Shadow Always Touches the Feet: Implications of Bank Credit Lines to Non-Bank Financial Intermediaries

Viral V. Acharya, Manasa Gopal, Maximilian Jager, Sascha Steffen May 28, 2024

- An increasing share of bank credit lines gets issued to NBFI borrowers (25% in 2010, 34% in 2022)
- These credit lines expose banks to idiosyncratic risks inherent in NBFIs' asset and liability choice
- Since NBFI financing is, however, highly cyclical, these credit lines amplify banks' exposure to aggregate liquidity shortages

 \Rightarrow In this paper, we use credit lines to REITs as a laboratory to analyze these risks

COVID-19 to Commercial Real Estate Crisis

US Office vacancy rate rising

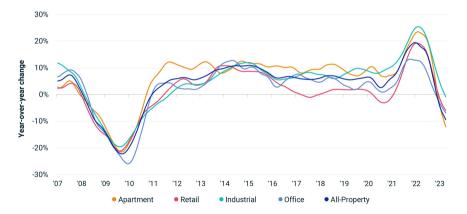


Source: Apollo Global Management

APOLLO

COVID-19 to Commercial Real Estate Crisis

Property Values



Source: Apollo Global Management

THE WALL STREET JOURNAL.

World Business U.S. Politics Economy Tech Finance Opinion Arts & Culture Lifestyle

THE WALL STREET JOURNAL.

Latest World Business U.S. Politics Economy Tech Finance Opinion Arts & Culture Lifestyle Real Estate Personal Finance Health Style

REAL ESTATE

The Clearest Sign Yet That Commercial Real Estate Is in Trouble

Lenders are issuing a record number of foreclosure notices related to risky property loans

FINANCE | BANKING

Commercial Property Losses Hammer Banks on Three Continents

Banks in the U.S., Japan and Switzerland announced losses tied to troubled real-estate lending

Rv Margot Patrick Follow Fliot Brown Follow and Gina Heeh Follow

Analysis

FSOC Says CRE Is Big Financial Risk

The 2023 annual report said banks hold about half of \$6 trillion in commercial real estate loans with signs of stress having emerged.

By Erik Sherman | December 18, 2023 at 08:12 AM



In its 2023 annual report, the Financial Stability Oversight Council — a legacy of the Dodd. Frank Act that includes a broad array of federal banking regulators and others — pointed to multiple financial risks for the U.S. First on the list, commercial real estate.

Trending Stories

Multifamily's Bounce Back Will Be Sharpest in These Markets



By <u>Shane Shifflett</u> Follow and <u>Konrad Putzier</u> Follow Sept. 6, 2023 8:07 am ET

FINANCE · ANALYSIS | NEW YORK CITY

How CRE Loans Threaten New York Community Bank and Other Regionals in 2024

NYCB's losses show that banks probably can't extend commercial real estate loans long enough to avoid enormous fallout

REPRINTS

BY BRIAN PASCUS FEBRUARY 26, 2024 10:03 AM

The New York Times

The Real Estate Crisis Looming Over Banks

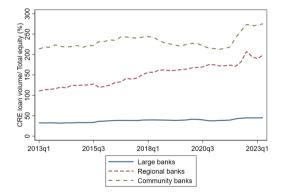
A year after the collapse of Silicon Valley Bank, investors are fearing for regional lenders saddled with a mountain of souring commercial mortgages.

🛱 Share full article 🔗 🗍 🗔 8

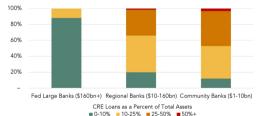
By Andrew Ross Sorkin, Ravi Mattu, Bernhard Warner, Sarah Kessler, Michael J. de la Merced, Lauren Hirsch and Ephrat Livni Feb. 7, 2024

To summarise the latest takeaway from UBS: If smaller regional banks cut back on lending because of CRE pressures, they still aren't responsible for a large enough share of credit provision that they would single-handedly slow the broader US economy.

Regional Banking Crisis?



Smaller Banks Have Greater Concentrations of CRE Loans than Larger Banks Proportion of Banks (Y-Axis) with Varying CRE Loan Concentrations (Color), by Bank Size (X-Axis)

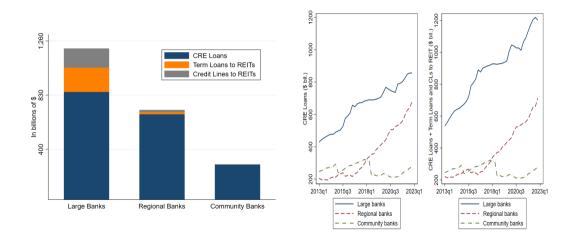


0-10%

Source: FDIC, Moody's Analytics, Mar. 2023

- Popular narrative seems to be commercial real estate risks are not a big concern for banks
- If banks are at risk, most of the risks seem to be at smaller banks
- And small bank losses may not impact the overall economy?
- But we show in this paper that this is not the whole story
- Banks have exposure to commercial real estate indirectly through credit lines that seem to have been ignored

Banks' Total Exposure to CRE



Credit Lines and Bank Performance

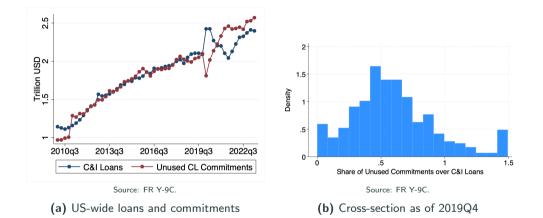
Banks serve a big role in the economy as providers of credit lines

What is a credit line?

- Lender commits to provision of credit at pre-arranged terms (interest rate etc.)
- Borrower decides if and when to use the provided credit ("drawdown")
- Borrower decides when to repay the provided credit
- Usual properties: 5 year maturity, complex fee structure, often syndicated

Firms use credit lines as a primary defense against financing stress and negative shocks that hinder access to financial markets

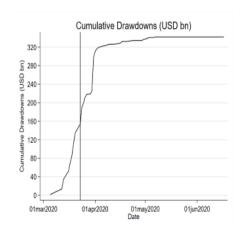
Credit Lines - relevance for banks



• Banks have roughly as much corporate credit committed (off-balance sheet) as they have on their balance sheet

Use of credit lines by firms

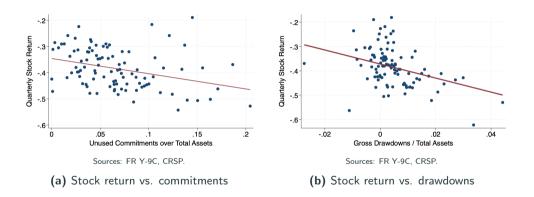
Credit Line Drawdown - COVID-19



Source: Acharya and Steffen (2020)

- Credit line commitments are reported "off-balance sheet"
- When credit lines are drawn, it becomes a loan on the bank's balance sheet
- Banks have to finance these loans increase liabilities or reduce other assets
- Also, banks need to hold additional capital when loans come on-balance sheet
- If there are correlated drawdowns (like during COVID-19), it may put pressure on bank balance sheets and affect bank performance

Credit lines and bank performance



- Banks are exposed directly to the commercial real estate market through loans
- This risk seems to be concentrated among smaller banks
- But, banks are also exposed to CRE through credit lines to *non-banks* that hold commercial real estate

Financial system has two broad categories of financial institutions - banks and nonbanks

Banks - Regulated institutions that (typically) take deposits to finance lending

Nonbanks or shadow banks - lightly regulated financial institutions

- Do many of the same activities as banks e.g. lending to consumers, small businesses, large corporations
- But, do not take deposits

After the 2008 financial crisis, increased bank regulation led to growth in unregulated nonbanks - across multiple markets

Real Estate Investment Trust (REIT) - own or finance real estate; anyone can invest in the REIT and get exposure to real estate markets – organized like a mutual fund

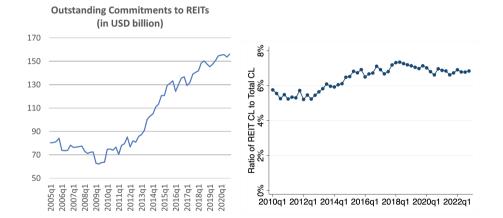
- 1100 REITs own more than \$4 trillion in assets across the U.S
- Investors can purchase stock of an individual company or through an exchange-traded fund
- 170 million Americans have exposure to REITs through retirement/ investment accounts

REITs make money through rent or interest income

Distributes profits as dividends (min. 90% of profits need to be paid out)

 ${>}95\%$ of REIT holdings are in commercial real estate

Bank exposure to REITs



What are the implications of banks providing credit lines to REITs (and other financial institutions)?

- ... for banks themselves (risk management, profits)?
- ... for financial stability (contagion, systemic risk)?

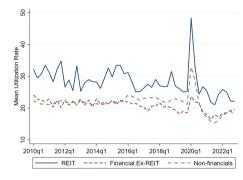
 \Rightarrow Important to understand the contingent/insurance-type linkages from banks to non-banks to understand how risks can be transmitted

Related literature

- Credit line business poses substantial risks for banks (Acharya and Mora, 2015; Ippolito, Peydró, Polo and Sette, 2016; Kapan and Minoiu, 2021; Chodorow-Reich, Darmouni, Luck and Plosser, 2022; Acharya, Engle, Jager and Steffen, forthcoming) → We show that these risks are amplified for credit lines to REITs
- NBFIs growth in many (credit) markets (Buchak, Matvos, Piskorski and Seru, 2018; Fleckenstein, Gopal, Gutierrez and Hillenbrand, 2023; Chernenko, Erel and Prilmeier, 2022; Gopal and Schnabl, 2022) was to a large extent made possible by liquidity insurance through banks (Acharya, Cetorelli and Tuckman, 2024; Cetorelli and Prazad, 2024) → We show a specific linkage between banks and REITs that transmits CRE risk to the banking sector
- CRE markets present a risk to banks both historically (Cole and White, 2012) and recently because of WFH policies and interest rate hikes (Gupta, Mittal and Van Nieuwerburgh, 2022; Jiang, Matvos, Piskorski and Seru, 2023) → We show that particularly large banks are indirectly exposed to the CRE market and its risks

Credit Line Utilization of REITs

Differential drawdowns of REITs





- REITs draw down more than non-financial corporations on average
- REITs have other spikes and cyclicality as well

Differential drawdowns of REITs - Summary Statistics

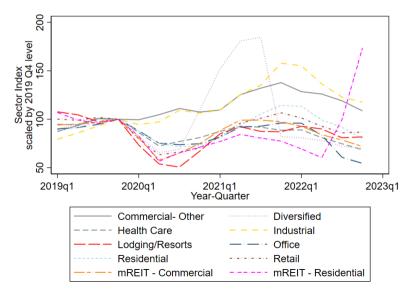
	All	AAA-A	BBB	Non-IG	Unrated
Number of REITs in a quarter	92.55	6.92	46.13	27.07	125.05
REIT - Total CL commitments (\$ mil.)	634.14	2,089.38	996.33	725.87	412.33
REIT - Avg. Utilization (%)	29.87	8.15	20.89	26.37	34.97
REIT - Wt. Avg. Utilization (%)	28.19	11.91	23.17	31.29	32.96
Number of Financial Ex-REIT in a quarter	830.53	56.07	75.59	39.22	964.78
Financial Ex-REIT - Total CL commitments (\$ mil.)	553.32	2,639.54	1,574.40	932.02	285.11
Financial Ex-REIT - Avg. Utilization (%)	21.58	11.02	17.64	23.25	22.62
Financial Ex-REIT - Wt. Avg. Utilization (%)	22.37	13.92	20.11	32.76	27.83
Number of Non-financials in a quarter	1,647.47	141.02	293.43	546.37	2,218.80
Non-financial - Total CL commitments (\$ mil.)	496.01	1,780.32	1,369.49	571.78	229.72
Non-financial - Avg. Utilization (%)	22.47	5.20	10.04	19.40	26.79
Non-financial - Wt. Avg. Utilization (%)	17.00	3.25	9.89	26.16	24.26

	All	AAA-A	BBB	Non-IG	Unrated
REIT - Utilization (%) - normal times	28.77	6.99	19.98	25.52	33.94
REIT - Utilization (%) - GFC	38.04	20.43	27.18	32.05	41.81
REIT - Utilization (%) - Covid-19	48.30	24.04	43.88	56.29	51.36
Financial Ex-REIT - Utilization (%)- normal times	21.14	10.31	16.48	22.88	22.26
Financial Ex-REIT - Utilization (%) - GFC	25.30	16.29	29.19	25.80	25.69
Financial Ex-REIT - Utilization (%) - Covid-19	23.64	9.44	22.50	29.75	24.26
Non-financial - Utilization (%) - normal times	21.73	4.37	8.90	18.23	26.35
Non-financial - Utilization (%) - GFC	27.24	12.38	19.08	27.06	29.33
Non-financial - Utilization (%) - Covid-19	32.89	12.48	18.43	39.62	35.30

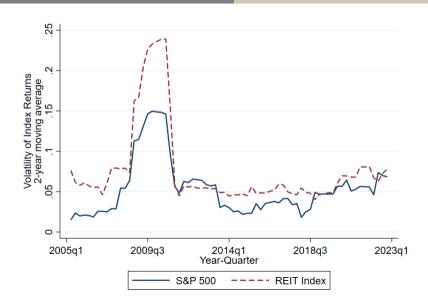
Differential drawdowns of REITs

		Utilization Rate (%)						
	(1)	(2)	(3)	(4)	(5)			
REIT Dummy	7.606***	9.569***	9.590***	9.552***	10.207***			
	(0.276)	(2.040)	(2.090)	(2.092)	(2.519)			
Log(Assets in mil.)		-3.336***	-3.353***	-3.362***	-3.581***			
		(0.323)	(0.294)	(0.294)	(0.427)			
Cash/Assets		-43.414***	-43.040***	-43.066***	-43.518***			
		(7.224)	(7.398)	(7.372)	(8.093)			
Debt/Equity		0.457***	0.448***	0.429***	0.404***			
		(0.127)	(0.125)	(0.126)	(0.121)			
Rating Notch FE	N	Y	Y	N	Ν			
Rating Group FE	Ν	N	N	Y	Y			
Year-Quarter FE	Ν	N	Y	Y	Y			
Sample					2010-2019			
Obs.	246,872	217,281	217,281	217,281	124,821			
R ²	0.003	0.108	0.115	0.113	0.118			

Differential performance across REITs - COVID-19



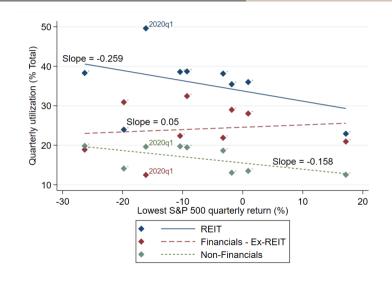
Co-movement of S&P500 and REIT Index



Differential drawdowns of REITs as a function of stock performance

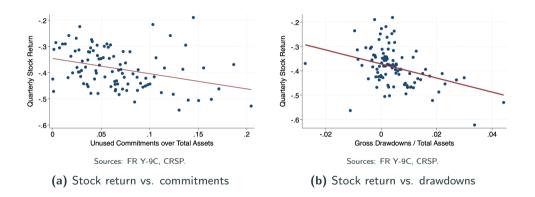
	Utilization Rate (%)				
	(1)	(2)	(3)	(4)	(5)
REIT	9.768***	9.798***	9.280***	9.452***	9.459***
	(1.585)	(1.583)	(1.708)	(1.814)	(1.815)
REIT × S&P 500 return	-1.429***			-0.335	-1.344**
	(0.553)			(0.763)	(0.606)
REIT × VIX		1.333*			
		(0.722)			
REIT × Crisis			4.007*		
			(2.355)		
REIT × Sub-sector return				-2.108***	
				(0.776)	
REIT × Sub-sector return (orthogonolized to S&P500)					-2.108***
					(0.776)
Controls	Υ	Y	Y	Y	Υ
Rating Group FE	Y	Y	Υ	Y	Y
Year-Quarter FE	Υ	Y	Υ	Y	Y
Obs.	211,042	211,042	211,042	142,228	142,228
R ²	0.112	0.112	0.112	0.094	0.094

Utilization rates of REITs vs non-financials in crises



- REITs draw down more than other firms, in general
- REITs are more sensitive to market stress than others, and have greater sensitivity to their own performance compared to non-financial firms

Effect on banks



Impact on Banks

The Benchmark from Acharya et. al. (2023):

	(1)	(2)	(3)
	Stock Return	Stock Return	Stock Return
Overall Commitment Above Median	0.00346	0.00442*	0.00427*
	(0.138)	(0.060)	(0.068)
Crisis Dummy	-0.0613***	-0.0165***	-0.0195***
	(0.000)	(0.001)	(0.000)
Overall Commitment Above Median × Crisis Dummy	-0.0260***	-0.0199***	-0.0196***
	(0.000)	(0.002)	(0.003)
Constant	0.0358***	0.00509***	0.00704***
	(0.000)	(0.005)	(0.000)
R-squared	0.232	0.234	0.236
Number obs.	30994	30994	30994
Specification	OLS	FF-3 Factors	FF-5 Factors

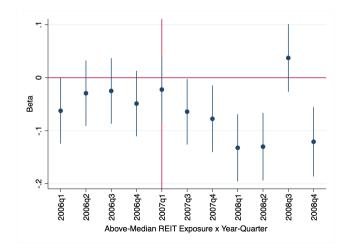
Effect on banks

	Quarterly bank stock returns (%)					
	(1)	(2)	(3)	(4)	(5)	(6)
High REIT CL Share	1.087**	-0.189	-0.288	-0.430	-0.219	0.166
	(2.57)	(-0.48)	(-0.72)	(-1.01)	(-0.52)	(0.34)
High REIT CL Share × Crisis	-4.348***	-3.256***	-2.824**	-3.021**	-5.889***	-3.832***
	(-2.73)	(-2.88)	(-2.36)	(-2.41)	(-4.47)	(-2.62)
High Overall Commitments			0.334	0.336	0.197	-0.195
			(1.50)	(1.51)	(0.91)	(-0.87)
High Overall Commitments × Crisis			-1.360*	-1.345*	-0.556	-0.818
			(-1.81)	(-1.78)	(-0.76)	(-1.03)
High REIT TL Share				-0.626	-0.428	-0.462
				(-0.93)	(-0.65)	(-0.60)
High REIT TL Share × Crisis				-1.727	-2.567	-2.587
				(-0.86)	(-0.98)	(-0.98)
High CRE Exposure					0.854***	2.112***
					(3.70)	(8.78)
High CRE Exposure x Crisis					-9.752***	-7.102***
					(-14.61)	(-10.22)
Constant	13.40***	0.642	0.758	1.214	-1.345	-5.636**
	(9.29)	(0.49)	(0.57)	(0.89)	(-1.05)	(-2.79)
Controls (small set)	Y	Y	Y	Y	Y	Y
Controls (large set)	N	N	N	N	N	Y
Fama-French 3 Factor	N	Y	Y	Y	Y	Y
Obs.	27,291	27,291	27,251	27,251	27,251	23,492
R ²	0.029	0.228	0.229	0.229	0.239	0.259

34

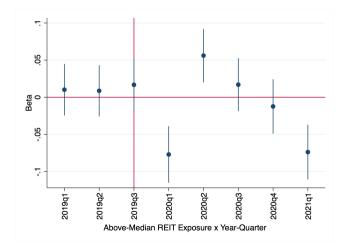
Bank Performance by REIT Exposure - GFC

BankStockReturn_{*it*} = β_{it} High REIT CL Share_{*i*} × $\mathbf{1}_t$ + X_{it} + α_i + γ_t + ϵ_{it} ,



Bank Performance by REIT Exposure - COVID-19

BankStockReturn_{*it*} = β_{it} High REIT CL Share_{*i*} × $\mathbf{1}_t$ + X_{it} + α_i + γ_t + ϵ_{it} ,



Take-Aways:

- Banks with higher REIT exposure face higher drawdowns
- Banks with higher REIT exposure suffer more in crisis times
- This effect goes beyond the general systemic/aggregate drawdown risk
- REIT exposure does not boost stock returns outside of crises!

 \Rightarrow If credit lines to financial borrowers (REITs) hurt banks they should be more expensive!

Are banks pricing the risk they are exposed to?

		All in drawn spread (bps)			
	(1)	(2)	(3)	(4)	(5)
REIT	-51.03***	-23.75***	-14.11***	-12.24***	-27.51***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Financial (Ex-REIT)	-52.87***	-48.46***	-34.22***	-29.26***	-29.14***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Constant	219.2***	190.3***	182.9***	188.8***	190.9***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Rating Group FE	N	Y	Y	Y	Y
Loan Controls	Ν	Ν	Ν	Y	Y
Lender \times Year-Quarter FE	Ν	Ν	Y	Y	Y
Obs.	74,941	47,008	37,424	35,805	35,805
R ²	0.021	0.093	0.507	0.532	0.533

• Financial borrowers pay less, even though they pose more risk and are, regulatorily speaking, more expensive!

Systemic Risk

Panel	Α –	Estimated	parameters
-------	-----	-----------	------------

E[Utilization ^{REIT} Crisis]	E[Utilization ^{Non-REIT} Crisis]	$\gamma^{\textit{REIT}}$	$\gamma^{\textit{Non-REIT}}$
0.448	0.294	-2.35	-0.26
E[Utilization ^{All} Crisis]			γ^{AII}
0.301		-	0.26

Panel B – No heterogeneity in borrowers							
Bank (Group) SRISK ^{LRMES} SRISK ^{CL} SRISK ^{Total}							
JPMORGAN CHASE & CO.	10.0	6.6	16.6				
BANK OF AMERICA CORPORATION	9.2	7.5	16.7				
WELLS FARGO & COMPANY	4.3	4.8	9.1				
MORGAN STANLEY	2.5	1.9	4.4				
GOLDMAN SACHS GROUP, INC., THE	4.1	2.7	6.8				
Тор 10	44.6	35.2	79.8				
All	54.1	41.8	95.8				

. . **NI I** . **II I**

Panel A – Estimated parameters					
E[Utilization ^{REIT} Crisis]	E[Utilization ^{Non-REIT} Crisis]	$\gamma^{\textit{REIT}}$	$\gamma^{\textit{Non-REIT}}$		
0.448	0.294	-2.35	-0.26		
E[Utilization ^{All} Crisis]			γ^{AII}		
0.301		-	-0.26		

Panel	Α-	Estimated	parameters
-------	----	-----------	------------

Bank (Group)	SRISK ^{LRMES}	SRISK ^{CL}	SRISK ^{Total}		
JPMORGAN CHASE & CO.	14.0	6.6	20.6		
BANK OF AMERICA CORPORATION	13.6	7.6	21.2		
WELLS FARGO & COMPANY	6.4	4.8	11.3		
MORGAN STANLEY	4.9	1.9	6.9		
GOLDMAN SACHS GROUP, INC., THE	5.7	2.7	8.4		
Тор 10	69.0	35.6	104.6		
All	88.9	42.4	131.3		

Panel C – Reflecting REIT vs non-REIT borrowers

Panel A – Estimated parameters						
E[Utilization ^{REIT} Crisis]	E[Utilization ^{Non-REIT} Crisis]	$\gamma^{\textit{REIT}}$	$\gamma^{Non-REIT}$			
0.448	-2.35	-0.26				
E[Utilization ^{All} Crisis]			γ^{AII}			
0.301			0.26			

Panel D – Percentage increase from considering REITs

Bank (Group)	SRISK ^{LRMES}	SRISK ^{CL}	SRISK ^{Total}
JPMORGAN CHASE & CO.	40.12%	0.06%	24.22%
BANK OF AMERICA CORPORATION	48.60%	0.82%	27.12%
WELLS FARGO & COMPANY	48.79%	0.80%	23.60%
MORGAN STANLEY	98.78%	2.37%	57.06%
GOLDMAN SACHS GROUP, INC., THE	39.96%	0.67%	24.38%
Тор 10	54.61%	1.14%	31.06%
All	64.28%	1.52%	36.94%

Why do REITs draw down on Credit Lines?

- REITs have to pay out at least 90% of income in the form of dividends (SEC regulations)
- Have very low cash buffers credit lines important source of short-term liquidity
- Local projections to estimate why REITs use credit lines

 $Y_{i,t+h} - Y_{i,t-1} = \alpha Drawdown_{i,t} + \beta Drawdown_{i,t} * Crisis_t + \alpha_t + \alpha_i + \epsilon_{i,t},$

• When REIT drawdowns increase, their investments increase, cash falls, dividends go up

	(1)	(2)	(3)	(4)	(5)
	h=0	h=1	h=2	h=3	h=4
Drawdown/ Assets	0.00836***	0.00531***	0.00444	0.00519**	0.00784***
	(0.000)	(0.006)	(0.134)	(0.021)	(0.004)
Drawdown/Assets imes Crisis	0.0162	-0.00282	0.00558	0.00324	-0.00150
	(0.554)	(0.883)	(0.659)	(0.789)	(0.876)
Constant	0.0212***	0.0411***	0.0615***	0.0802***	0.0999***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Obs.	11,418	11,039	10,711	10,461	10,098
R ²	0.079	0.113	0.144	0.165	0.203

	(1)	(2)	(3)	(4)	(5)
	h=0	h=1	h=2	h=3	h=4
Drawdown/ Assets	-0.0690***	-0.0499***	-0.0461***	-0.0477***	-0.0374***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Drawdown/Assets imes Crisis	0.161***	0.0826***	0.0455*	0.0301	0.0744***
	(0.000)	(0.001)	(0.098)	(0.294)	(0.008)
Constant	0.0124***	0.0304***	0.0465***	0.0668***	0.0883***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Obs.	12118	11753	11427	11115	10806
R ²	0.0422	0.0445	0.0580	0.0695	0.0775

Dividends

	(1)	(2)	(3)	(4)	(5)
	h=0	h=1	h=2	h=3	h=4
Drawdown/ Assets	0.00779***	0.00599***	0.00618**	0.00588**	0.00594**
	(0.003)	(0.006)	(0.025)	(0.017)	(0.014)
Drawdown/Assets × Crisis	0.00997	-0.000111	-0.00760	0.00119	-0.0124
	(0.583)	(0.995)	(0.690)	(0.958)	(0.577)
Constant	0.00730***	0.0144***	0.0200***	0.0206***	0.0171***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Obs.	10,123	9,774	9,431	9,220	8,865
R ²	0.064	0.093	0.130	0.165	0.194

- High redemption by BREIT and Sreit investors in recent months
- $\mathsf{BREIT} > 100$ bill. in assets, Sreit 25 bil. in assets
- 2022- BREIT was hit with large redemption requests. BREIT (not publicly traded) limited redemptions at 2% of (NAV) per month.
- May 2024, FT reported Sreit had used 84% of its credit line to satisfy redemptions
- More broadly, redemptions of fund shares can impact the drawdown behavior of REITs

	Δ Drawn CL Volume			
	(1)	(2)	(3)	(4)
Δ Shareholder Equity	-0.330**	-0.407**	-0.381**	-0.451**
	(0.160)	(0.178)	(0.174)	(0.198)
Controls	Ν	Ν	Ν	Y
REIT FE	Ν	Υ	Υ	Y
Year-Quarter FE	Ν	Ν	Υ	Y
Obs.	6,589	6,583	6,583	2,408
R ²	0.003	0.026	0.057	0.133

- Banks are exposed to (systemic) risks through intra-financial credit lines
- CRE crisis can impact banks through their exposure to REITs (in addition to direct bank exposure to CRE)
- This risk for large banks seems to have been ignored in recent discussions in the press and by policymakers
- This slide deck focuses on REITs, but credit lines to NBFIs can transfer risks to the banking sector more broadly (hedge funds, broker dealers, mutual/pension funds etc.)
- The links between the banking and shadow banking system need to be more tightly scrutinized for financial stability

References

Acharya, Viral V and Nada Mora, "A crisis of banks as liquidity providers," *The journal of Finance*, 2015, *70* (1), 1–43.

- _, Nicola Cetorelli, and Bruce Tuckman, "Where Do Banks End and NBFIs Begin?," NBER Working Paper, 2024.
- _, Robert Engle, Maximilian Jager, and Sascha Steffen, "Why did bank stocks crash during COVID-19?," *Review of Financial Studies*, forthcoming.

Buchak, Greg, Gregor Matvos, Tomasz Piskorski, and Amit Seru, "Fintech, regulatory arbitrage, and the rise of shadow banks," *Journal of Financial Economics*, 2018, *130* (3), 453–483.

- Cetorelli, Nicola and Saketh Prazad, "The Nonbank Footprint of Banks," Work in Progress, Federal Reserve Bank of New York, 2024.
- **Chernenko, Sergey, Isil Erel, and Robert Prilmeier**, "Why do Firms Borrow Directly From Nonbanks?," *The Review of Financial Studies*, 2022, *35* (11), 4902–4947.
- Chodorow-Reich, Gabriel, Olivier Darmouni, Stephan Luck, and Matthew Plosser, "Bank liquidity provision across the firm size distribution," *Journal of Financial Economics*, 2022, 144 (3), 908–932.

- **Cole, Rebel A and Lawrence J White**, "Déjà vu all over again: The causes of US commercial bank failures this time around," *Journal of financial services Research*, 2012, *42*, 5–29.
- Fleckenstein, Quirin, Manasa Gopal, German Gutierrez, and Sebastian Hillenbrand, "Nonbank Lending and Credit Cyclicality," *Working Paper*, 2023.
- **Gopal, Manasa and Philipp Schnabl**, "The rise of finance companies and fintech lenders in small business lending," *The Review of Financial Studies*, 2022, *35* (11), 4859–4901.
- Gupta, Arpit, Vrinda Mittal, and Stijn Van Nieuwerburgh, "Work from home and the office real estate apocalypse," *Working Paper, NYU Stern School of Business*, 2022.

- **Ippolito, Filippo, José-Luis Peydró, Andrea Polo, and Enrico Sette**, "Double bank runs and liquidity risk management," *Journal of Financial Economics*, 2016, *122* (1), 135–154.
- Jiang, Erica Xuewei, Gregor Matvos, Tomasz Piskorski, and Amit Seru, "Monetary Tightening, Commercial Real Estate Distress, and US Bank Fragility," *Working Paper, National Bureau of Economic Research*, 2023.
- **Kapan, Tumer and Camelia Minoiu**, "Liquidity insurance vs. credit provision: Evidence from the COVID-19 crisis," *Working Paper*, 2021.