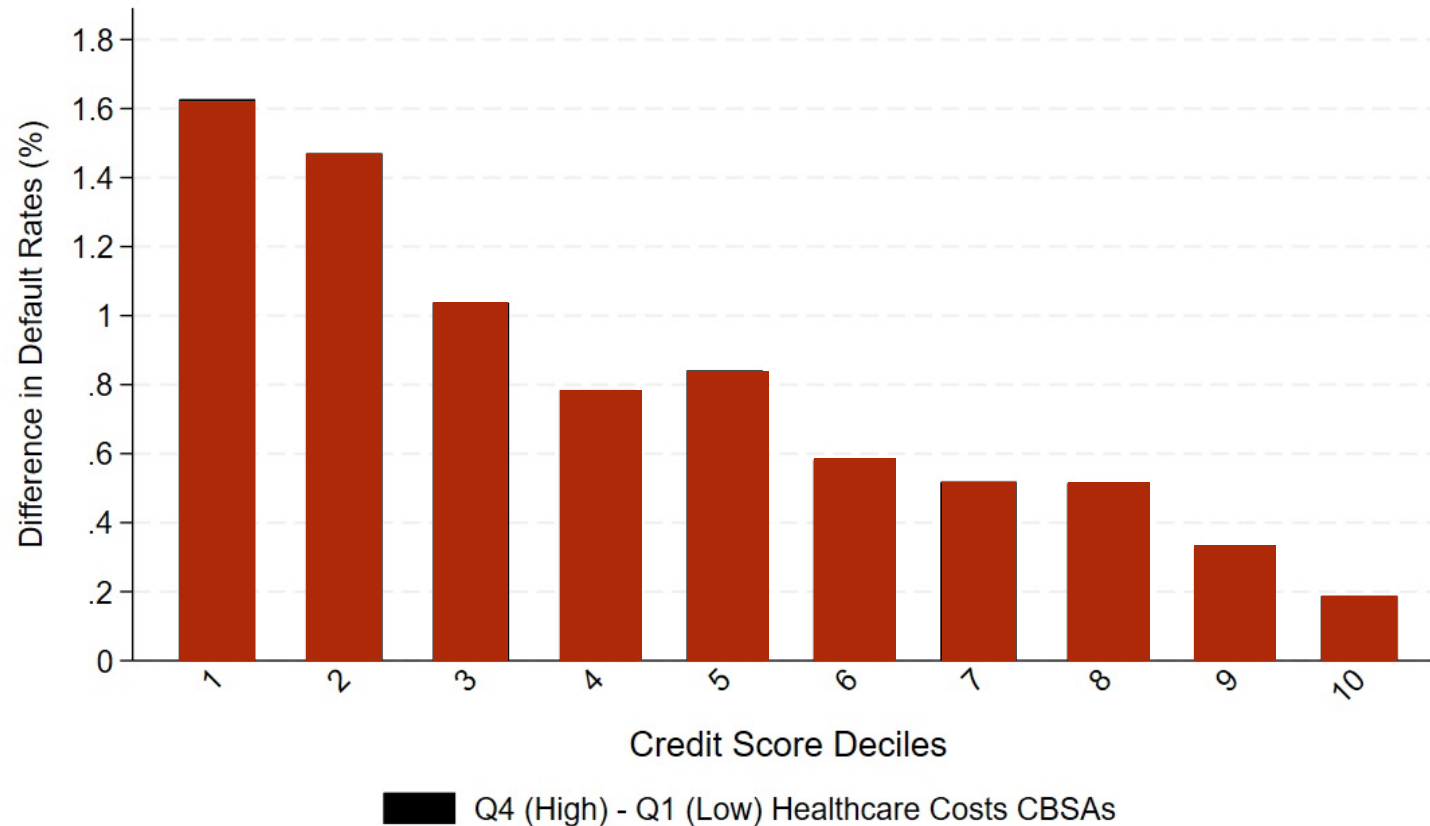


# FIG 2(A): CREDIT SCORE DISTORTION

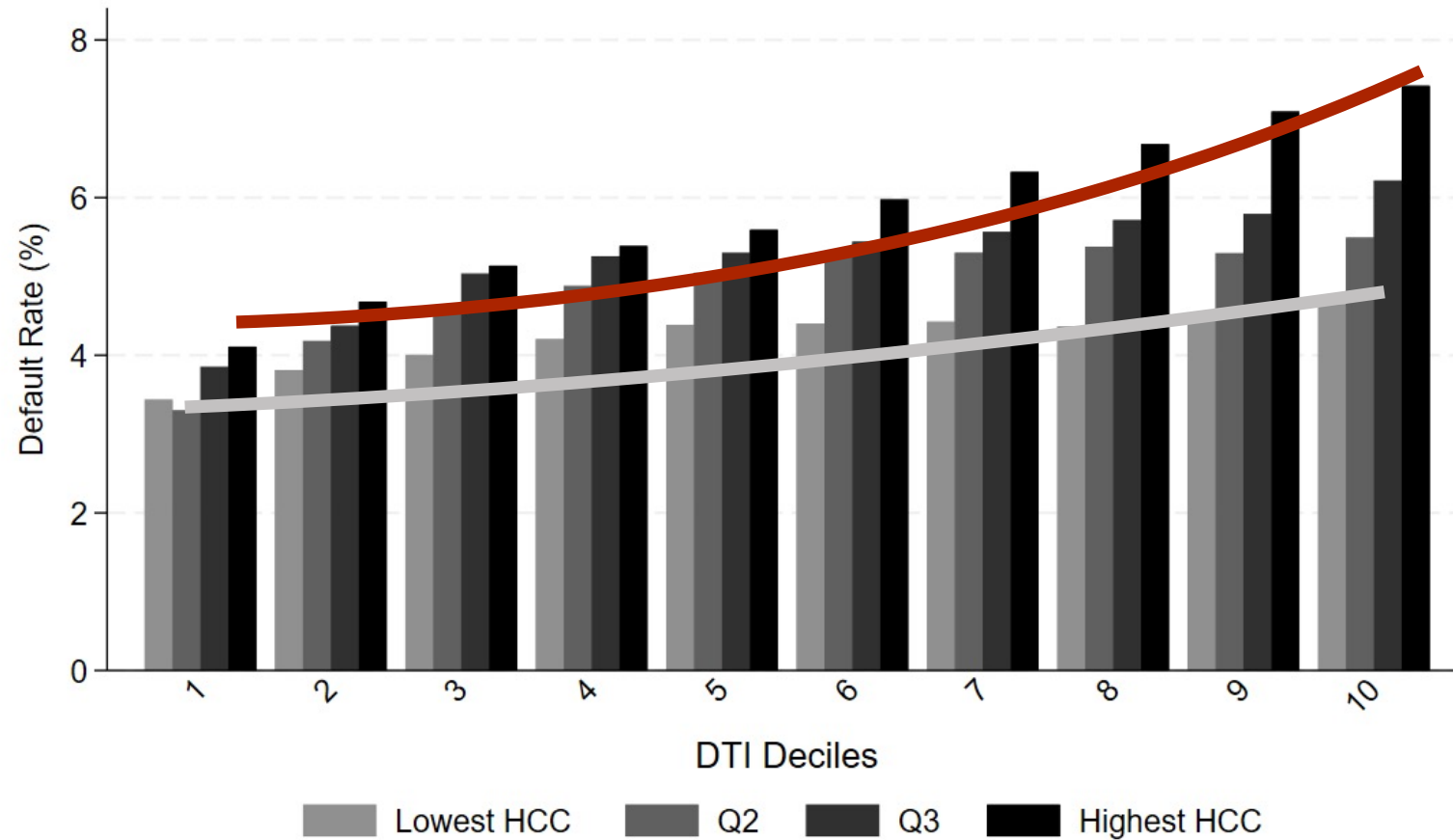


# FIG 2(B): CREDIT SCORE DISTORTION

- **Default Rate Differentials**



# FIG 2(C): DTI DISTORTION



# T3: CONSUMER DEFAULTS AND CREDIT SCORES

<i>Dependent Variable (ZIP,t+1)</i>	<i>% Delinquency or Default in the Next 6 Months</i>					
	(1)	(2)	(3)	(4)	(5)	(6)
<i>Panel B: HCC Proxy = Post-Discharge MSPB Costs</i>						
Post-Discharge MSPB Costs <sub>(CBSA, t)</sub>	-	0.269*** (5.87)	-	0.233*** (4.32)	-	-
Credit Score/100 <sub>(ZIP, t)</sub> × Post-Discharge MSPB Costs <sub>(CBSA, t)</sub>	-	-0.037*** (5.89)	-	-0.033*** (4.33)	-	-0.034*** (4.15)
Credit Score/100 <sub>(ZIP, t)</sub>	-0.056*** (30.09)	-0.022*** (3.86)	-0.057*** (30.15)	-0.026*** (3.71)	-0.057*** (29.81)	-0.025*** (3.23)
Consumer Financials Including DTI	Y	Y	Y	Y	Y	Y
Local Economy and Insurance Controls	Y	Y	Y	Y	Y	Y
CBSA FEs	-	-	Y	Y	-	-
Time FEs	Y	Y	Y	Y	-	-
CBSA × Time FEs	-	-	-	-	Y	Y
Observations	341,673	341,673	341,673	341,673	341,651	341,651
R-squared	0.29	0.29	0.30	0.30	0.30	0.30
Within R-squared	0.28	0.28	0.20	0.20	0.21	0.21

*If Credit Score 700:*

High HCC vs low HCC market matters less

*For every 100 point decline in Credit Score:*

Consumers are 0.47% more likely to default if reside in high HCC vs low HCC market

# CONTROLS

---

- ZIP-code representative consumer financial characteristics
  - Credit score
  - Debt-to-income ratio
  - Natural logarithm of income
  - Natural logarithm of the age of the oldest credit account
  - Proportion of consumers with collections
  - Ratio of total collections to total debt balance
- Local insurance coverage and health conditions
  - Share of the local population aged 65 and older (NIH)
  - Share of local insured population (SAHIE)
  - Average case mix index capturing the local health case complexity (CMS)
- Local economic conditions (QCEW from BLS)
  - Total local employment
  - Average wages
  - Past employment and wage growth
  - 2- digit NAICS industry labor shares that account for local industry composition

# T5: CONSUMERS WITH AND WITHOUT MEDICAL DEBT

<i>Dependent Variable (ZIP,t+1)</i>	<i>% Delinquency or Default in the Next 6 Months</i>				
	<i>Medical Debt Accounts:</i>	<i>With</i>	<i>Without</i>	<i>With</i>	<i>Without</i>
<b><i>Panel A: Credit Score Analysis</i></b>					
Local Healthcare Costs <sub>(CBSA, t)</sub>		0.074 (1.24)	0.176*** (4.86)	-	-
Credit Score/100 <sub>(ZIP, t)</sub> × Local Healthcare Costs <sub>(CBSA, t)</sub>		-0.013 (1.34)	-0.025*** (4.93)	-0.012 (0.97)	-0.026*** (4.81)
Credit Score/100 <sub>(ZIP, t)</sub>		-0.069*** (7.43)	-0.027*** (5.48)	-0.070*** (6.07)	-0.026*** (4.96)
Consumer Financial Controls		Y	Y	Y	Y
Local Economy and Insurance Controls		Y	Y	Y	Y
CBSA FEs		Y	Y	-	-
Time FEs		Y	Y	-	-
CBSA × Time FEs		-	-	Y	Y
Observations		287,326	340,693	287,267	340,671
R-squared		0.11	0.11	0.12	0.22
Within R-squared		0.04	0.04	0.04	0.17



# **INFORMATION FRICTIONS VS CASH FLOW CHANNELS:**

## **2022 POLICY SHIFT**

# ECONOMIC CHANNEL: INFORMATION FRICTIONS

---

2022 Policy Shift (March 18<sup>th</sup>, 2022)

- **Effective July 1<sup>st</sup>, 2022**

- Medical collections information that meet certain criteria will no longer be included on U.S. consumer credit reports, ([Transunion](#), [Equifax](#), [VantageScore.com](#))

- A. Accounts that has been (potentially) paid by the consumers**

- B. Collection tradelines younger than 12 months**

- **Effective January 2023**

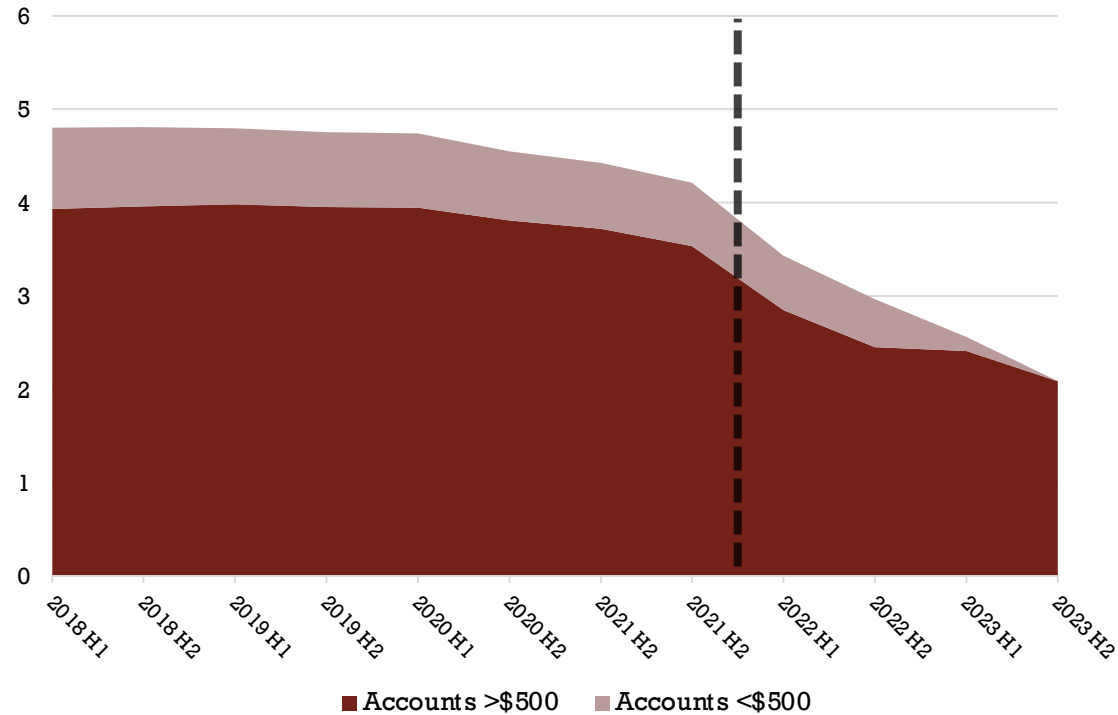
- C. No longer consider medical collection accounts under \$500.**

- Duarte et al (2026) explores the impact of this restriction on direct beneficiaries.*

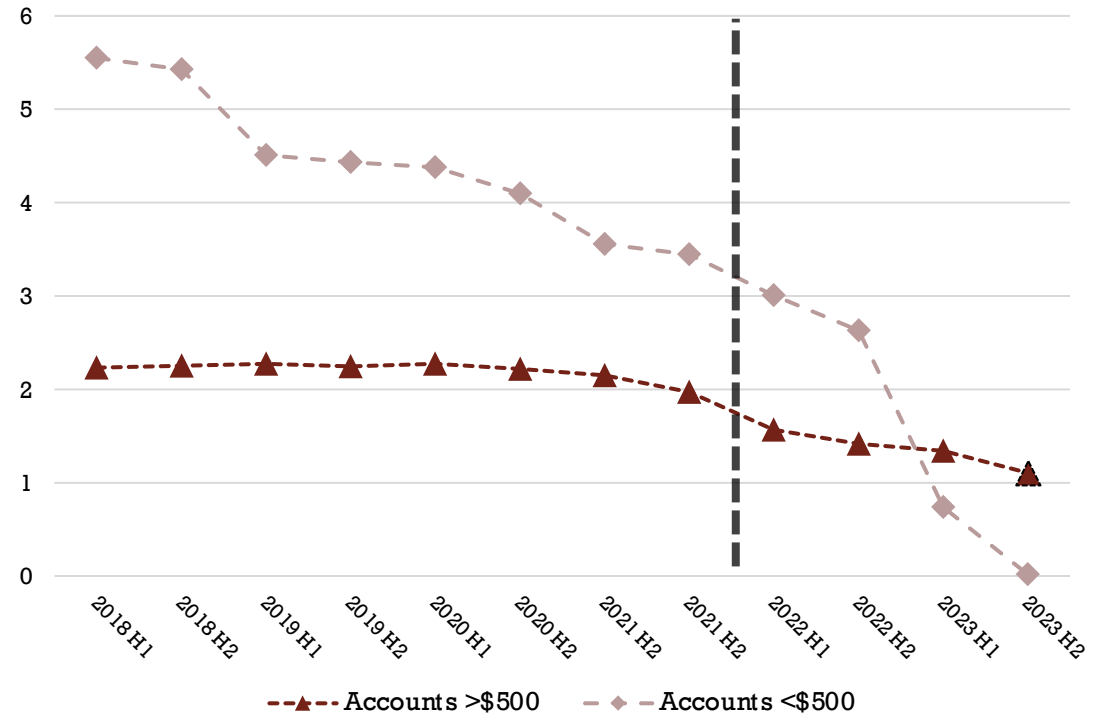
- In contrast to Klunder et al (2024) the policy eliminated medical debt from credit bureau files but not from consumer balance sheets.

# MEDICAL DEBT COLLECTION ACCOUNTS

Total collection balances  
(in billions of USD)



Number of collection accounts  
(in millions)

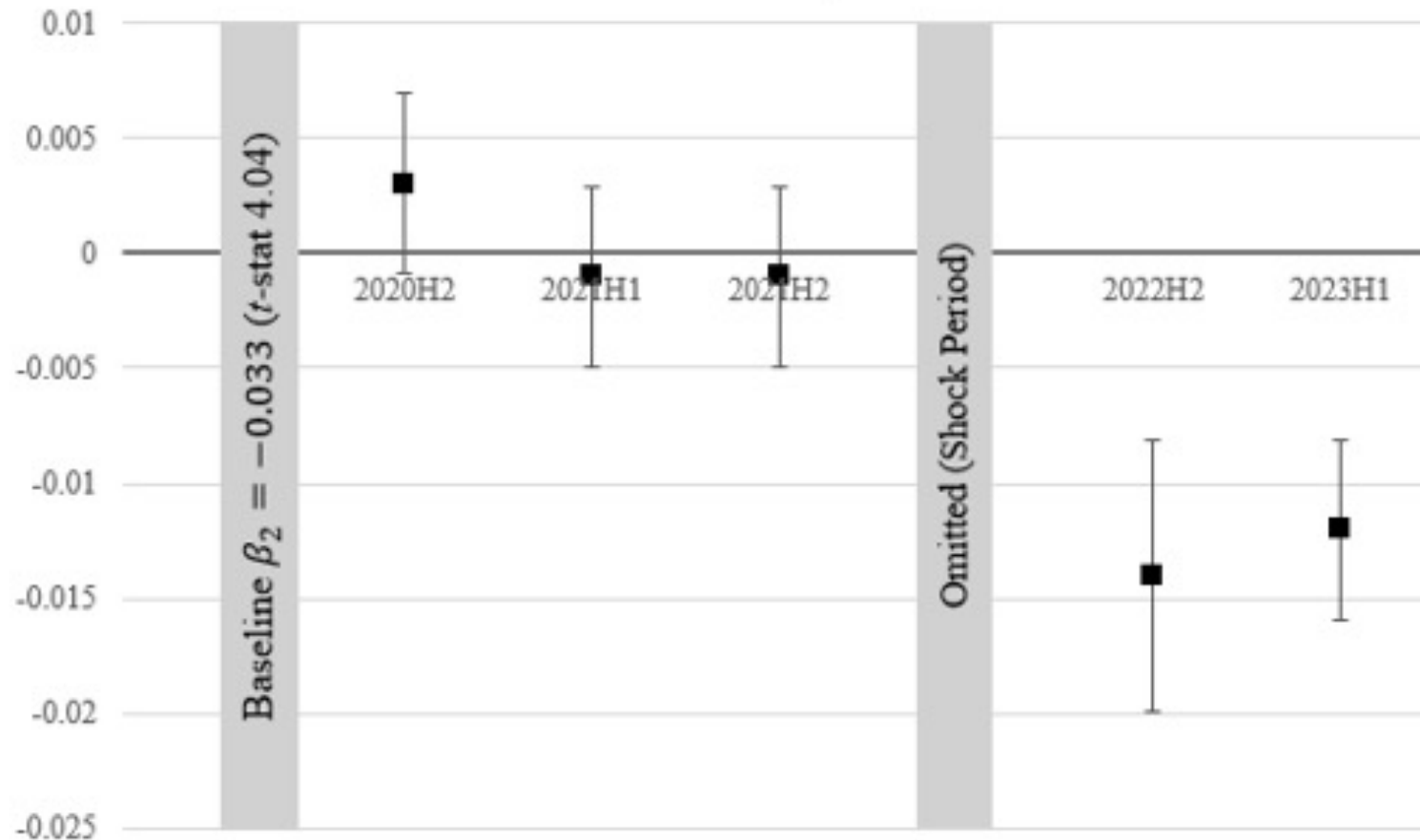


# T7: 2022 POLICY SHIFT

<i>Dependent Variable (ZIP,t+1)</i>	<i>% Delinquency or Default in the Next 6 Months</i>			
	<i>Main Effect</i>	<i>Incremental Effect Post 2022</i>	<i>Main Effect</i>	<i>Incremental Effect Post 2022</i>
<i>2021 - 2023 Subsample</i>				
<b><i>Panel A: Credit Score Analysis</i></b>				
Local Healthcare Costs <sub>(CBSA, t)</sub>	0.248*** (3.40)	0.077*** (4.82)	-	-
Credit Score/100 <sub>(ZIP, t)</sub> × Local Healthcare Costs <sub>(CBSA, t)</sub>	-0.035*** (3.41)	-0.011*** (5.14)	-0.035*** (3.21)	-0.013*** (5.01)
Consumer Financial Controls		Y		Y
Local Economy and Insurance Controls		Y		Y
CBSA FEs		Y		-
Time FEs		Y		-
CBSA × Time FEs		-		Y
Observations		104,018		104,012
R-squared		0.29		0.28
Within R-squared		0.20		0.20

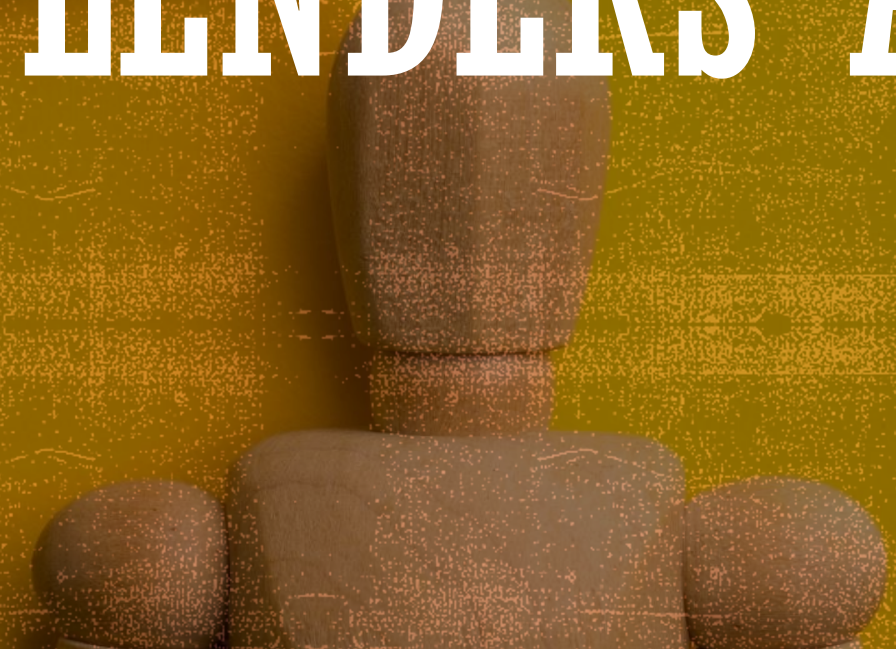
# F6: PARALLEL TRENDS TESTS

Panel A: Credit Score-based Analysis of Defaults



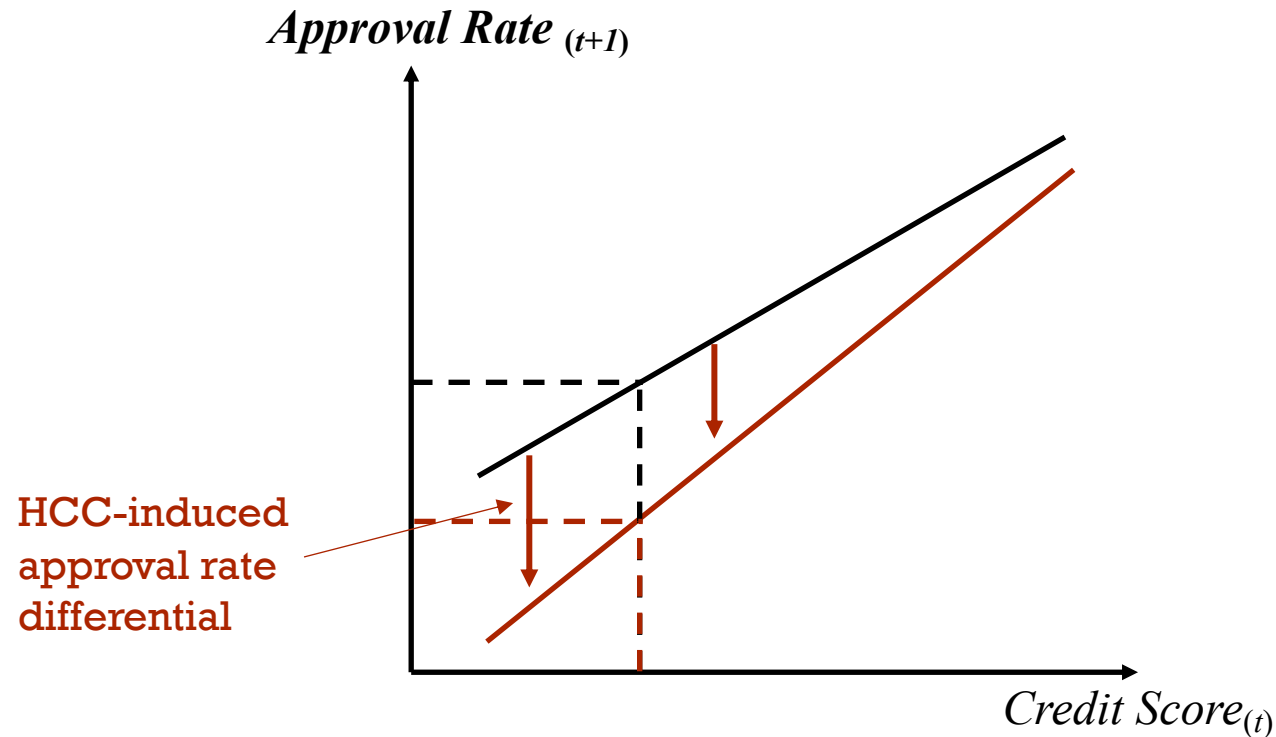


**ARE LENDERS AWARE?**



# EMPIRICAL DESIGN

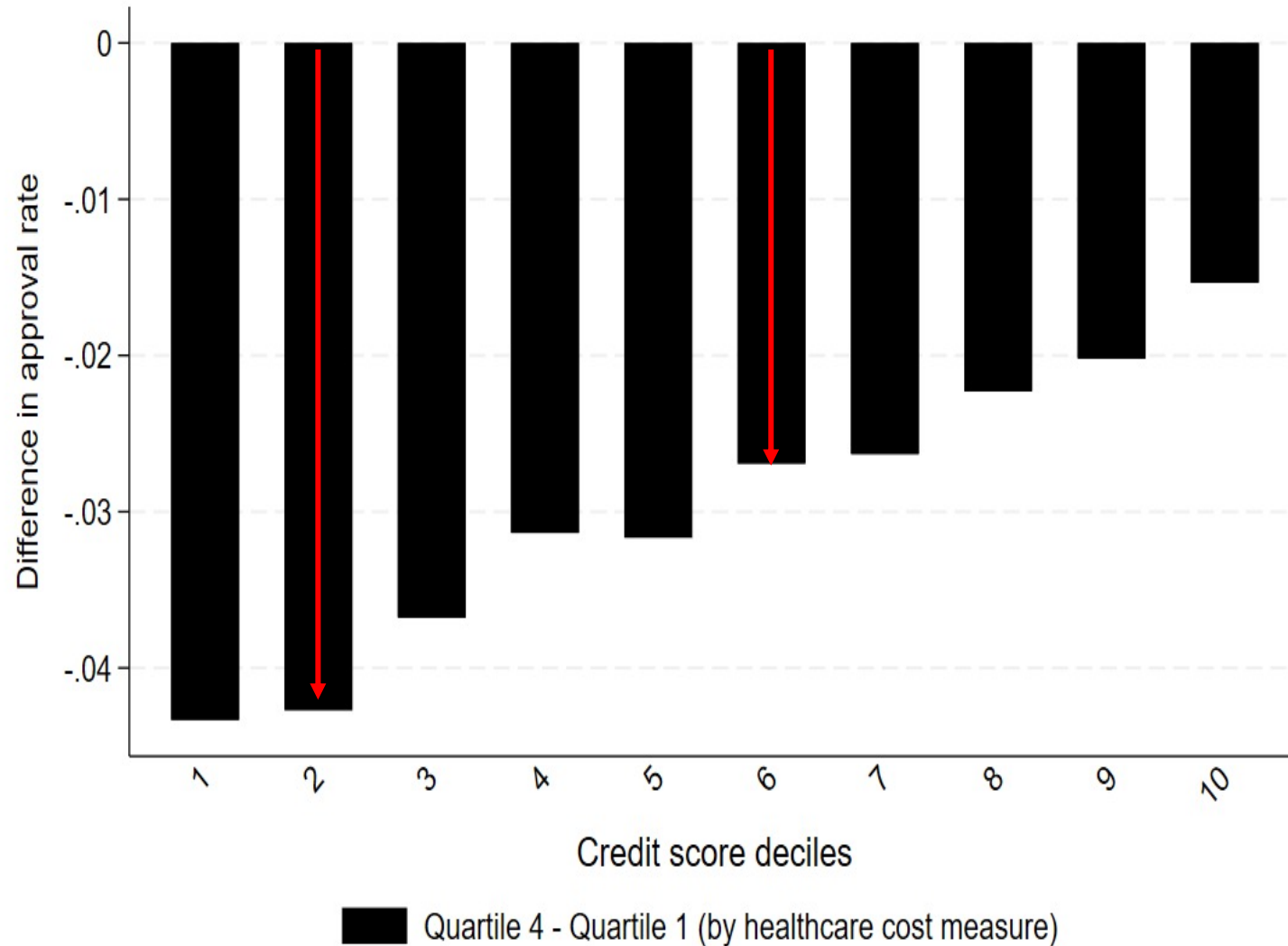
$$\text{Loan Approval Rate}_{ZIP,lender,loan\ type,t+1} = \beta_1 \text{Healthcare Cost}_{l,t} + \beta_2 \text{Credit Score}_{ZIP,t} \times \text{Healthcare Cost}_{CBSA,t} + \text{Lender} \times \text{year} \times \text{loan type FEs} + \text{CONTROLS} + \varepsilon_{ZIP,t}$$



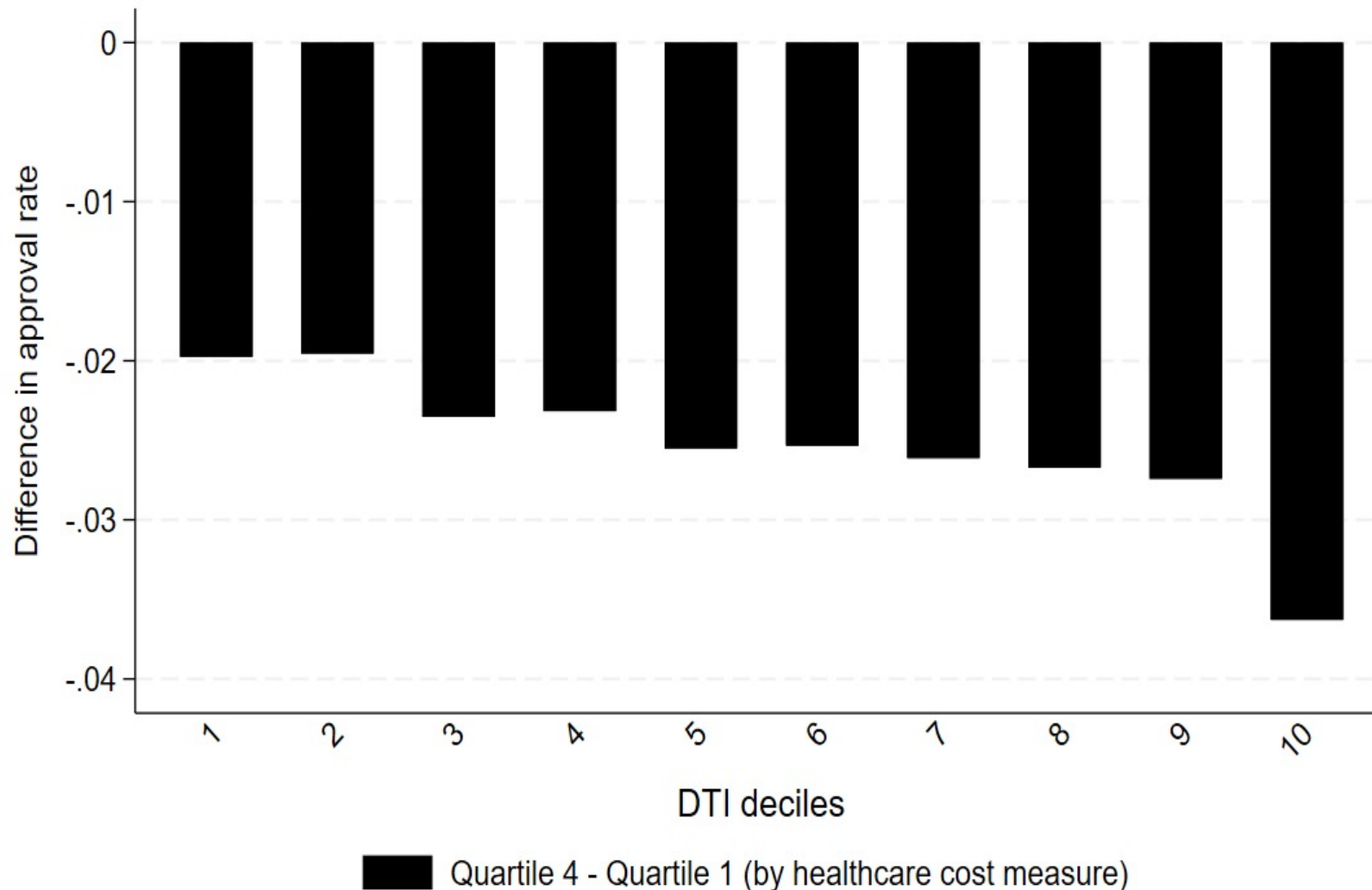
## Predictions:

- $\beta_1 < 0$
- $\beta_2 > 0$

# FIGURE 3: DIFFERENCE IN MORTGAGE APPROVAL RATES BY HEALTHCARE COST AND CREDIT SCORES



# FIGURE 3: DIFFERENCE IN MORTGAGE APPROVAL RATES BY HEALTHCARE COST AND DTIS



# T8: MORTGAGE APPROVAL RATES

	Mortgage Approval Rate (%) <small>(ZIP, year, lender, loan type)</small>			
	(1)	(2)	(3)	(4)
<i>Panel A: Credit Score Analysis</i>				
Local Healthcare Costs <sub>(CBSA, t)</sub>	-	-0.433** (2.55)	-	-
Credit Score/100 <sub>(ZIP, t)</sub> × Local Healthcare Costs <sub>(CBSA, t)</sub>	-	0.061** (2.53)	-	0.063** (2.52)
Credit Score/100 <sub>(ZIP, t)</sub>	0.066*** (36.20)	0.067*** (38.60)	0.066*** (35.81)	0.066*** (38.24)
Other Loan Characteristics	Y	Y	Y	Y
Local Consumer Financials	Y	Y	Y	Y
Local Economy and Insurance Coverage Controls	Y	Y	Y	Y
Lender × Time × Loan Type FEs	Y	Y	Y	Y
CBSA FEs	Y	Y	-	-
CBSA × Time FEs	-	-	Y	Y
Observations	4,236,291	4,236,291	4,236,289	4,236,289
R-squared	0.64	0.64	0.64	0.64
Within R-squared	0.13	0.13	0.13	0.13

*If Credit Score 700:*

High HCC vs low HCC market matters less

*For every 100 point decline in Credit Score:*

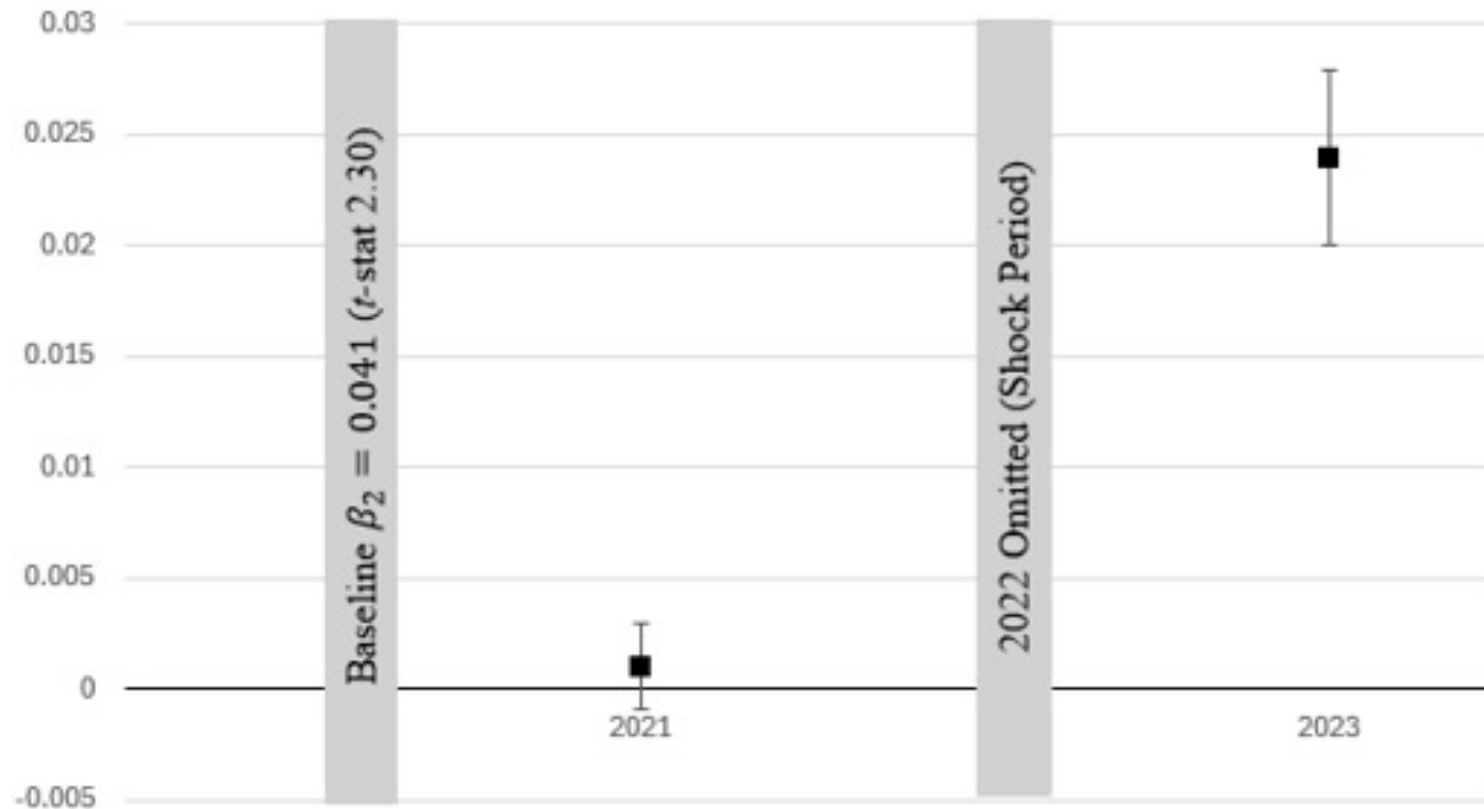
Consumers are 0.67% more likely to be rejected if reside in high HCC vs low HCC market

# T9. LENDERS' REACTION TO 2022 POLICY SHIFT

<i>Mortgage Approval Rate (%) (ZIP, year, lender, loan type)</i>				
<i>2021 - 2023 subsample</i>	<i>Main Effect</i>	<i>Incremental Effect: Post 2022</i>	<i>Main Effect</i>	<i>Incremental Effect: Post 2022</i>
<b>Panel A: Credit Score Analysis</b>				
Local Healthcare Costs <sub>(CBSA, t)</sub>	-0.383** (2.27)	-0.210*** (12.73)	-	-
Credit Score/100 <sub>(ZIP, t)</sub> × Local Healthcare Costs <sub>(CBSA, t)</sub>	0.055** (2.34)	0.026*** (12.17)	0.055** (2.33)	0.028*** (13.33)
Other Loan Characteristics		Y		Y
Local Consumer Financials		Y		Y
Local Economy and Insurance Coverage Controls		Y		Y
Lender × Time × Loan Type FEs		Y		Y
CBSA FEs		Y		-
CBSA × Time FEs		-		Y
Observations		1,449,428		1,449,427
R-squared		0.64		0.64
Within R-squared		0.13		0.13

# PARALLEL TREND TESTS

Panel C: Credit Score-based Analysis of Mortgage Approval Rates



# TO CONCLUDE

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## **Introduce a new HCC measure that captures geographic heterogeneity in healthcare cost**

- Validate this measure using available data on medical debt and collections
  - Assumption: observable medical debt and related collections are not randomly distributed

### **1. Credit scores overestimate the quality of borrowers in high HCC markets:**

- Consumers in high HCC geographies default more conditional on their credit scores
  - More so for low-credit-score borrowers
  - More so for high-DTI borrowers

### **2. Lenders internalize the borrower risk associated with local HCC**

- Mortgage approval rates are lower in high HCC markets, conditional on observables
  - More so for low-credit-score borrowers
  - More so for high-DTI borrowers
  - The evidence is consistent with risk pooling

### **3. Economic channel: information frictions**

- Results are stronger after Q1 2022 regulatory restriction on medical debt collection reporting

**THANK YOU**

