# CORPORATE LOAN SPREADS AND ECONOMIC ACTIVITY

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# MOTIVATION



Corporate bonds (black), Corporate loans (red)

# MOTIVATION

- Credit spreads derived from bond and loan markets encode unique information
  - Bond credit spreads focuses on the least constrained firms, misses firms most sensitive to financial frictions
- $\rightarrow$  This paper: Novel dataset to exploit the unique information contained within corporate *loan* spreads:
  - Improve economic forecasts
  - Measure financial frictions

## KEY RESULTS

- 1. Loan spreads improve macro forecasts above and beyond existing measures.
  - Robust to other economic aggregates; different prediction horizons; other controls; other countries; in and out of sample
- 2. Loan spreads capture both borrower and intermediary balance sheet constraints
- 3. We highlight benefits of exploring lower aggregation levels

# CONTRIBUTION

- 1. Introduce new credit spread that has economically large predictive power
  - Important for academics and policy makers
- 2. Add to the debate on what types of frictions matter for the business cycle
  - Relax implicit assumption that the same frictions apply across bond and loan markets. Focusing only on bond market underestimates borrower frictions

# SECONDARY LOAN MARKET TRADING VOLUME





#### AGGREGATE LOAN SPREAD

- "Bottom-up" spread
  - Qrt. cash flows: coupon using 3m forward LIBOR + AISD  $\rightarrow$  yield-to-maturity  $y_{it}[k]$
  - Synthetic risk-free loan w/ same cash-flow profile  $\rightarrow$  yield-to-maturity  $y_{it}^{f}[k]$ 
    - DCF using cont. comp. zero-coupon Treasury yields (Gürkaynak, Sack, and Wright, 2007)
  - $\rightarrow$  Loan spread (for each loan):  $S_{it}[k] = y_{it}[k] y_{it}^{f}[k]$
  - $\rightarrow$  Aggregate loan spread:  $S_t^{Loan} = \frac{1}{N_t} \sum_i \sum_k S_{it}[k]$

# LOAN SPREAD (1999-2020)



Loan spread (red), GZ bond spread (black), Baa (blue), CP-Bill (purple)

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#### FORECASTING ECONOMIC DEVELOPMENTS

$$\Delta y_{t+h} = \alpha + \beta \Delta y_{t-1} + \gamma_1 \Delta S_t + \lambda_2 T S_t + \lambda_3 RFF_t + \epsilon_{t+h},$$

- Δy is the log growth rate of a macro variable (in this talk mainly industrial production. Various other measures in paper)
- S<sub>t</sub> is a credit spread or other indicator
- $TS_t$  is the term spread and  $RFF_t$  real effective fed fund rate
- Estimated with OLS, Newey-West/H-H s.e., coefficients are standardized

## **BASELINE RESULTS**

			Industrial Pro	duction; For	ecast horizo	n: 3 months		
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
$\Delta S_t^{CP-Bill}$		0.081						
$\Delta S_t^{Baa-Aaa}$		(0.515)	-0.276					
$\Delta S_t^{HY-AAA}$			( 0.000)	-0.252				
$\Delta S_t^{Bond}$				(-5.520)	-0.207			
$\Delta S_t^{Loan}$					(-2.030)	-0.405		-0.356
$\Delta S_t^{Bond PC}$						(-5.000)	-0.253 (-3.540)	(-4.590 - 0.115 (-1.690)
FFR	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Term Spread	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Adj R <sup>2</sup>	0.189	0.192	0.262	0.249	0.228	0.335	0.249	0.343
Inc R <sup>2</sup>	-	+0.03	+0.073	+0.060	+0.039	+0.146	+0.06	+0.154
LR Test( $\chi^2$ )	-	-	-	-	-	-	-	33.26
Obs	241	241	241	241	241	241	241	241

▹ Hansen Hodrick SE

Alternative variables

▶ Europe

► Robustness

► LP ( > 00S )

# MECHANISM I: INTERMEDIARY BALANCE SHEETS

- Loan market borrowers may have limited funding alternatives and hence are particularly sensitive to shocks to the balance sheets of financial intermediaries
- Reduced capacity and/or willingness of intermediaries to provide credit to the economy which is reflected in credit spreads
  - A deterioration in the health of intermediaries (e.g. Holmström and Tirole, 1997)
  - Frictions in raising new capital (e.g. He and Krishnamurthy, 2013; Gertler and Kiyotaki, 2010)
  - Fluctuations in collateral value (e.g. Kiyotaki and Moore, 1997)

# CREDIT CONDITIONS AND BANK HEALTH I

	(1)	(2)	(3)	(4)
Panel A. FSLOSS				
$\Delta S_t^{CP-Bill}$	-0.015 (-0.108)			
$\Delta S_t^{Loan}$	()	0.439		0.464
$\Delta S_t^{Bond PC}$		(3.730)	0.310 (2.218)	-0.034 (-0.239)
Adjusted R <sup>2</sup> Observations	-0.012 81	0.182 81	0.085 81	0.172 81
Panel B. Unsued Commitments				
$\Delta S_t^{CP-Bill}$	-0.057 (-0.284)			
$\Delta S_t^{Loan}$		-0.343		-0.309
$\Delta S_t^{Bond PC}$		(-2.443)	-0.288 (-1.638)	-0.043 (-0.167)
Adjusted R <sup>2</sup>	-0.010	0.106	0.071	0.095
Observations	81	81	81	81

▶ Europe

# CREDIT SPREAD DECOMPOSITION

	Loan Spread <sub>ibt</sub>	Industrial Production <sub>t</sub> (3-month)
$\Delta \hat{S}_{t}^{Loan}$		-0.373
		(-5.009)
$\Delta ELP_t$		-0.265
		(-4.682)
$\overline{DD}_{bt}$	-0.429	
_	(-36.620)	
$\overline{DD}_{bt}^2$	0.027	
51	(28.190)	
$\sigma DD_{bt}$	-0.023	
	(-3.501)	
Ln(AISD)	0.670	
	(30.710)	
Ln(Age)	0.066	
	(29.680)	
Ln(Amount)	-0.055	
	(-8.896)	
Secured(0/1)	-0.011	
- (- (-)	(-0.441)	
Covenants(0/1)	0.009	
	(0.750)	
Senior(0/1)	0.115	
	(1.111)	
Loan type fixed effects	Yes	
Industry fixed effects	Yes	
Rating fixed effects	Yes	
Adjusted R <sup>2</sup>	0.465	0.355
Observations	288,072	241
Incremental R <sup>2</sup>		+0.166
Contribution from $\Delta S_t^{Loan}$		0.676

## MECHANISMS II: BORROWER BALANCE SHEETS

- Loan market borrowers may be particularly sensitive to financial frictions that emanate from their own balance sheet
- Wedge between the cost of external funds and the opportunity cost of internal funds, labelled the "external finance premium" (e.g. Bernanke and Gertler, 1989)
- A deterioration in the health of borrower balance sheets is further amplified via a "financial accelerator" effect (e.g. Bernanke, Gertler, and Gilchrist, 1999), which is subsequently reflected in the borrower's cost of credit

# BORROWER SIZE AND AGE



- Loan borrowers younger (29% <= 5yrs) and smaller (67% <= 2bill)
- Loan spread capturing borrower balance sheet frictions

## SIZE AND AGE DOUBLE-SORT

	Industrial production; Forecast horizon: 3 months					
	(1)	(2)	(3)			
$\Delta S_t^{Loan}$ [Young + Small Firms]	-0.375 (-4.115)					
$\Delta S_t^{Loan}[Old + Large Firms]$		-0.266				
$\Delta S_t^{Loan}[Private]$		(-3.463)	-0.415 (-5.340)			
Term Spread	$\checkmark$	$\checkmark$	$\checkmark$			
FFR	$\checkmark$	$\checkmark$	$\checkmark$			
Adjusted R <sup>2</sup>	0.320	0.254	0.341			
Incremental R <sup>2</sup>	+ 0.131	+0.064	+0.152			
Observations	241	241	241			

- Consistent with smaller, private firms being more sensitive to changes in economic conditions (e.g., Begenau and Salomao (2019); Pflueger, Siriwardane, and Sunderam (2020))
- Non-overlapping sample (small & young) explains largest part of incremental predictive power

Ratings split

## INDUSTRY LOAN SPREADS



## INDUSTRY FORECASTING RESULTS

	Industry employment; Forecast horizon: 3 months					
	(1)	(2)	(3)	(4)		
S <sup>Loan</sup> S <sup>Loan</sup>	-0.130 (-3.491) -0.239	-0.171 (-3.534)	-0.292 (-4.609)			
S <sub>t</sub> S <sub>bt</sub> <sup>Loan</sup> x Top 3 EFD	(-3.818)			-0.519		
$S_{bt}^{Loan}$ × Middle 4 EFD				(-2.754)		
$S_{bt}^{Loan}$ × Bottom 4 EFD				-0.139 (-1.606)		
Year × quarter fixed effects	No	Yes	Yes	Yes		
Industry fixed effects	No	No	Yes	Yes		
Adjusted R <sup>2</sup>	0.452	0.558	0.590	0.606		
Incremental R <sup>2</sup>	+ 0.086	+0.192	+0.224	+0.240		
Observations	803	803	803	803		

• Industries with firms that are more dependent on external finance (Rajan and Zingales (1998)) account for most of the predictive power of the loan spread.

Alternative Weighting

## CONCLUSION

- Introduce a novel measure of credit spreads using secondary loan market prices
- Loan spreads contain information about the future business cycle above and beyond existing credit spread indicators
- Differential predictive power is (in part) driven by compositional differences btw loan and bond markets (borrower and bank frictions)

# Thanks!

# DATA

- Daily secondary market prices (mid quotes) of loans from the Loan Syndication and Trading Association (LSTA)
  - 1999 to Q1 2020 period, U.S. non-financial firms, TL, >300,000 loan-month observations ( $\sim$  1,200 loans outstanding per month)
- LPC Dealscan matched to LSTA using LIN
  - Loan amount/spread > cash flows + contract terms
- Bond information
  - Gilchrist and Zakrajšek (2012), TRACE, and Mergent FISD
- Macro variables: FRED, BEA, BLS

# SECONDARY LOAN MARKET TRADING VOLUME





# SECONDARY LOAN MARKET LIQUIDITY



- Pre-GFC bid-ask-spread: 68bps (vs. 34bps in the bond market)
- Secondary loan market is highly liquid.



## Rating distribution - bond vs loan market





# Robustness

_	Industrial Production; Forecast horizon: 3 months					
	(1) Terms	(2) Liq	(3) Equity	(4) VIX	(5) Ex. 08-09	(6) Ex. 08-09
$\Delta S_t^{Loan}$		-0.358	-0.378	-0.264	-0.148	
$\Delta S_t^{Bond PC}$		(-5.150)	(-5.370)	(-4.400)	(-1.980)	0.063
Residual $\Delta S_t^{Loan}$	-0.389					()
Bid-Ask	(-5.415)	-0.311				
∆ S&P500		(-2.920)	0.152			
ΔVIX			(2.990)	-0.351 (-3.110)		
Term Spread FFR	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	√ √	$\checkmark$
Adjusted R <sup>2</sup>	0.325	0.401	0.354	0.407	0.107	0.091
Incremental R <sup>2</sup> LR Test( $\chi$ )	+0.136 45.310	+0.212 41.986	+0.165 23.841	+0.218 20.062	+0.016 10.087	+0.000 2.830
Observations	241	241	241	241	225	225



#### ALTERNATIVE OUTCOME VARIABLES

-	Forecast horizon: 3 months						
	IP	PEMP	UE	тси	NEW	INV	
	(1)	(2)	(3)	(4)	(5)	(6)	
$\Delta S_t^{Loan}$	-0.356 (-4.590)	-0.177 (-3.380)	0.314 (3.060)	-0.329 (-3.670)	-0.227 (-4.510)	-0.191 (-3.090)	
Term Spread FFR $\Delta S_t^{Bond \ PC}$	$\checkmark$ $\checkmark$	$\checkmark$	$\sim$	√ √ √	$\sim$	$\checkmark$	
Adjusted R <sup>2</sup> Incremental R <sup>2</sup> LR Test( $\chi^2$ ) Observations	0.343 +0.154 33.26 241	0.664 + 0.054 35.14 241	0.183 +0.023 33.01 241	0.235 +0.133 30.21 241	0.224 +0.071 15.98 241	0.599 +0.067 23.68 241	

→ Alternative timing - A → Alternative timing - B → Back

#### ALTERNATIVE STANDARD ERRRORS

			Forecast hori	zon: 3 months		
	IP	PEMP	UE	тси	NEW	INV
-	(1)	(2)	(3)	(4)	(5)	(6)
$\Delta S_t^{Loan}$	-0.405 (-6.761)	-0.239 (-3.633)	0.362 (2.725)	-0.376 (-6.634)	-0.280 (-3.223)	-0.259 (-3.423)
Term Spread FFR $\Delta S_t^{Bond PC}$	$\checkmark$	\$ \$ \$	√ √ √	√ √ √	\$ \$ \$	$\checkmark$
Adjusted R <sup>2</sup> Observations	0.335 241	0.672 241	0.286 241	0.375 241	0.140 241	0.575 241

• Results remain highly significant with Hansen-Hodrick standard errors.

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	MAN	MAN	MAN	MAN	MAN	UE
	(1)	(2)	(3)	(4)	(5)	(6)
Panel A. Germany						
$\Delta S_t^{HYBond}$		-0.280				
$\Delta S_t^{Bond}$		(1.001)	-0.187			
$\Delta S_t^{Loan}$			(-1.659)	-0.379	-0.316	0.153
$\Delta S_t^{Bond PC}$				(-2.455)	-0.128	0.0004
Adjusted D <sup>2</sup>	0 1 4 1	0.207	0 171	0.262	0.071	0.415
Incremental R <sup>2</sup>	0.141	+0.065	+0.029	+0.1203	+0.129	+0.016
Contribution from $\Delta S_t^{Loan}$	-	-	-	-	0.704	0.890
Observations	227	227	227	227	227	227

Spain Spreads plot

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# **DYNAMICS - LOCAL PROJECTIONS**



• Other variables • Back

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# ALTERNATIVE TIMING CONVENTIONS

	Forecast horizon: 3 months					
	IP	PEMP	UE	тси	NEW	INV
	(1)	(2)	(3)	(4)	(5)	(6)
$\Delta S_t^{Loan}$	-0.309 (-4.841)	-0.146 (-3.867)	0.325 (3.123)	-0.287 (-4.773)	-0.226 (-3.777)	-0.117 (-2.057)
Term Spread FFR ∆ <i>S<sup>Bond PC</sup></i>	$\checkmark$	$\checkmark$	√ √ √	√ √ √	√ √ √	\$ \$ \$
Adjusted R <sup>2</sup> Incremental R <sup>2</sup> LR Test( $\chi^2$ ) Observations	0.361 +0.216 72.1 241	0.850 +0.026 41.3 241	0.240 +0.102 32.6 241	0.414 +0.191 70.2 241	0.160 +0.056 17.6 241	0.566 +0.023 14.7 241

• Defines growth rate as the growth from t to t + 3



## ALTERNATIVE TIMING CONVENTIONS

-	Forecast horizon: 3 months						
	IP	PEMP	UE	тси	NEW	INV	
-	(1)	(2)	(3)	(4)	(5)	(6)	
$\Delta S_t^{Loan}$	-0.252 (-3.597)	-0.190 (-4.839)	0.267 (3.728)	-0.228 (-3.538)	-0.243 (-3.918)	-0.201 (-3.931)	
Term Spread FFR $\Delta S_t^{Bond \ PC}$	$\checkmark$ $\checkmark$	$\checkmark$	$\checkmark$	√ √ √	\$ \$ \$	$\checkmark$	
Adjusted R <sup>2</sup> Incremental R <sup>2</sup> LR Test( $\chi^2$ ) Observations	0.452 +0.132 54.1 241	0.862 +0.045 71.4 241	0.389 +0.082 32.4 241	0.505 +0.113 52.0 241	0.123 +0.069 19.8 241	0.604 +0.063 37.9 241	

 Defines growth rate as the growth from t to t + 3 and lag period as t - 3 to t



# **DYNAMICS - LOCAL PROJECTIONS**



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## OUT-OF-SAMPLE

-	OOS horizon: $h = 3$ month					
	RMSE	Normalized RMSE	T - stat(p - value)			
	(1)	(2)	(3)			
Panel A. IP						
Baseline	0.0125	0.7033	-			
Baseline + $\Delta S_t^{Bond PC}$	0.0125	0.7027	-			
Baseline $+ \Delta S_t^{Loan}$	0.0113	0.6359	-2.836(0.005)			

- RMSE calculated via cross validation with expanding rolling window
- Loan spread significantly better at OOS forecasting



Other variables

# OUT-OF-SAMPLE

	OOS horizon: $h = 3$ month			
	RMSE	Normalized RMSE	T - stat(p - value)	
	(1)	(2)	(3)	
Panel A. IP				
Baseline + $\Delta S_{\pm}^{Bond PC}$	0.0125	0.7027	-	
Baseline + $\Delta S_t^{Loan}$	0.0113	0.6359	-2.836(0.005)	
Panel R PEMP				
Baseline + $\Lambda S^{Bond PC}$	0.00328	0 4843	_	
Baseline + $\Delta S_t^{Loan}$	0.00315	0.4660	-1.115(0.266)	
Panel C. UE				
Baseline + $\Delta S_t^{bond}$ / C	0.3182	0.7528	-	
Baseline $+\Delta S_t^{LOBH}$	0.3014	0.7130	-1.583(0.115)	
Panel D. TCU				
Baseline + $\Delta S_{t}^{Bond PC}$	0.9775	0.6823	-	
Baseline + $\Delta S_t^{Loan}$	0.9009	0.6289	-2.482(0.014)	
Panel E NEW				
Baseline $\pm \Lambda SBond PC$	0 1031	0 7839	_	
Baseline $+\Delta S_t^{Loan}$	0.0985	0.7493	-1.733(0.085)	
· 1			-()	
Panel F. INV				
Baseline + $\Delta S_t^{Bond PC}$	0.0097	0.5142	-	
Baseline $+\Delta S_t^{Loan}$	0.0092	0.4838	-1.652(0.100)	

	MAN	MAN	MAN	MAN	MAN	UE
	(1)	(2)	(3)	(4)	(5)	(6)
Panel B. France						
$\Delta S_t^{HYBond}$		-0.241 (-1.661)				
$\Delta S_t^{Bond}$		()	-0.138 (-0.937)			
$\Delta S_t^{Loan}$			( ,	-0.338 (-2.167)	-0.289 (-2.170)	0.263
$\Delta S_t^{Bond PC}$					-0.102 (-1.080)	0.065 (0.727)
Adjusted R <sup>2</sup>	0.097	0.143	0.110	0.192	0.195	0.217
Incremental R <sup>2</sup>	-	+0.046	+0.013	+0.095	+0.098	+0.070
Contribution from $\Delta S_t^{Loan}$	-	-	-	-	0.730	0.775
Observations	188	188	188	188	188	188



	MAN	MAN	MAN	MAN	MAN	UE
	(1)	(2)	(3)	(4)	(5)	(6)
Panel C. Spain						
$\Delta S_t^{HYBond}$		-0.292				
$\Delta S_t^{Bond}$		(1.555)	-0.188			
$\Delta S_t^{Loan}$			(-1.184)	-0.238	-0.122	0.103
$\Delta S_t^{Bond PC}$				(-1.972)	-0.224 (-1.398)	0.085 (1.173)
Adjusted R <sup>2</sup>	0.132	0.180	0.153	0.180	0.207	0.712
Incremental R <sup>2</sup>	-	+0.069	+0.030	+0.048	+0.075	+0.021
Contribution from $\Delta S_t^{Loan}$	-	-	-	-	0.371	0.553
Observations	187	187	187	187	187	187







2000 2005 2010 2015 2020



# Credit conditions - Europe

	Credit conditions based on loan officer surveys		
	(1)	(2)	
Germany			
$\Delta S_t^{Loan}$	0.376 (3.748)		
$\Delta S_t^{Bond}$		0.159 (1.182)	
Adjusted R <sup>2</sup>	0.128	0.011	
Observations	70	70	
France			
$\Delta S_{t}^{Loan}$	0.480		
	(3.545)		
$\Delta S_t^{Bond}$		0.329 (1.436)	
Adjusted R <sup>2</sup>	0.218	0.094	
Observations	64	64	
Spain			
$\Delta S_{t}^{Loan}$	0.370		
	(2.018)		
$\Delta S_t^{Bond}$		0.176 (1.008)	
Adjusted R <sup>2</sup>	0.122	0.015	
Observations	63	63	



## BORROWER RATING



• Half of loan market borrowers are private/unrated firms. Limited overlap between bond and loan borrowers



# BORROWER RATING

	Industrial production; Forecast horizon: 3 months				
	(1)	(2)	(3)	(4)	
$\Delta S_t^{Loan}[BBB]$	-0.101 (-1.532)				
$\Delta S_t^{Loan}[BB]$	. ,	-0.260			
-1		(-3.600)			
$\Delta S_t^{Loan}[B \text{ and below}]$			-0.422		
			(-5.311)		
$\Delta S_t^{Loan}$ [Not Available]				-0.410	
				(-3.972)	
Term Spread	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
FFR	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Adjusted R <sup>2</sup>	0.195	0.251	0.345	0.336	
Incremental R <sup>2</sup>	+ 0.006	+0.062	+0.156	+0.147	
Observations	241	241	241	241	

- Half of loan market borrowers are private/unrated firms. Limited overlap between bond and loan borrowers
- Repricing of risk by banks may be better reflected in loan spread

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# ALTERNATIVE EXPLANATION I: UNCERTAINTY

-	Industrial Production; Forecast horizon: 3 months					
_	(1)	(2)	(3)	(4)	(5)	
$\Delta S_t^{Loan}$	-0.264	-0.385	-0.321	-0.245	-0.489 (-3.672)	
VIX	-0.351	( 0.020)	( 0.000)	( 2.302)	( 0.012)	
EPU Index	()	-0.106 (-1.592)				
FinUn Index			-0.408 (-3.383)			
'Recession Index'				-0.500 (-4.190)		
PVS Index					0.238 (1.647)	
Term Spread FFR	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	√ √	
Adjusted R <sup>2</sup> Observations	0.407 241	0.341 241	0.458 241	0.516 241	0.255	

- Uncertainty proxies contain predictive power for future outcomes
- Uncertainty can, however, not explain the incremental predictive power of the loan spread

## ALTERNATIVE EXPLANATION II: SENTIMENT

- Investor sentiment appears important to understand credit spreads:
  - Credit spreads are too narrow during booms and proceed economic downturns (Greenwood and Hanson (2013)), López-Salido, Stein, and Zakrajšek (2017))
  - Investors under-price risk in good times, creating a credit boom. During downturns spreads overract in the opposite direction (Bordalo, Gennaioli, and Shleifer (2018)).
- Our focus in on the *relative* predictive power vis-a-vis bond spreads
- Borrower fundamentals drive relative predictive power of the loan spread (not excess loan premium, which would capture sentiment)



# SIZE EFFECT – LITERATURE

• Evidence in the literature that it is the large firms that *drive* the business cycle

- E.g. Crouzet and Mehrotra (2020), Gabaix (2011)

- On the other hand, smaller firms are more sensitive to changes in economic conditions
  - E.g. Begenau and Salomao (2019), Pflueger, Siriwardane, and Sunderam (2020), Crouzet and Mehrotra (2020)
- Our evidence suggests that smaller firms contain *information* about future business cycle movements



## ALTERNATIVE WEIGHTING SCHEMES

	Industrial production; Forecast horizon: 3 months				
	(1)	(2)	(3)	(4)	
$\Delta S_t^{Loan}$	-0.405				
$\Delta S_t^{Loan}[\text{GDP}]$	( 0.000)	-0.393			
$\Delta S_t^{Loan}$ [Industry]		(	-0.439 (-5.944)		
$\Delta S_t^{Loan}[EFD]$			(	-0.431 $(-4.488)$	
Term Spread FFR	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Adjusted R <sup>2</sup>	0.335	0.328	0.363	0.353	
Incremental R <sup>2</sup>	+ 0.146	+0.139	+0.173	+0.164	
Term Spread FFR Adjusted R <sup>2</sup> Incremental R <sup>2</sup> Observations	$\sqrt[]{0.335} + 0.146 \\ 241$	√ √ 0.328 +0.139 241	√ √ 0.363 +0.173 241	√ √ 0.353 +0.164 241	

• Thinking about how to aggregate measures from microdata can help improve business cycle forecast.

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