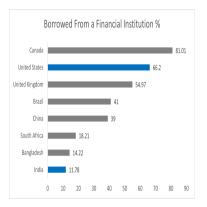
Disentangling the Impact of Financial Inclusion on Households and Firms: The Business Finance Channel

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NBER-ISB, December 2023

#### How does expansion in bank access affect households?

- Increases household consumption, reduces poverty
  - eg. Burgess and Pande, 2005, Bruhn and Love, 2014, Agarwal et al., 2017, Celérier and Matray, 2019, Cramer, 2021, Barboni et al., 2022.
- Household demand channel: households borrow and consume more, increasing household demand.
- Business finance channel: banks ease firm financial constraints.
- But household debt may reduce growth, increase poverty (Mian, et al., 2017, Fulford, 2013).



#### **Research Questions**

- 1. How does a nationwide bank expansion program affect households and firms?
- 2. Is the household demand or business finance channel operative in emerging markets?
- 3. Do banks facilitate urbanization and structural change?

#### **Identification Strategy**

- Use the Reserve Bank of India's nationwide branch expansion policy.
- Policy incentivized banks to set up branches in underbanked districts.
- Regression discontinuity design pioneered by Young (2017), and used by Khanna and Mukherjee (2020) and Cramer (2021).

#### **Preview of results**

- Household consumption expenditures, purchase of durable goods increases.
- Not financed by household borrowing.
- Financial access for households increases household savings and investments rise.
- Effects are skewed to urban households.
- Firms increase borrowing and employment; household wage earnings rise.
- Borrowing concentrated in urban firms in formal, manufacturing, service sectors.

#### **Related literature**

- Bank access increases household consumption, decreases poverty (eg. Burgess and Pande, 2005, Bruhn and Love, 2014, Celerier and Matray, 2019, Cramer, 2021, Barboni et al., 2022).
  - We find that nationwide bank expansion benefits urban not rural households; esp poor and marginalized.
- Bank access increases household borrowing (Burgess and Pande, 2005, Celerier and Matray, 2019, Barboni et al., 2022), reduces informal borrowing (Agarwal et al., 2017), or has no effect (Cramer, 2021).
  - We find consumption loans, interest payments, loans from informal & formal sources, and debt fall.
- Banks ease financial constraints for firms (Bai, et al. 2018, Young, 2017, Dehejia and Gupta, 2022. Fonseca and Matray, 2022, Jiao and Mo, 2023, Kulkarni et al. 2023); hospitals (Cramer, 2021); increases household wages (Burgess and Pande, 2005, Bruhn and Love, 2014, Barboni, et al., 2022).
  - We link effect on firms to households, and wage rise in households to firms.
- Informal entrepreneurship increases (Bruhn and Love, 2014, Barboni et al. 2022); informal micro-entrepreneurship falls (Dehejia and Gupta, 2022).
  - We find formal, urban firms increase borrowing and employment, not informal, rural firms.

# Bank expansion policy and regression discontinuity design

#### Bank Expansion Policy and Regression Discontinuity Design

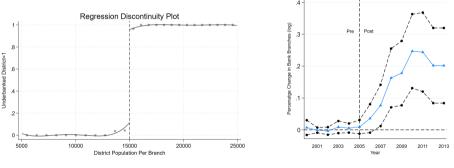
- In 2005, RBI incentivized banks to open branches in under-banked districts.
- Under-banked districts defined as those with a population-to-branch ratio below the national average; which allows for a regression discontinuity (RD) design.
- Young (2017) first used this RD design with ASI and night lights data; Cramer (2021) combines RD with household data, as we also do here.
- Compare districts just above the cutoff to those just below and estimate a fuzzy RD specification (Imbens, 2007):

 $Y_{h,d} = \alpha + \gamma_1 \operatorname{Treated}_d + f(\operatorname{Population} \operatorname{per} \operatorname{Branch} - \operatorname{Cutoff})_d + \epsilon_d$ 

- $Y_{h,d}$  is a banking, household, or enterprise outcome in district d
- Treated<sub>d</sub> is equal to 1 if a district's population-to-branch ratio is greater than the national average
- $f(Population per Branch Cutoff)_d$  is a flexible functional form estimating the fuzzy approach
- $\epsilon_d$  is an idiosyncratic error term clustered at the district level.

## Fuzzy RD design

- Predict under-banked status of 579 of 582 districts in RBI's list of under-banked districts.
- Bank branches increase post-policy.



#### Likelihood of being Under-banked

Bank Branches, Pre and Post Policy

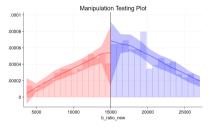
Data sources: RBI Quarterly Branch Statistics, 2006 and Census, 2001.

### **Testing RD Identification Assumption**

Districts just above and just below the cutoff are comparable, except for the treatment.

Check if districts manipulate the ratio to become treated.

- 1. Population data from 2001 census; branches data collected by RBI.
- 2. No evidence of manipulation of district population or bank branch data.
  - McCrary density test
  - Smoothness before the policy for all outcome variables Smoothness Tests
- 3. Heterogeneity analysis (rural-urban populations) does not bias identification. Rural-Urban



#### McCrary Population Density Test

Figure: The t-statistic for the McCrary discontinuity estimate is 0.1483 with a p-value of 0.8821.



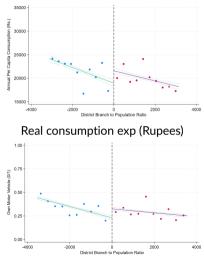
#### Data

- Bank branch data from the Reserve Bank of India.
  - RBI MOF (Cramer)
  - RBI's Quarterly Statistics of Bank Branches, Credit and Deposits
  - RBI Basic Statistical Returns (2005-2015)
- India Human Development Survey (IHDS)
  - Panel data on 40,000 households.
  - Observe consumption expenditures, schooling, use of financial products, employment.
  - Pre Policy-2005, Post Policy-2012.
- Economic Census (EC)
  - Universe of enterprises; observe employment, loans. Pre Policy-2005, Post Policy-2013
- All India Debt and Investment Survey Data (AIDIS)
  - Household survey data on debt and assets; Pre Policy-2003, Post-Policy-2013

Impact of bank expansion on household consumption

#### Bank expansion increases household consumption

- Household per capita real consumption expenditures increase by 13%.
- Likelihood of owning a motor vehicle increases by 9%.

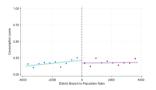


Motor Vehicle Ownership (0/1)

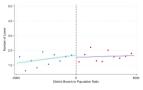
Impact of bank expansion on household borrowing

#### Increase in consumption not financed by household borrowing

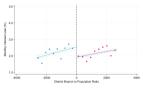
- Likelihood of consumption loans falls by 40%.
- Interest rate falls 47%.
- Number of loans from any source falls.
- No increase in debt.



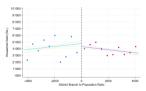
Likelihood of Consumption Loans (0/1)



**Total Number of Loans** 



Monthly Interest Rate (%)



Aggregate Household Debt (Rupees)

### Household access to savings & investments increases

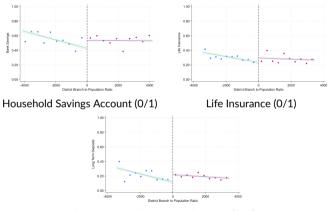
0.0

0.40

0.20

0.00

- Increases household savings by -35%.
- Purchase of life insurance by 17%. -
- Increases long term deposits by -37%.

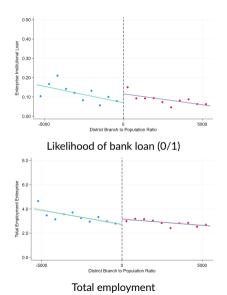


Interest-bearing deposit Account (0/1)

## Impact of bank expansion on firms

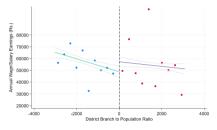
#### Bank expansion increases borrowing and employment in firms

- Increases likelihood that firms borrow from a financial institution by 57%.
- Increases total employment in firms by 25%.

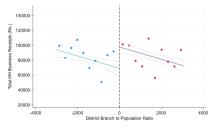


#### Bank expansion increases household wages

- Increases household wage income by 16%.
- Increases business revenues of household-owned enterprises by 61%.



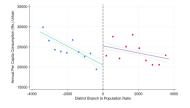
Household Wage Earnings (Rupees)

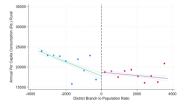


Household-owned Business Revenues (Rupees)

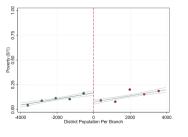
# Heterogeneous impact of bank expansion on households

#### Consumption increases and poverty falls for urban households



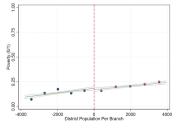


Urban HH Consumption Expenditures (Rs)



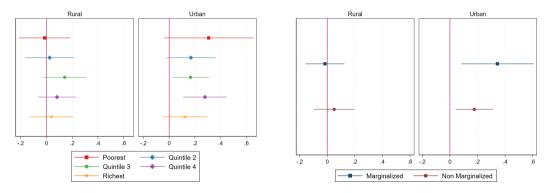
Urban Poverty (0/1)

Rural HH Consumption Expenditures (Rs)



Rural Poverty (0/1)

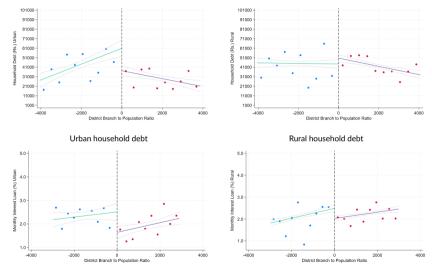
#### Poorest, socially marginalized, urban households benefit



Treatment Effect by Income Quintiles

Treatment Effect by Social Group Marginalization

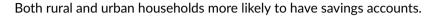
#### Borrowing and debt decreases for urban households

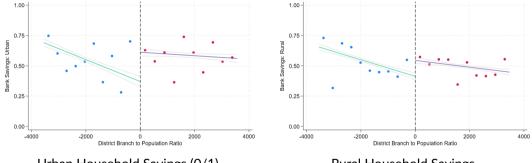


Urban Monthly Interest Rates on Loans(%)

Rural Monthly Interest Rates on Loans(%)

#### Not explained by lack of financial access for rural households



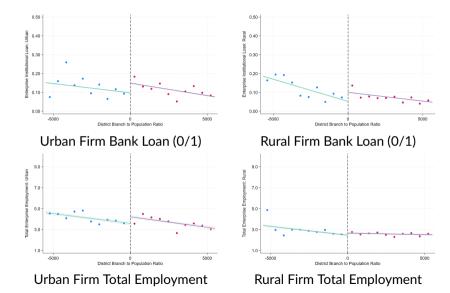


Urban Household Savings (0/1)

**Rural Household Savings** 

# Heterogeneous impact on firms

#### Borrowing and employment increases in urban firms



#### Bank expansion channels capital to formal firms

Increases borrowing by formal, manufacturing, and service sector firms in urban areas.

	(1)	(2)	(3)	(4)	(5)	(6)
	Formal			Informal		
	All	Rural	Urban	All	Rural	Urban
Enterprise Institutional Loans (0/1)						
Treated	0.0414** (0.018)	0.0540** (0.025)	0.0400** (0.019)	0.00878 (0.007)	0.010 (0.006)	0.014** (0.006)
Observations	722,363	329,975	392,388	54,282,267	33,131,949	21,150,318

	Rural			Urban		
	Primary	Secondary	Services	Primary	Secondary	Services
B: Enterprise Institutional Loans						
Treated	0.0133 (0.008)	0.006 (0.010)	0.015* (0.008)	0.008* (0.004)	0.019** (0.007)	0.013* (0.007)
Observations	11,623,782	5,821,063	16,017,079	1,022,318	4,998,381	15,522,007

#### Conclusion

- Using data on both households and firms show that nationwide bank expansion benefits households by easing financial constraints for firms.
- Positive labor market effects reduce household dependence on borrowing to finance consumption.
- Benefits of nationwide bank expansion accrue to urban, not rural households, driven by positive impact on urban labor markets.
- Bank expansion facilitates urbanization, formalization, and structural change.

#### Survey Sub-sample Check

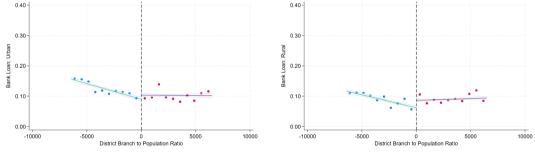
Table: Bank expansion validity with survey sub-samples

**Notes:** Aggregate, rural or urban sub-samples when analyzed separately satisfy the randomization required for the RDD.

	(1)	(2)	(3)
	Full Sample	Rural Sample	Urban Sample
RD Robust Estimate	-0.005 (0.150)	-0.002 (0.183)	0.003 (0.165)
Two stage q values Bandwidth Baseline Controls Observations	0.991 4,339 No 581	0.994 4,126 No 581	0.892 4,798 No 581

#### Financial access in rural versus urban areas

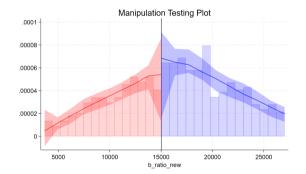
Likelihood of households having a bank loan (AIDIS data) increases for rural households  $\Rightarrow$  results not explained by selective branch expansion into urban areas.



Bank Loan (0/1) for Urban Households

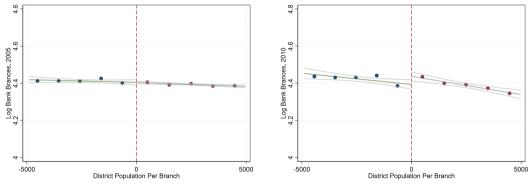
Bank Loan (0/1) for Rural Households

#### McCrary Density Test



The t-statistic for McCrary discontinuity estimate is 0.1483 with a p-value of 0.8821.

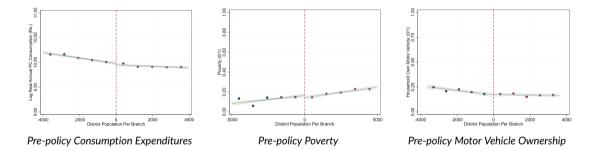
### Pre-policy Smoothness and Post-policy Discontinuity in Bank Branches



Pre-policy Log Bank Branches

Post-policy Log Bank Branches

#### Pre-Policy Smoothness in Household Consumption



Back