# Bank Competition amid Digital Disruption: Implications for Financial Inclusion

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#### Overview

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#### Identification strategy: Exploit expansion of 3G networks

- Instrument with geographic variation in lightning intensity, which affects the cost of expanding 3G infrastructure
- Data: Lots!
  - FDIC Survey of Household Use of Banking and Financial Services

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- 3G coverage at  $1 \times 1 \text{ km}$  grid cells over time
- Frequency of lightning strikes (geocoded and timestamped)
- FDIC bank branch information
- Loan and deposit rates from RateWatch
- Mortgage origination data from HMDA

The paper in one picture



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More entry of fintechs  $\Rightarrow$  lower fintech markups

## The paper in one picture



#### More entry of fintechs $\Rightarrow$ lower fintech markups

Remaining traditional bank customers are stickier and some bank branches close  $\Rightarrow$  higher traditional bank markups

#### • Exploit expansion of 3G over time



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- Map of above/below-median within-state population-weighted lightning:



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"Lightning strikes may concentrate in certain areas (e.g., southeastern states) whose common characteristics can generate spurious correlations between lightning, 3G coverage, and bank decisions."

• "To mitigate this concern, we we define high lightning frequencies *within a state*"

But couldn't the same geographic issues create endogeneity within state?

- e.g., the southern counties in states differ from remainder of state (NYC, Miami)
- In some other states the big cities are in the West, but this doesn't necessarily "balance out"

**My suggestions**: Show us what is correlated with lightning strikes before and after including state fixed effects

- Table IA.5 tests for balance, but only for 4 variables
- Show it for both <u>levels</u> and <u>changes</u> (pre-3G expansion) for as many variables as you can get data on at the county level

	log(CountyGDP) (1)	log(TotalPop) (2)	Unemployment Rate (3)	Share of Pop Under 40 (4)
$\mathbbm{1}(\text{High Lightning}) \times Year$	-0.001	0.0004	0.013	-0.00002
	(-1.012)	(1.533)	(0.986)	(-0.305)
County FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
$State \times Year FE$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Observations	33,586	34,070	34,081	34,070
Adjusted R <sup>2</sup>	0.993	1.000	0.915	0.984

And to better understand instrument, what is High Lightning<sub>c</sub> correlated with (without interacting with *Year* and without including county FE)?

First stage:

3G Coverage<sub>c,t</sub> = $\beta_1$ High Lightning<sub>c</sub> ×  $t + \beta_2$ High Lightning<sub>c</sub> ×  $t^2$ 

 $+\gamma X_{c,t} + \mu_c + \nu_{s,t} + \epsilon_{c,t}.$ 

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Why does this paper interact with quadratic time trend? Should show results with linear as that is standard in this literature

 And better justify quadratic based on empirical relationships in the data if that is your preferred specification

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- Lower loan rates, especially by "less branch-reliant" banks
- Lower mortgage rates for younger borrowers; higher for older borrowers

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Table 7 shows some but only restricting to poor consumers (want to see overall first)

	OLS			2SLS			
	(1)	(2)	(3)	(4)	(5)	(6)	
	Log(1+Branch)	I(Branch)	Branch Exit	Log(1+Branch)	I(Branch)	Branch Exit	
3G Coverage	-0.013***	-1.378 * * *	$1.701^{***}$	-0.386**	-32.035**	$15.094^{*}$	
_	(-4.304)	(-5.468)	(8.565)	(-2.171)	(-2.127)	(1.735)	
Adjusted $R^2$	0.894	0.843	0.931	-	-	-	
Observations	458976	459000	262356	458976	459000	262356	
County Controls	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Bank-County FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Bank-State-Year FE	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Cragg-Donald Wald F-stat	S			141.209	141.240	85.025	

What is the distribution of 3G Coverage<sub>ct</sub>?

 The reported effects are the effects of going from 3G Coverage<sub>ct</sub> = 0 (no 3G) to 1 (full 3G), so aren't these magnitudes very small?

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County Controls	408970	439000	202330	408976	439000	202330	
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- Couldn't this be a violation of the exclusion restriction?
- Couldn't large magnitude be due to 3G Coverage<sub>ct</sub> having much lower variance than 3G Coverage<sub>ct</sub> after being residualized in first stage?

Unclear how to interpret effect of going from 3G Coverage<sub>ct</sub> = 0 to 1

## Comments on reduced form results: heterogeneity

Measure "less branch-reliant" based on number of branches divided by number of deposits

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"We classify non-branch reliant banks as those with the lowest quartile branch-reliant index and branch-reliant banks as the rest"

Should first show above/below-median for transparency (as it's more standard)

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Banks

- Two types: traditional and "fintech"
  - Differ in marginal costs of deposit/loan/branch opening, digital service quality, cost of entry
- Make the following decisions:
  - Entry
  - Branch opening/closing
  - Pricing of deposits, loans

## Comments on structural model

What is the outside option? (Inconsistent description)

- "The outside option is being unbanked" (seems to apply to both deposits and loans in the main description of the model)
- "We treat shadow banks as the outside option in the loan market" (estimation section)

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What is the outside option? (Inconsistent description)

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- "We treat shadow banks as the outside option in the loan market" (estimation section)

But if outside option is another loan, price of outside option is not 0 and  $r_j$  would need to be replaced with  $(r_j - r_0)$  in the estimating equation:

$$log(s_{ij}) - log(s_{i0}) = -\frac{\alpha_i}{\lambda_t}r_j + \frac{\beta_i}{\lambda_t}b_j + \frac{\gamma_i}{\lambda_t}d_j + \frac{\xi_j}{\lambda_t} + (\lambda_t - 1)log(Z_{i,t}).$$

#### Conclusion

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Nice combination of reduced form empirics and structural model to answer the research question