## Motivating Banks to Lend? Credit Spillover Effects of the Main Street Lending Program

Camelia Minoiu<sup>1</sup>

Rebecca Zarutskie<sup>2</sup>

Andrei Zlate<sup>2</sup>

<sup>1</sup>Federal Reserve Bank of Atlanta <sup>2</sup>Federal Reserve Board of Governors

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The views and conclusions are those of the authors and do not necessarily indicate concurrence by the Federal Reserve System or its staff.

#### Why the Main Street Lending Program?

- Historic emergency lending program aimed at supporting the flow of bank credit to small and medium sized firms affected by the Covid-19 pandemic
- Our opportunity to study the effects of government interventions in the private loan market due to several key features:
  - reliance on banks to screen and originate loans
  - > 95% of eligible loans are removed from banks' balance sheets
  - different from grant-making programs (PPP), funding-for-lending programs (Bank of England, European Central Bank), government loan guarantee programs
- Sey function of backstop to the bank loan market; take-up is not necessarily a gauge for success

#### **This Paper**

The program was intended as a backstop: – "the facility might be used relatively little and mainly serve as a backstop, assuring lenders that they will have access to funding and giving them the confidence to make loans to households and businesses." (J. Powell, June 30 2020)

**Take-up is not necessarily a gauge for success**: – "In assessing the value of the Fed's liquidity facility, it's important not to assess it on how much it's used but assess it on how much it reassures people and changes the perception of risk." (W. Dudley, 2020)

Our questions: How did the MSLP affect the flow of credit through participating banks? Did it support the flow of credit more generally? Through what channels?

### **Questions and Results**

#### Questions:

- What effects did the MSLP have on the flow of credit to the real economy?
- 2 Through what channels?

#### **Results:**

- The MSLP encouraged banks to lend beyond the program on the extensive and intensive margins of lending
  - More likely to grant new business loans
  - Provided relatively better terms: larger loans, lower spreads
- Operated through two non-exclusive channels: (1) changing risk perceptions (improving risk tolerance) and (2) easing of bank balance sheet constraints

#### **Contribution to Literature**

Closely related to literature on central banks' emergency lending programs and unconventional monetary policies during pandemic:

- Bank lending during the Covid-19 crisis Berger and Demirguc-Kunt 2021 Contribution: Deepen our understanding of bank lending decisions in the face of uncertainty shocks and the role of risk perceptions
- Effectiveness of bank-intermediated credit support programs during Covid-19 crisis Autor et al 2022; Berger et al 2021a,b; Duchin and Hackney 2021; Granja et al 2021; Bartik et al 2020 Contribution: Study historic lending program, different from funding for lending, government loan guarantee, and grant-making programs, with low takeup.
- Effects of emergency lending facilities ("The Fed takes credit risk") on market functioning. Gilchrist Wei Yue Zakrajsek 2020; Kargar et al 2021. Contribution: Existing evidence is on corporate and municipal bond markets, we analyze the private bank loan market.
- The effects of Fed communications on investor risk attitudes and the role of Fed facilities as backstop Cox Greenwald and Ludvigson 2020; Vissing-Jorgensen 2020. *Contribution: Focus on banks*.

# The Main Street Lending Program

#### The Main Street Lending Program

- <u>Goal</u>: Facilitate the granting of loans to small and mid-sized firms during the Covid-19 crisis ("bridge loans")
- Target: Firms too large to quality for PPP loans but too small to tap the corporate bond and syndicated loan markets (max firm size: 15k workers, revenues <\$5 bn).</li>
   Loan spread 300bps over LIBOR, 5-year maturity, max firm leverage 6xEBITDA
- Key Feature: Fed's SPV purchased 95% of the participation to MSLP eligible borrowers from banks, which retain 5% ("skin in the game") Low Takeup

• MSLP opened up for registration from banks on June 15 2020; started accepting loans on July 6 2020; expired on December 31 2020.

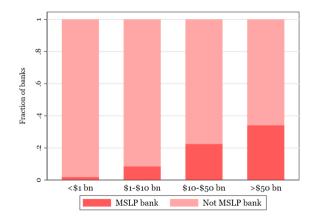
Our post-MSLP period:  $\rightarrow$  2020:Q3 vs. pre-MSLP: 2020:Q1-2020:Q2

### Key Identification Issues

- Diff in diff approach
  - Treatment: MSLP lending bank ("MSLP bank")
  - Pre-MSLP: 2020:Q1-2020:Q2 vs. post-MSLP: 2020:Q3
- Key issue: MSLP participation is a decision variable, likely correlated with bank characteristics and credit demand.
  - Control for key bank characteristics (pre/post)
  - Show "treatment" uncorrelated with demand proxies
  - ► Control for credit demand shifts with firm×quarter and bank×firm FE in the microdata
- Solutions:
  - Instrumental variables
  - Battery of falsification tests

#### Bank Participation in the MSLP

MSLP participation was more prevalent among larger banks.



The figure shows the fraction of MSLP participating banks in the Call Report by size category. Source: Federal Reserve Main Street Reports to Congress Pursuant to Section 13(3) of the Federal Reserve Act in response to COVID-19 and Call Report.

#### Credit Spillovers of the MSLP

#### Selection by Bank Characteristics into MSLP Participation

Dependent variable:	(1)	(2)	(3) 1: MS	(4) SLP bank	(5)	(6)
Size (log-assets)	0.012					0.016
Loans/Assets	(0.042)	1.073***				(0.093) 1.180***
C&I Loans/Loans		(0.293)	1.331*			(0.404) -0.366
CET1 ratio			(0.689)	-0.736**		(1.045) -0.648
Core Deposits/Liabilities				(0.283)	-0.515 (0.616)	(0.856) -1.257*** (0.435)
Observations R <sup>2</sup>	30 0.002	30 0.194	30 0.090	30 0.047	30 0.030	30 0.305

MSLP banks were traditional lenders, provided more business loans, had lower capital ratios.

This table shows OLS (linear probability model) estimates for a regression of MSLP participation dummy ("MLSP bank") on bank characteristics measured at end-2020:Q2. Standard errors are robust. Significance: \*\*\* 1%, \*\*5%, \*10%.

## Selection by Local Demand Conditions into MSLP Participation

MSLP participation is uncorrelated with measures of local demand conditions during the pandemic.

Dependent variable:	(1)	(2)	(3) 1: MSL	(4) P bank.	(5)	(6)
COVID cases (Mar 1-Dec 15) [1] COVID cases (Mar 1-Dec 15) [2] Change in unemployment rate % Small firms unmet demand through PPP % Small firms experienced revenue drop	-0.0257 (0.046)	-0.0038 (0.008)	0.0788 (0.128)	0.0717 (0.057)	0.0425 (0.029)	0.1165 (0.096) -0.0002 (0.015) -0.1622 (0.207) 0.1263 (0.086) 0.0899* (0.048)
Observations <i>R</i> <sup>2</sup> Bank controls	30 0.423 Y	30 0.423 Y	30 0.430 Y	30 0.454 Y	30 0.456 Y	30 0.516 Y

This table shows OLS (linear probability model) estimates for a regression of MSLP participation dummy ("MLSP bank") on measures of local conditions facing each bank. These measures refer to Covid-19 pandemic intensity (the cumulative case infections at the county or state level during Mar 1-Dec 15 2020), the change in the unemployment rate at the state level during Jan-Nov 2020), and small business credit demand and revenue shock (the share of small firms experiencing a revenue drop). These variables are computed at the bank level by weighting them across locations (state [2] or county [1] for Covid cases) by banks' deposits shares in those locations, measured in June 2019. Standard errors are robust. Significance: \*\*\* 1%, \*\*5%, \*10%.

#### Instrumentation Strategy

- Goal: Address the nonrandom selection into program participation ("treatment")
- <u>Two instruments</u>: Strong predictors of participation but orthogonal on lending decisions.
  - Exploit the idea of familiarity with Fed facilities and operational processes
  - Need variables that capture banks' preexisting engagement and communications with the Fed regarding the eligibility, riskiness and custody of collateral
  - Two dummies for banks that are ready to borrow from the discount window pledged loans or securities as collateral at the Federal Reserve's discount window during December 1-31, 2019 – interacted with Post (Anbil, Carlson, and Styczynski, 2020)

IV Relevance

#### **Instrument Relevance**

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The Instrumental Variables are strongly correlated with the treatment variable in our main regression samples

	Y14-Q sample	Dealscan sample
Pledged loan collateral	0.0679***	0.0276**
Pledged securities collateral	-0.5562***	-0.3984*

This table reports the simple correlation coefficient between the instrumental variables and MSLP participation dummy in the 2SLS regression samples. The variables "Pledged loan collateral" and "Pledged securities collateral" take value one for those banks that had loan or securities collateral pledged to the Federal Reserve's discount window during December 1-31, 2019 and zero otherwise. Significance: \*\*\* 1%, \*\*5%, \*10%.

#### The Data

- "U.S. credit register"
- Loan-level data for large business loans (Y-14Q, H.1), large BHCs
- Syndicated loan data from Dealscan
- Data on program participation
  - Public loan-level disclosures in the Federal Reserve Board's periodic report to Congress, available on the Federal Reserve Main Street webpage.
  - Provides the list of MSLP loan-granting banks over time along with banks' RSSD ID and their MSLP loan characteristics.
- Bank balance sheet data from the Call Report
- Regional data on pandemic intensity, labor market conditions, small business conditions.

# **Credit Spillovers: Main Results**

### **Empirical Approach**

Examine the effect of MLSP participation on loan outcomes in a diff-in-diff framework. Unit is the bank-firm-quarter:

 $\begin{aligned} \text{Loan outcome}_{ijt} &= \alpha + \beta \textit{MSLP}_i \textit{ bank } \times \textit{Post}_t + \gamma' \textit{Bank characteristics}_{it} + \\ &\delta' \textit{Bank characteristics}_{it} \times \textit{Post}_t + \zeta_{jt} + \eta_i + \theta_{ij} + \epsilon_{ijt} \end{aligned}$ 

- Loan outcome<sub>ijt</sub>: % of new loans in existing loans within each bank-borrower pair in each quarter (unweighted and weighted by loan volumes).
- *MSLP*  $bank_i \times Post_t$ : dummy for MSLP banks after program start in 2020:Q3
- Bank characteristics<sub>it</sub>: size, loans/assets, C&I loans/loans, capital, and core deposits
- *Fixed effects*: borrower×quarter and bank×borrower

### Credit Spillovers: Extensive Margin Results for Credit Register Loans

MSLP banks were relatively more likely to provide new loans (renew maturing loans or originate new loans) in the post-MSLP period.

Dependent variable:	(1) (2) New loan share			(4) an share weighted			
	A. OLS estimates						
$MSLP \ bank \times Post$	0.0298*** (0.004)	0.0257*** (0.004)	0.0304*** (0.004)	0.0269*** (0.004)			
R <sup>2</sup>	0.600	0.748	0.609	0.753			
	B. 2SLS estimates						
$MSLP \ bank \times Post$	0.0344*** (0.010)	0.0204** (0.009)	0.0377*** (0.010)	0.0250*** (0.009)			
No. of observations Mean of dep. var F-stat first stage Bank controls Bank controls × Post Borrower × quarter FE Bank FE Bank × borrower FE	78,107 0.103 3174 Y Y Y Y	75,836 0.0965 3021 Y Y Y Y Y	78,101 0.101 3173 Y Y Y Y	75,832 0.0947 3021 Y Y Y Y Y			

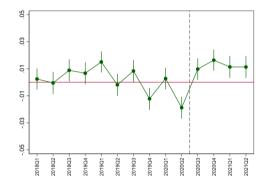
OLS and 2SLS regressions using credit register data from the Y-14Q H1. The data are at the bank-firm-quarter level over 2020;Q1-2020;Q3. Standard errors are clustered on bank-firm. Significance: \*\*\* 1%, \*\* 5%, \* 10%.

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#### Credit Spillovers of the MSLP

### Dynamic diff-in-diff coefficient chart for lending

MSLP banks were relatively more likely to provide new loans in the post-MSLP period but not systematically different from non-MSLP banks before the program.

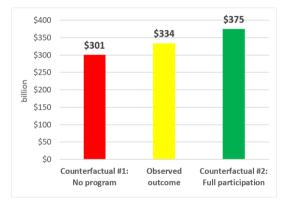


The figure shows the effects of MSLP bank participation on the share of new loans during the period between 2018:Q1 and 2021:Q2. The chart plots the estimated difference-in-differences coefficients and the associated 99% confidence levels of the dynamic variant of model (2) in the Table on "Extensive Margin Results for Credit Register Loans" with interaction effects between MSLP bank and quarterly dummies over the sample period.

#### Credit Spillovers of the MSLP

#### **Economic Interpretations**

Back of the envelope calculations on our estimates indicate that:



- Counterfactual #1: Without the program, in the credit register sample (assets > 100bn), total new loans in 2020:Q3 would have been **10%** lower than they were.
- Counterfactual #2: If all the credit register banks had participated in the program, total new loans in 2020:Q3 would have been 12% higher than they were.

#### Credit Spillovers: Intensive Margin Results–Volumes and Spreads

Conditional on granting loans, MSLP banks were relatively more likely to provide larger and cheaper loans in the post-MSLP period. Dealscan offers external validity and larger sample of banks.

	(1)	(2)	(3)	(4)	
	Evidence from	m Credit Register	Evidence from Dealsc		
Dependent variable:	Loan growth	Loan spread	Loan share	Loan spread	
MSLP bank $ imes$ Post	1.3170** (0.644)	-0.0214 <sup>#</sup> (0.015)	0.1559** (0.061)	-0.4377** (0.093)	
No. of observations	70,046	39,368	5,107	4000	
Mean of dep. var	0.332	1.948	0.245	2.470	
F-stat first stage	2766	842.8	22.20	49.16	
Bank controls	Y	Y	Y	Y	
Bank controls $ imes$ Post	Y	Y	Y	Y	
Borrower $ imes$ Quarter FE	Y	Y	Y	Y	
Bank FE	Y	Y	Y	Y	
Bank  imes BorrowerFE	Y	Y			
State $ imes$ Quarter FE			Y	Y	
Industry $ imes$ Quarter FE			Y	Y	

2SLS regressions using credit register data from the Y-14O H1 at the bank-firm-quarter level (columns 1-2) and Dealscan data at the loan level (columns 3-4). Sample period is 2020:01-2020:03. Significance: \*\*\* 1%. \*\* 5%. \* 10%. # 15%.

# Mechanisms: Risk Perceptions and Balance Sheet Constraints

#### Two Mutually-Nonexclusive Mechanisms

#### Risk perceptions mechanism:

• The monetary authority's credible commitment to provide a liquidity backstop can change market participants' risk perceptions, improve risk tolerance, and boost willingness to take risk in the face of extreme uncertainty shocks

#### Balance sheet constraints mechanism:

- MSLP eases lending constraints directly by removing 95% of credit exposure and freeing up resources from the lenders' balance sheet
- MSLP eases future lending constraints by providing the option to originate business loans in the future should conditions deteriorate

Empirical tests: Exploit indicators of balance sheet constraints and firm risk

## Mechanisms: Evidence from CAMELS and Risk Management Index

MSLP banks with poor CAMELS score (more balance sheet constrained) and higher Risk Management Index (stronger risk controls, hence likely more risk averse) were more likely to grant new loans.

Dependent variable:	(1) New Ioan share	(2) New loan share volume-weighted	(3) New Ioan share	(4) New loan share volume-weighted
MSLP bank $\times$ Post $\times$ Poor Camels score (1) MSLP bank $\times$ Post $\times$ Favorable Camels score (2)	0.0409*** (0.011) 0.0276*** (0.009)	0.0397*** (0.011) 0.0305*** (0.009)		
MSLP bank $ imes$ Post $ imes$ High RMI (3) MSLP bank $ imes$ Post $ imes$ Low RMI (4)			0.0831*** (0.023) 0.0372*** (0.010)	0.0967*** (0.023) 0.0446*** (0.010)
No. of observations	75,836	75,832	55,265	55,261
P-value test: coeff $ 1  >  2 $ P-value test: coeff $ 3  >  4 $	0.011	0.041	0.001	0.000
F-stat first stage Bank controls, controls × Post	3121 Y	3120 Y	1021 Y	1020 Y
Borrower $\times$ quarter FE Bank $\times$ borrower FE	Y Y	Y Y	Y Y	Y Y

In columns 1-2 the specifications open up the coefficient on "MLSP bank × Post" by the level of overall Camels score, measured at end 2020:Q2. Favorable Camels score takes value one for banks with an overall score of 1 and zero otherwise. Poor Camels score takes value one for banks with an overall score ranging between 2 and 4 and zero otherwise. In columns 3-4 the specifications open up the coefficient on "MLSP bank × Post' depending on the level of the RMI, a measure of the strength of risk management controls from Ellul and Yerramilli (2013) computed for 2013. Banks are split into low versus high RMI based on the sample median.

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### Mechanisms: Evidence from Bank Capital

#### More constrained banks had relatively larger spillover credit effects from MSLP participation.

Dependent variable:	(1) New Ioan share	(2) New loan share volume-weighted	(3) New Ioan share	(4) New loan share volume-weighted
Measure of bank constraints	Volunta	ry capital buffer	Cap	ital issuance
MSLP bank $\times$ Post $\times$ Low capital buffer (1)	0.0446*** (0.013)	0.0463*** (0.013)		
MSLP bank $\times$ Post $\times$ High capital buffer (2)	0.0261*** (0.007)	0.0277*** (0.007)		
MSLP bank $ imes$ Post $ imes$ No capital issuance (3)	(0.007)	(0.007)	0.0339*** (0.008)	0.0366*** (0.008)
MSLP bank $\times$ Post $\times$ Capital issuance (4)			0.0220** (0.010)	0.0278*** (0.010)
No. of observations	75,836	75,832	75,836	75,832
F-stat first stage P-value test: coeff $ 1  >  2 $	1119 0.021	1118 0.021	1863	1862
P-value test: coeff $ 3  >  4 $			0.045	0.104
Bank controls, controls $\times$ Post Borrower $\times$ quarter FE	Y Y	Y	Y Y	Y Y
Bank $\times$ borrower FE	Y	Ý	Y	Ý

Banks are constrained if they have below-median excess capital buffers or below-median capital issuance. Excess capital as of 2020;Q2 is computed as in Berrospide et al. (2021) as the CET1 capital ratio level of bank capital in excess of regulatory minimums plus regulatory buffers and captures the amount of capital that banks could lose without facing potential payout restrictions or shrinking their balance sheet in order to become compliant. The dummy variable "Capital issuance" takes value one for those banks that issued equity or subordinated debt during 2020;Q1-Q2 and zero otherwise based on SNL Financial data.

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### Mechanisms: Evidence from Firm Risk

Dependent variable:	(1) New Ioan share	(2) New Ioan share volume-weighted	(3) New Ioan share	(4) New Ioan share volume-weighted	(5) New Ioan share	(6) New loan share volume-weighted
Measure of firm heterogeneity	Firm in soc	ial-intensive sector		Firm size		edit risk rating
$MSLP \ bank \ \times \ Post:$						
imes Social-intensive sector (1)	0.0560*** (0.016)	0.0544*** (0.016)				
imes Regular sector (2)	0.0302*** (0.010)	0.0360*** (0.010)				
imes Small firm (3)	(0.010)	(0.010)	0.0196** (0.010)	0.0255*** (0.010)		
imes Large firm (4)			0.0224 (0.023)	0.0222 (0.023)		
imes Speculative-grade rated (5)			(01020)	(0.020)	0.0301*** (0.012)	0.0352*** (0.011)
imes Investment-grade rated (6)					0.0197	0.0248*
No. of observations F-stat first stage	77,599 1181	77,593 1179	75,836 1310	75,832 1310	69505 821.2	69,501 821
P-value test: coeff $ 1  >  2 $	0.050	0.116	1310	1310	021.2	821
P-value test: coeff $ 5  >  6 $	0.000	0.110			-	0.108
Bank controls, controls $\times$ Post	Y	Y	Y	Y	Y	Y
Borrower $\times$ quarter FE	Y	Y	Y	Y	Y	Y
Bank  imes borrowerFE			Y	Y	Y	Y

#### Mechanisms: Persistence of MSLP Effects/Backstop Role

Credit spillover effects were persistent through early-2021 but coefficient size decreases, suggesting diminished effects in 2020:Q4 after program expiration announcement and in 2021:Q1 after expiration.

Dependent variable:	(1)	(2) A. New Ioan share	(3)
	A. 2020:Q3	B. Add 2020:Q4	C. Add 2021:Q1
MSLP bank $\times$ Post	0.0204**	0.0217***	0.0132*
	(0.009)	(0.008)	(0.007)
No. of observations	75,836	105,816	132,713
F-stat first stage	3021	3227	3162
	B. Ne	w loan share, volume-	weighted
	A. 2020:Q3	B. Add 2020:Q4	C. Add 2021:Q1
$MSLP \ bank \times \ Post$	0.0250***	0.0253***	0.0169**
	(0.009)	(0.008)	(0.007)
No. of observations	75,832	105,106	131,792
F-stat first stage	3021	3276	3230
Bank controls, controls × Post	Y	Y	Y
Borrower × quarter FE	Y	Y	Y
Bank × borrower FE	Y	Y	Y

## Falsification Tests and Additional Results

Determinants of MSLP participation:

- Determinants of MSLP participation in Dealscan, Call Report samples MSLP Dealscan, Call Report

#### Robustness and falsification tests:

- Placebo tests Placebo
- Control for PPP participation 
   PPP loan balances
   , security holdings
   Security holdings
   , credit line drawdowns and bank cyclically
   CLDDs, Bank Cyclicality
- Extensive margin results at the loan level Extensive margin @ loan-level
- Alternative MSLP status definitions MSLP status alternative definitions

#### Additional results:

• Why was MSLP takeup so low? • MSLP low takeup Who were the MSLP borrowers? • MSLP borrowers

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Credit Spillovers of the MSLP

#### Conclusions

After the MSLP's implementation in mid-2020, participating banks:

- Were more likely to grant new loans outside of the MSLP program, provided new loans at better terms.
- Program participation generated positive lending spillovers outside of the program, both by easing balance sheet constraints and changing risk perceptions.
- Effects persisted but declined after the program ended.
- The program's presence or possible reinstatement encouraged banks to lend, knowing that if macro conditions or asset quality deteriorated further, they could keep lending via MSLP.
- Despite low overall takeup, the MSLP increased banks' willingness to take risk and use capacity to extend loans to businesses, supporting the provision of credit during an extreme uncertainty shock and consistent with the goals of the policy as a backstop.

# **Additional Slides**

#### MSLP Participation by Bank Size

This table shows Main Street Lending Program participation statistics for commercial banks in the Call Report. Size groups are based on total assets at end-2020:Q2. • Back

	(1) All banks	(2) < \$1 bn	(3) > \$1 bn	(4) \$1-10 bn	(5) \$10-50 bn	(6) > \$50 br
Total no. of banks	5242	4191	893	748	98	47
Registered	614	274	336	251	55	30
Lender as of Nov 18 2020 (baseline)	181	77	101	63	22	16
Lender before program expiration	304	128	174	119	34	21
Not registered	4628	3917	557	497	43	17
% Registered	11.7%	6.5%	37.6%	33.6%	56.1%	63.8%
% Lender as of Nov 18 2020 (baseline)	29.5%	28.1%	30.1%	25.1%	40.0%	53.3%
% Lender before program expiration	49.5%	46.7%	51.8%	47.4%	61.8%	70.0%
% Not registered	88.3%	93.5%	62.4%	66.4%	43.9%	36.2%

#### Determinants of MSLP Participation—Dealscan, Call Report

Dependent variable:			1: MS	LP bank			
	A. Selection by bank characteristics						
Size (log-assets)	0.0387**					0.0448**	
Loans/Assets	(0.019)	0.0205 (0.236)				(0.022) 0.2012 (0.279)	
C&I Loans/Loans		(0.200)	0.8732*** (0.320)			0.7871**	
CET1 ratio			(0.520)	-2.7801** (1.164)		-1.7181 (1.311)	
Core Deposits/Liabilities				(1.104)	-0.4300 (0.367)	-0.4214 (0.367)	
Observations	152	152	152	152	152	152	
R <sup>2</sup>	0.027	0.000	0.046	0.018	0.008	0.092	
			B. Selection by	local condition	าร		
COVID cases (Mar 1-Dec 15) [1]	0.0023 (0.026)					0.0418 (0.047)	
COVID cases (Mar 1-Dec 15) [2]		-0.0020 (0.003)				-0.0014 (0.005)	
Change in unemployment rate			0.0153 (0.027)			-0.0242 (0.038)	
% Small firms unmet demand through PPP			(0.027)	0.0431*** (0.015)		0.0702*** (0.020)	
% Small firms experienced revenue drop				(0.013)	0.0072 (0.012)	-0.0135 (0.020)	
Observations	152	152	152	152	152	152	
R <sup>2</sup> Bank controls	0.093 Y	0.096 Y	0.094 Y	0.136 Y	0.095 Y	0.159 Y	
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#### **Placebo Tests**

Placebo test that centers the analysis on 2018 and 2019 shows no evidence that bank unobservables are driving the association between MSLP participation status and lending outcomes. • Back

Dependent variable:	(1) New loan share	(2) New loan share volume-weighted	(3) New loan share	(4) New loan share volume-weighted
	A. Placebo	test for 2019	B. Placebo	test for 2018
$MSLP \ bank \times Post$	0.0007 (0.004)	-0.0003 (0.004)	0.0046 (0.005)	0.0039 (0.006)
No. of observations	76,781	75,939	75,055	74,279
R <sup>2</sup>	0.754	0.764	0.752	0.765
Bank controls	Y	Y	Y	Y
Bank controls $ imes$ Post	Y	Y	Y	Y
Borrower $ imes$ quarter FE	Y	Y	Y	Y
Bank FE	Y	Y	Y	Y
$Bank\timesborrowerFE$	Y	Y	Y	Y

This table reports OLS estimates of placebo tests for the spillover effects of MSLP participation on the extensive margin of C&I lending. The dependent variables are the share of new loans out of outstanding loans, unweighted (columns 1-2) and loan volume-weighted (columns 3-4). Specifications in columns 1-2 refer to 2019 outcomes (sample period 2019:Q1-2019:Q3, variable Post takes value one in 2019:Q3) and those in columns 3-4 refer to 2018 outcomes (sample period 2019:Q1-2018:Q3, variable Post takes value one in 2018:Q3). Standard errors are clustered at the bank-firm level. Significance: \*\*\* 1%, \*\*5%, \*10%.

#### **Control for PPP Loan Balances**

Controlling for the intensity of PPP participation in 2020:Q2 or Q3 leaves results unchanged. • Back

Dependent variable:	(1) (2) New loan share		(3) (4) New loan share volume-weighted		
	A. Control for PPP balances end-2020Q2				
$MSLP \ bank \ \times \ Post$	0.0329*** (0.010)	0.0200**	0.0363*** (0.010)	0.0247*** (0.009)	
PPP balances/Assets $ imes$ Post	0.0189***	0.0154***	0.0199***	0.0164***	
	(0.003)	(0.003)	(0.003)	(0.003)	
No. of observations	78,107	75,836	78,101	75,832	
F-stat	3479	3299	3478	3298	
	B. Control for PPP balances end-2020Q3				
$MSLP \ bank \ \times \ Post$	0.0339***	0.0208**	0.0374***	0.0256***	
	(0.010)	(0.009)	(0.010)	(0.009)	
PPP balances/Assets $\times$ Post	0.0195***	0.0159***	0.0207***	0.0170***	
	(0.003)	(0.003)	(0.003)	(0.003)	
No. of observations	78,107	75,836	78,101	75,832	
F-stat	3474	3292	3473	3291	
Bank controls Bank controls $\times$ Post Borrower $\times$ quarter FE Bank $\times$ borrower FE	Y Y Y	Y Y Y Y	Y Y Y	Y Y Y Y	

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TBD

#### Control for bank-level securities holdings

Results are robust to controlling for security holdings, which capture valuation effects from other Federal Reserve secondary market interventions, including quantitative easing. Back

Dependent variable:	(1) (2) New loan share		(3) (4) New loan share volume-weighted		
	A. Control for securities/assets, 2019:Q4				
$MSLP \ bank \times \ Post$	0.0429***	0.0323***	0.0462***	0.0366***	
	(0.009)	(0.009)	(0.009)	(0.009)	
Securities/Assets $ imes$ Post	0.2096***	0.2337***	0.2091***	0.2299***	
	(0.046)	(0.046)	(0.046)	(0.046)	
No. of observations	78,107	75,836	78,101	75,832	
F-stat	2893	2757	2892	2757	
	B. Control for securities/assets, 2020:Q2				
$MSLP \ bank \times \ Post$	0.0408***	0.0290***	0.0439***	0.0332***	
	(0.009)	(0.009)	(0.009)	(0.009)	
Securities/Assets $\times$ Post	0.1658***	0.1723***	0.1616***	0.1658***	
	(0.038)	(0.037)	(0.037)	(0.037)	
No. of observations	78,107	75,836	78,101	75,832	
F-stat	2959	2824	2958	2823	
$\begin{array}{l} \text{Bank controls, controls} \times \text{Post} \\ \text{Borrower} \times \text{quarter FE} \\ \text{Bank} \times \text{borrower FE} \end{array}$	Y Y	Y Y Y	Y Y	Y Y Y	

#### Control for drawdowns and bank cyclicality

Results are robust to controlling for credit line drawdowns and bank lending cyclicality. Pack

Dependent variable:	(1) New loa	(1) (2) (3) (4 New loan share New loan share volume-weighted			
	A. Control for credit line drawdowns				
$MSLP \ bank \ \times \ Post$	0.0423***	0.0284***	0.0458***	0.0331***	
	(0.008)	(0.008)	(0.008)	(0.008)	
Drawdowns	0.0076***	0.0072***	0.0077***	0.0073***	
	(0.001)	(0.001)	(0.001)	(0.001)	
$Drawdowns \times Post$	-0.0313***	-0.0309***	-0.0319***	-0.0311***	
	(0.005)	(0.005)	(0.005)	(0.005)	
No. of observations	78,107	75,836	78,101	75,832	
F-stat	3577	3410	3576	3409	
	B. Control for bank cyclicality				
MSLP bank $\times$ Post	0.0392***	0.0259***	0.0427***	0.0307***	
	(0.010)	(0.009)	(0.010)	(0.009)	
	-0.0114***	-0.0132***	-0.0119***	-0.0136***	
Bank cyclicality $\times$ Post	(0.002)	(0.002)	(0.002)	(0.002)	
No. of observations	78,107	75,836	78,101	75,832	
F-stat	3095	2946	3095	2945	
Bank controls, controls × Post	Y	Y	Y	Y	
Borrower × quarter FE	Y	Y	Y	Y	
Bank $\times$ borrower FE		Ŷ		Ý	

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#### Extensive margin results with loan-level data

The loan type fixed effects capture a loan's status as term loan vs. revolving credit; and also a loan's security status as asset-based, earnings-based, or unsecured. • Back

Dependent variable:	(1)	(2) 1: Nev	(3) w loan	(4)	
	A. OLS estimates				
$MSLP \ bank \times Post$	0.0288*** (0.004)	0.0241*** (0.004)	0.0277*** (0.004)	0.0241*** (0.004)	
No. of observations R <sup>2</sup>	228,701 0.613	226,947 0.673	213,521 0.634	211,954 0.689	
	B. 2SLS estimates				
MSLP bank $ imes$ Post	0.0375*** (0.010)	0.0262*** (0.010)	0.0291*** (0.011)	0.0229** (0.011)	
No. of observations F-stat first stage Bank controls, controls × Post Borrower × quarter FE Bank FE Bank × borrower FE Loan type FE Loan type × quarter FE	228,701 2182 Y Y Y	226,947 2083 Y Y Y Y	213,521 1918 Y Y Y Y Y	211,954 1832 Y Y Y Y Y Y	

#### Robustness to alternative lender status definitions

In the baseline results, the MSLP lender status defined as of Nov 18, 2020 results in 11 MSLP banks and 21 non-MSLP banks in the Y-14Q sample. In robustness results, the breakdown of MSLP/mon-MSLP banks is 4/28 banks as of end-Sep; 6/26 banks as of end-Oct; and 12/20 banks as of end-Nov 2020. • Back

Definition of MSLP participation:	(1)	(2)	(3)	
	<b>Lender</b>	<b>Lender</b>	<b>Lender</b>	
	end-Sep	end-Oct	end-Nov	
	A. New loan share			
$MSLP \ bank \ \times \ Post$	0.0325***	0.0364***	0.0272***	
	(0.009)	(0.010)	(0.008)	
No. of observations	75,836	75,836	75,836	
First stage F-stat	3797	2230	3617	
	B. New loan share (volume-weighted)			
$MSLP \ bank \times Post$	0.0343***	0.0383***	0.0287***	
	(0.009)	(0.010)	(0.008)	
No. of observations	75,832	75,832	75,832	
First stage F-stat	3796	2230	3617	
Bank controls, controls $\times$ Post	Y	Y	Y	
Borrower $\times$ quarter FE	Y	Y	Y	
Bank $\times$ borrower FE	Y	Y	Y	

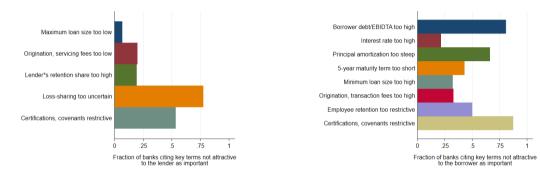
#### Mechanisms: Bank b/s constraints, CAMELS components Pack

	(1)	(2)	(3)	(4)	(5)
	A. New loan share				
Camels component:	Capital	Asset quality	Management	Earnings	Liquidity
MSLP bank $ imes$ Post $ imes$ Poor Camels score (1)	0.0409***	0.0326***	0.0340***	0.0471***	0.0409***
MSLP bank $\times$ Post $\times$ Favorable Camels score (2)	(0.011) 0.0276*** (0.009)	(0.010) 0.0244*** (0.009)	(0.011) 0.0215** (0.009)	(0.011) 0.0254*** (0.008)	(0.011) 0.0276*** (0.009)
No. of observations P-value test: coeff $ 1  >  2 $ F-stat first stage	75,836 0.022 3121	75,836 0.106 4022	75,836 0.029 3259	75,836 0.001 3377	75,836 0.022 3121
	B. New loan share (volume-weighted)				
MSLP bank Post $ imes$ Poor Camels score (1)	0.0397***	0.0320***	0.0327***	0.0468***	0.0397***
MSLP bank $\times$ Post $\times$ Favorable Camels score (2)	(0.011) 0.0305*** (0.009)	(0.010) 0.0275*** (0.009)	(0.011) 0.0243*** (0.009)	(0.011) 0.0296*** (0.008)	(0.011) 0.0305*** (0.009)
No. of observations P-value test: coeff $ 1  >  2 $ F-stat first stage	75,832 0.081 3120	75,832 0.248 4020	75,832 0.102 3258	75,832 0.006 3376	75,832 0.081 3120
Bank controls, controls $\times$ Post	Y	Y	Y	Y	Y
Borrower × quarter FE Bank × borrower FE	Y Y	Y Y	Y Y	Y Y	Y Y

## Why Was Program Takeup So Low?

Both lender terms and borrower terms in the MSLP design discouraged participation.





#### Figure: Banks' Reasons Not to Participate

#### Figure: Firms' Reasons Not to Participate

This figure tabulates bank-level responses to survey questions asked in the September 2020 MSLP Senior Loan Officer Opinion Survey (SLOOS) that examined the determinants of banks' MSLP participation. The panels show the key lender and borrower terms cited by banks as reasons for not registering or lending (pooled across banks that did not register and banks that registered but did not lend as of survey close at end-August 2020). Source: Federal Reserve.

#### Borrower Analysis: Who Borrowed Under the Program?

MSLP borrowers are more levered, have lower cash buffers and lower current profitability, and are assessed as riskier by banks. But they also exhibit significantly higher growth opportunities compared to eligible non-MSLP borrowers. Back

	(1)	(2)	(3)	(4)	(5)	(6)
	MSLP borrowers (N=159)		Eligible non-borrowers borrowers ( <i>N</i> =26,729)		p-value t-tests	
	Means	Medians	Means	Medians	Means	Medians
Total assets (\$mn)	169.47	27.46	909.34	20.49	0.26	0.00
ICR (EBITDA/interest expense)	15.31	6.44	33.88	12.96	0.00	0.00
ROA (EBITDA/assets, %)	18.83	15.66	22.50	16.25	0.04	0.56
Debt-to-asset ratio (%)	40.69	38.00	27.86	22.89	0.00	0.00
Cash-to-asset ratio (%)	9.07	4.84	12.18	6.73	0.01	0.00
Sales growth (%)	24.10	10.26	12.65	7.54	0.00	0.02
Rating (1=AAA, 5=BB, 9=C)	5.40	5.00	4.63	5.00	0.00	0.00

This table reports means and medians for key borrower and loan characteristics for MSLP borrowers and eligible non-borrowers, with p-values for t-tests of equality of means and medians across the two groups using financials data for end-2019. Borrower MSLP eligibility is defined using the following criteria: (i) the firm had 2019 annual revenues of up to \$5 billion; (ii) total debt does not exceed 6x the 2019 EBITDA; (iii) internal risk rating equivalent to a "pass" in the FFIEC supervisory rating system (or not worse than BB on the S&P rating scale). We matched 159 MSLP borrowers from the MSLP loan data release of January 11 with the Y-14Q dataset as of 2019:24, using exact and scrubbed matching by borrower name and city-state location. Source: Federal Reserve Y-14Q H1.

#### Credit Spillovers of the MSLP