# HAVE BANKS CAUGHT CORONA? EFFECTS OF COVID-19 ON LENDING IN THE US

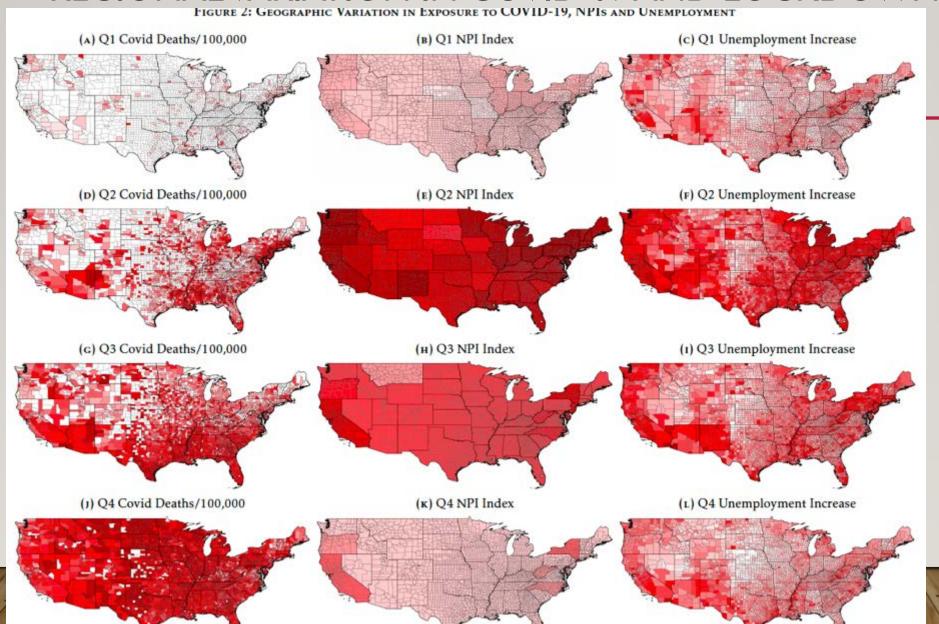
THORSTEN BECK AND JAN KEIL



#### MOTIVATION

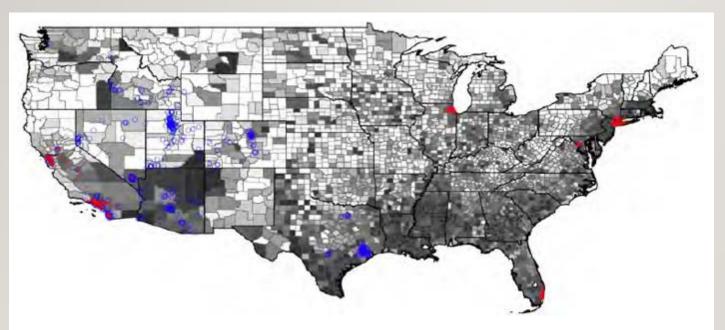
- What has been the effect of pandemic and lockdowns on bank health and lending?
- Theory and previous crises provide contrasting hypotheses and evidence on the effect of economic shocks on bank lending
  - Lending retrenchment due to dropping collateral values and increasing agency conflicts (Gertler and Bernanke, 1989) or bank losses and inability of banks to raise new capital
  - During early months of GFC: increase in C&I loans on banks' balance sheet, due to drawdown
    of credit lines
  - Clearer theory and evidence on loan conditionality: tightening)
- Already vast literature on Covid-19 and banking; **this paper**: how does exposure to pandemic and lock-downs affect banks' behaviour
- Role of government support programmes; specifically, PPP

### REGIONAL VARIATION IN COVID-19 AND LOCKDOWN POLICIES



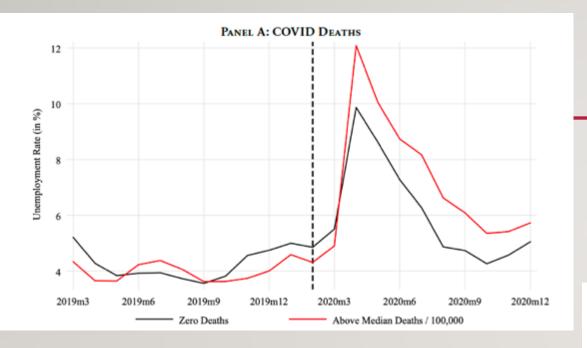
### BANKS HAVE BEEN EXPOSED DIFFERENTLY TO THE CRISIS

 Measure of bank exposure to COVID-19 and lockdown policies: use 2019 branch deposit shares in total deposits as weights for each county

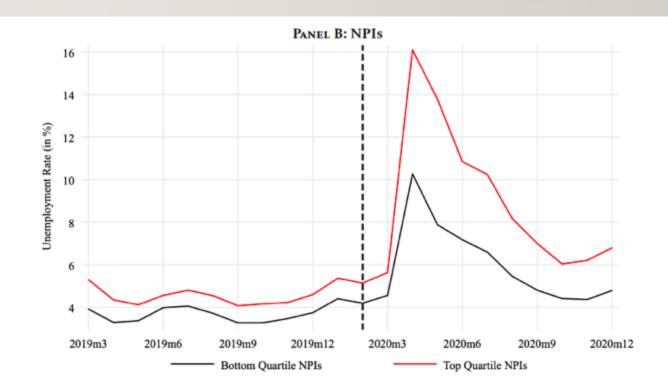


Red dots (blue circles) represent June 2019 Citibank (Zions Bancorp) branches. Citibank (Zions) is an example for a commercial bank with a relatively high (low) geographical exposure to COVID deaths. Coloring of contiguous U.S. counties follows a heat map scheme, corresponding to the number of cumulative Q3 2020 COVID-19 related deaths per 100,000 inhabitants. The darker the gray, the higher the death rate.

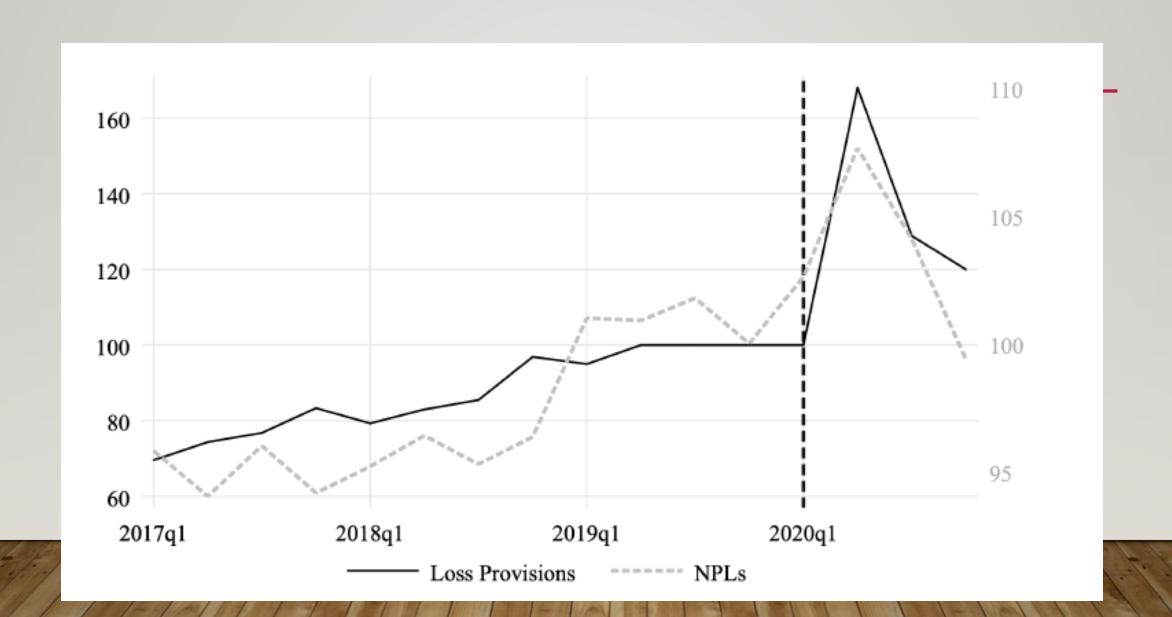
## COVID-19, LOCKDOWNS AND UNEMPLOYMENT



Both spread of COVID-19 and lockdown policies explain variation in unemployment



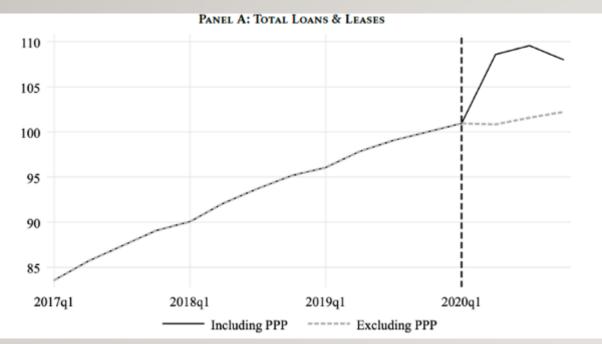
## COVID-19, LOCKDOWNS AND BANK HEALTH

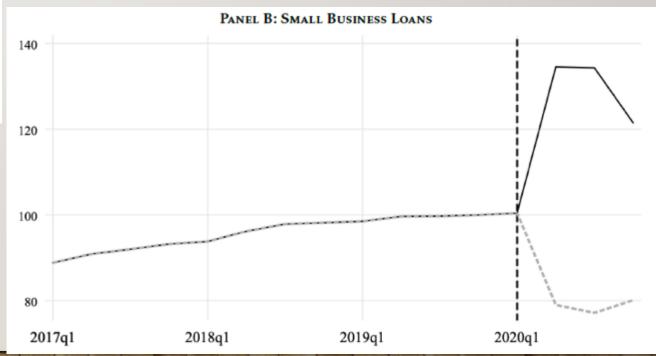


## BANK HEALTH AND THE COVID SHOCK

		Loss Pro	ovisions			Non-Perf	orming Loan	s
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Year-Quarter FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Bank Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Q1 2020 FE	39.957***	38.927***	31.383***	31.119***	3.246**	3.115**	-2.178	-2.161
	(0.000)	(0.000)	(0.000)	(0.000)	(0.017)	(0.025)	(0.213)	(0.217)
Q2 2020 FE	66.470***	58.036***	-1.266	-3.561	3.341*	2.259	-39.200***	-39.045***
	(0.000)	(0.000)	(0.922)	(0.783)	(0.052)	(0.366)	(0.000)	(0.000)
Q3 2020 FE	39.380***	29.685***	3.008	-1.925	-4.055**	-5.308*	-26.836***	-26.465***
	(0.000)	(0.000)	(0.687)	(0.802)	(0.041)	(0.063)	(0.000)	(0.000)
Q4 2020 FE	25.954***	11.747*	14.202***	4.677	-7.589***	-9.464**	-14.897***	-14.148***
	(0.000)	(0.060)	(0.002)	(0.458)	(0.001)	(0.011)	(0.000)	(0.000)
Covid Deaths	,	3.572***	, ,	2.558**	, ,	0.469	,	-0.200
		(0.002)		(0.034)		(0.524)		(0.789)
NPIs			20.654***	19.512***		. ,	13.011***	13.105***
			(0.000)	(0.000)			(0.000)	(0.000)
Adj. R <sup>2</sup>	0.03	0.03	0.03	0.03	0.05	0.05	0.05	0.05
Observations	61,606	61,606	61,606	61,606	73,103	73,103	73,103	73,103
Banks	,4.613,	4.613	4.613	~ 4.613 p	. 4.787	4.787	.4.787	. 4.787

## COVID-19, LOCKDOWNS AND BANK LENDING





## BANK LENDING AND THE COVID SHOCK

		Including	PPP Loans			Excluding	PPP Loans	
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Year-Quarter FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Bank Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
			Panel A: T	otal Loans and	d Leases			
Q1 2020 FE	-0.403***	-0.429***	-0.944***	-0.946***	-0.295***	-0.280***	-0.330***	-0.325***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.003)	(0.003)
Q2 2020 FE	0.271*	0.056	-3.975***	-3.997***	-6.294***	-6.174***	-6.572***	-6.528***
	(0.096)	(0.796)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Q3 2020 FE	-0.433**	-0.683***	-2.714***	-2.766***	-6.910***	-6.771***	-7.060***	-6.953***
	(0.020)	(0.005)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Q4 2020 FE	-4.828***	-5.202***	-5.561***	-5.665***	-8.808***	-8.601***	-8.856***	-8.642***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Covid Deaths		0.094		0.028		-0.052		-0.058
		(0.128)		(0.662)		(0.347)		(0.310)
NPIs		,	1.302***	1.289***			0.085	0.113
			(0.000)	(0.000)			(0.677)	(0.592)
Adj. R²	0.65	0.65	0.66	0.66	0.64	0.64	0.64	0.64
Observations	77,009	77,009	77,009	77,009	77,009	77,009	77,009	77,009
Banks	4,824	4,824	4,824	4,824	4,824	4,824	4,824	4,824

## BANK LENDING AND THE COVID SHOCK (2)

			Panel B: S	Small Busines	s Loans			
Q1 2020 FE	-1.898***	-2.155***	-4.767***	-4.800***	3.093***	3.491***	5.329***	5.434***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Q2 2020 FE	11.573***	9.890***	-11.120***	-11.264***	-20.007***	-17.405***	-2.315	-1.863
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.487)	(0.573)
Q3 2020 FE	14.208***	12.231***	1.757	1.324	-29.057***	-26.001***	-19.350***	-17.987***
	(0.000)	(0.000)	(0.160)	(0.286)	(0.000)	(0.000)	(0.000)	(0.000)
Q4 2020 FE	1.543***	-1.358	-2.372***	-3.277***	-20.116***	-15.633***	-17.064***	-14.222***
	(0.003)	(0.114)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Covid Deaths		0.728***		0.245		-1.126***		-0.771***
		(0.000)		(0.186)		(0.000)		(0.002)
NPIs			6.950***	6.820***			-5.418***	-5.011***
			(0.000)	(0.000)			(0.000)	(0.000)
Adj. R <sup>2</sup>	0.35	0.35	0.35	0.35	0.30	0.30	0.30	0.30
Observations	48,858	48,858	48,858	48,858	48,859	48,859	48,859	48,859
TBanks 1	4.684	4.684	4684017	A.684	4.684	11 4.684	.4:684 1	4.684

## BANK LENDING AND THE COVID SHOCK (3)

		C&I l	Loans		Househo	ld Loans		
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Year-Quarter FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Bank Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Q1 2020 FE	-0.032	-0.035	0.045	0.044	0.011	0.020	0.074	0.076
	(0.838)	(0.830)	(0.866)	(0.870)	(0.931)	(0.879)	(0.716)	(0.708)
Q2 2020 FE	15.548***	15.525***	16.156***	16.140***	-0.679***	-0.606**	-0.185	-0.166
	(0.000)	(0.000)	(0.000)	(0.000)	(0.001)	(0.041)	(0.884)	(0.895)
Q3 2020 FE	15.474***	15.448***	15.801***	15.764***	-0.807***	-0.724**	-0.542	-0.498
	(0.000)	(0.000)	(0.000)	(0.000)	(0.002)	(0.044)	(0.443)	(0.487)
Q4 2020 FE	9.642***	9.603***	9.747***	9.673***	-1.022***	-0.897*	-0.937***	-0.847*
	(0.000)	(0.000)	(0.000)	(0.000)	(0.001)	(0.064)	(0.009)	(0.091)
Covid Deaths		0.010		0.020		-0.031		-0.024
		(0.945)		(0.892)		(0.754)		(0.812)
NPIs			-0.186	-0.196			-0.151	-0.140
			(0.723)	(0.716)			(0.692)	(0.719)
Adj. R <sup>2</sup>	0.40	0.40	0.40	0.40	0.37	0.37	0.37	0.37
Observations	77,279	77,279	77,279	77,279	77,565	77,565	77,565	77,565

TBanks, 4,835, 4,835, 4,835, 4,835, 4,848, 4

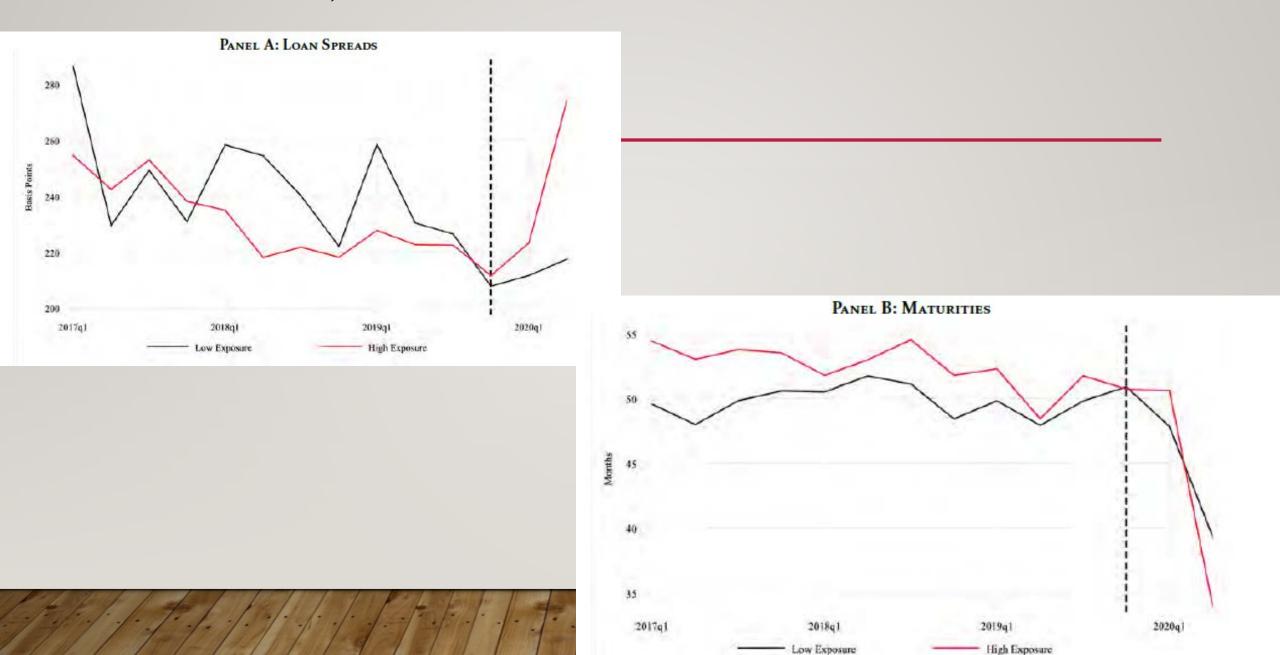
## PPP LOANS - DEMAND VS. SUPPLY

		(1)	(2)	(3)	(4)	(5)	(6)	
	County Covid Deaths	-0.024		-0.021		-0.019		
	-	(0.221)		(0.244)		(0.328)		
	Bank Covid Deaths	-0.003	0.039			-0.014	0.025	
		(0.975)	(0.661)			(0.865)	(0.773)	
	County NPIs	0.340***		0.201***		0.200***		
		(0.000)		(0.000)		(0.000)		
ı	Bank NPIs			0.432**	0.392**	0.433**	0.390**	
ı				(0.011)	(0.029)	(0.011)	(0.029)	
	County FE		Yes		Yes		Yes	
	County Controls	Yes	_	Yes	_	Yes	_	
	Bank Controls	Yes	Yes	Yes	Yes	Yes	Yes	
	Bank-County Controls	Yes	Yes	Yes	Yes	Yes	Yes	
	Adj. R <sup>2</sup>	0.16	0.22	0.17	0.22	0.17	0.22	
3	Observations	30,387	33,997	30,387	33,997	30,387	33,997	
	Banks	483	483	483	483	483	483	1

## SYNDICATED LOANS

		Number of Loans				Average L	oan Volum	e
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Covid Deaths		-0.060***		-0.176*		-0.050*		0.117
		(0.009)		(0.093)		(0.076)		(0.132)
NPIs			-0.050*	0.124			-0.074**	-0.185**
			(0.062)	(0.281)			(0.019)	(0.032)
Q1 2020 FE	-0.105				-0.042			
	(0.285)				(0.699)			
Q2 2020 FE	-0.216**				-0.291**			
	(0.016)				(0.017)			
Year-Quarter FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Bank Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Adj. R <sup>2</sup>	0.94	0.94	0.94	0.94	0.68	0.68	0.68	0.68
Observations	713	713	713	713	1,284	1,284	1,284	1,284
Banks	51	51	51	51	162	162	162	162

## COVID-19, LOCKDOWNS AND LOAN CONDITIONALITY



## INTEREST RATES AND COVID SHOCK

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	
Year-Quarter FE	Yes	Yes	_	_	_	_	_	_	
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	
Loan Type FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	
Industry * State FE	Yes	_	Yes	_	Yes	_	Yes	_	
Industry * Quarter FE			Yes	_	Yes	_	Yes	_	
Borrower FE		Yes		_		_		_	
Borrower * Quarter FE				Yes		Yes		Yes	
Loan Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	
Bank Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	
Q1 2020 FE	-1.344	3.004							
	(0.864)	(0.688)							
Q2 2020 FE	43.685***	65.066***							
	(0.000)	(0.000)							
Covid Deaths			29.451**	176.334			30.443**	199.874	П
			(0.037)	(0.296)			(0.031)	(0.194)	
NPIs					-0.471	166.812	-9.325	224.939**	
					(0.979)	(0.120)	(0.571)	(0.020)	
Adj. R <sup>2</sup>	0.45	0.74	0.47	0.77	0.47	0.77	0.47	0.77	
Observations	10,941	9,452	10,819	6,544	10,819	6,544	10,819	6,544	
Borrowers	4,711	2,953	4,663	2,164	4,663	2,164	4,663	2,164	

Banks 32 30 32 29 32 29 32 29
This table contains syndicated loan level regressions from O1 2017 to O2 2020. The dependent variable is the interest spread over

## MATURITIES AND COVID-SHOCK

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	
Year-Quarter FE	Yes	Yes	_	_	_	_	_	_	
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	
Loan Type FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	
Industry * State FE	Yes	_	Yes	_	Yes	_	Yes	_	
Industry * Quarter FE			Yes	_	Yes	_	Yes	_	
Borrower FE		Yes		_		_		_	
Borrower * Quarter FE				Yes		Yes		Yes	
Loan Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	
Bank Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	
Q1 2020 FE	-0.101**	-0.130							
Q2 2020 FE	(0.020) -0.570*** (0.000)	(0.108) -0.527*** (0.000)							
Covid Deaths	,	. ,	0.096	0.354			0.080	0.265	
			(0.248)	(0.513)			(0.378)	(0.583)	
NPIs					0.170	-1.292	0.146	-1.203*	
					(0.222)	(0.116)	(0.284)	(0.085)	
Adj. R <sup>2</sup>	0.28	0.58	0.30	0.66	0.30	0.66	0.30	0.66	
Observations	10,800	9,273	10,678	6,387	10,678	6,387	10,678	6,387	
Borrowers	4,674	2,910	4,625	2,121	4,625	2,121	4,625	2,121	
Banks	31	29	31 From O1 201	7 to 02 202	31	28	31	28	

#### SUMMARY

Banks geographically more exposed to the pandemic and lockdown policies show

- an increase in loan loss provisions and non-performing loans
- an increase in lending to small businesses, but not in other lending categories,
- an increase in interest spreads and decrease in loan maturities

Government-guaranteed loans replaced regular loans for small businesses

More exposed banks more likely to substitute PPP loans for regular loans

Important: results for US, but might provide insight for other advanced countries

## THANK YOU

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