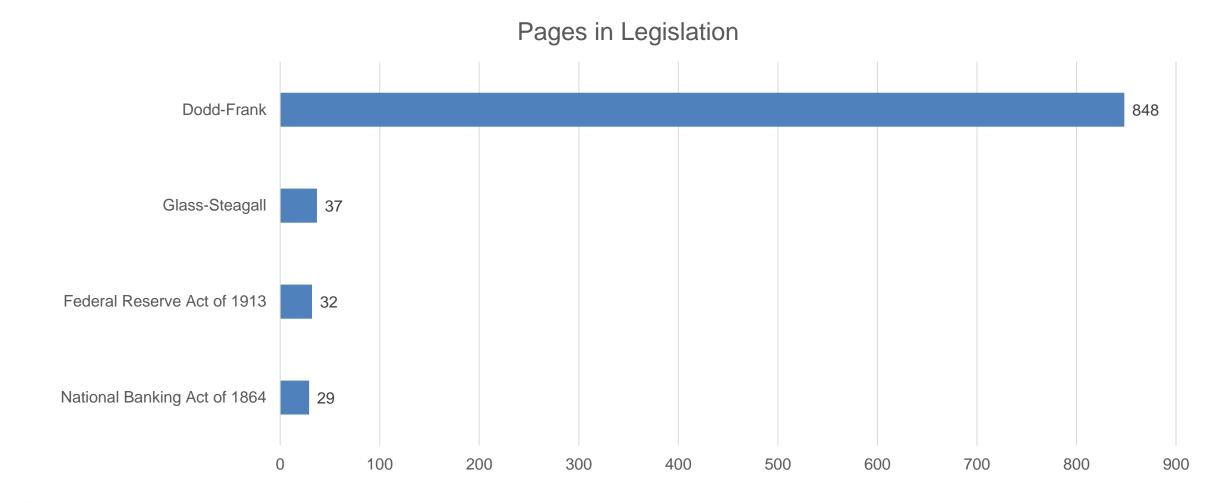
The Impact of Risk Retention Regulation on the Underwriting of Securitized Mortgages

Craig Furfine September 2018



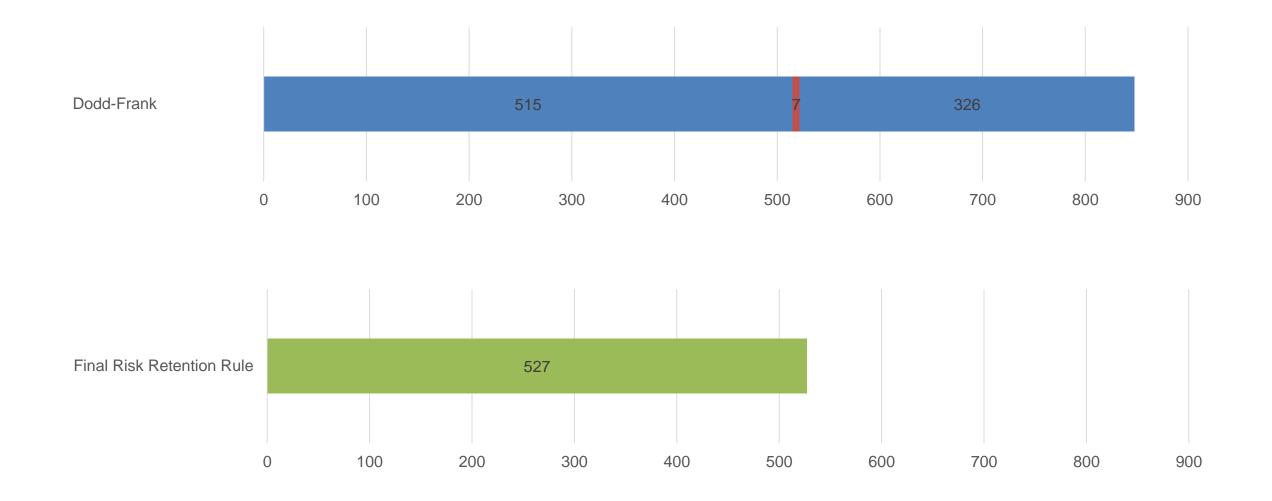


- "To promote the financial stability of the United States by improving accountability and transparency in the financial system, to end "too big to fail", to protect the American taxpayer by ending bailouts, to protect consumers from abusive financial services practices, and for other purposes."
 - Dodd-Frank Wall Street Reform and Consumer Protection Act, July 2010



 "Laws classically provide people with rules. Dodd-Frank is not directed at people. It is an outline directed at bureaucrats and it instructs them to make still more regulations and to create more bureaucracies." Jonathan Macey, Yale Law School as quoted in the Economist. February 2012.

- "Collapsing mortgage-lending standards and the mortgage securitization pipeline lit and spread the flame of contagion and crisis."
 - Financial Crisis Inquiry Commission Report on the Causes of the Financial Crisis 2011



Risk retention timeline

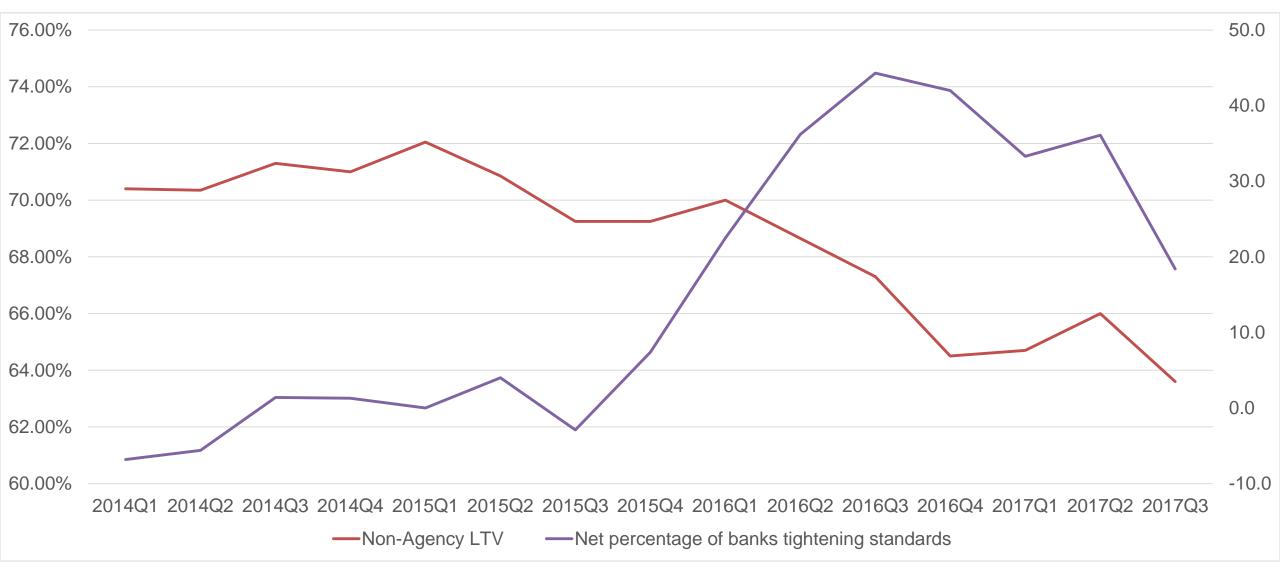


- "Dodd-Frank ... prescribe(s) regulations that (i) require a securitizer to retain not less than 5 percent of the credit risk of any asset that the securitizer, through the issuance of an asset-backed security (ABS), transfers, sells, or conveys to a third party, and (ii) prohibit(s) a securitizer from directly or indirectly hedging or otherwise transferring the credit risk that the securitizer is required to retain"
- "By requiring that a securitizer retain a portion of the credit risk of the securitized assets, the requirements ... provide securitizers an incentive to monitor and ensure the quality of the securitized assets underlying a securitization transaction, and, thus, help align the interests of the securitizer with the interests of the investors."
 12 CFR Part 43 2014

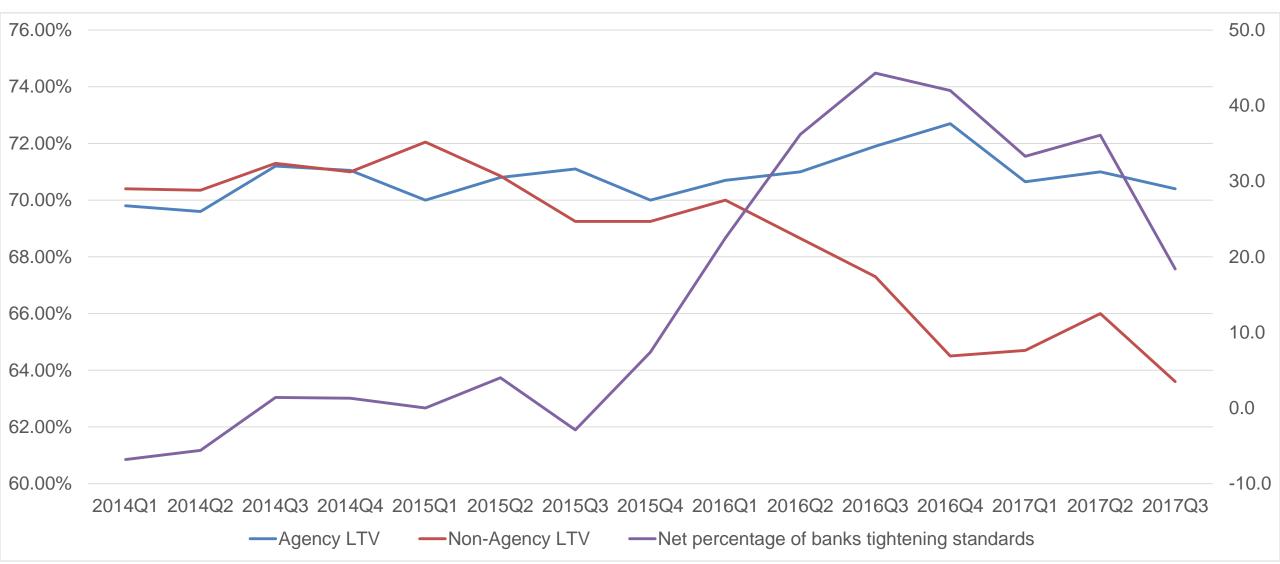
Research questions

- Did the implementation of risk-retention requirements impact the underwriting of securitized commercial mortgages?
- Were requirements binding?
- Are loans now safer?

Suggestive evidence



Suggestive evidence



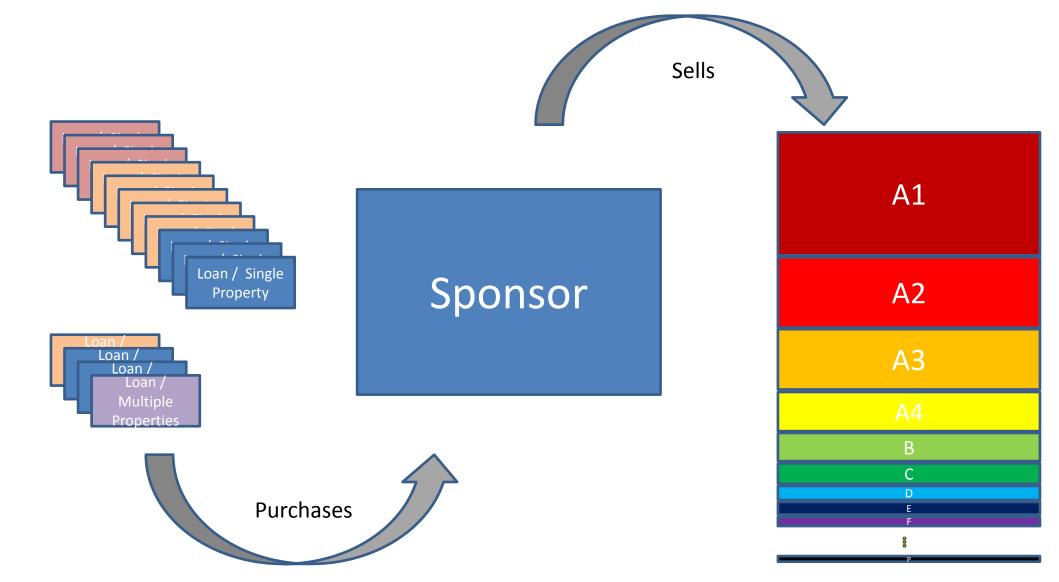
Preview of findings

- Commercial mortgages securitized after risk-retention rules were implemented had
 - Higher interest rates
 - Lower loan-to-value (LTV) ratios
 - Higher debt service coverage (DSCR) ratios
- Risk-retention requirements were binding
 - Retention levels have tripled
 - Securitizers rushed before the implementation date
- Loans appear safer
 - Controlling for observable characteristics of each loan, mortgages subject to riskretention have become non-performing less often.

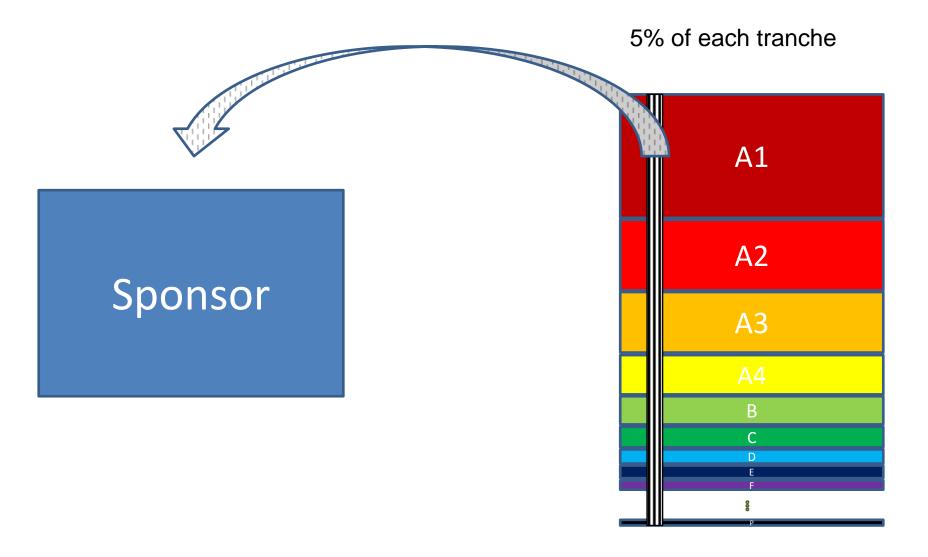
Outline

- Risk retention
- Data
- Evidence regarding underwriting changes
- Evidence on securitization changes
- Evidence on performance

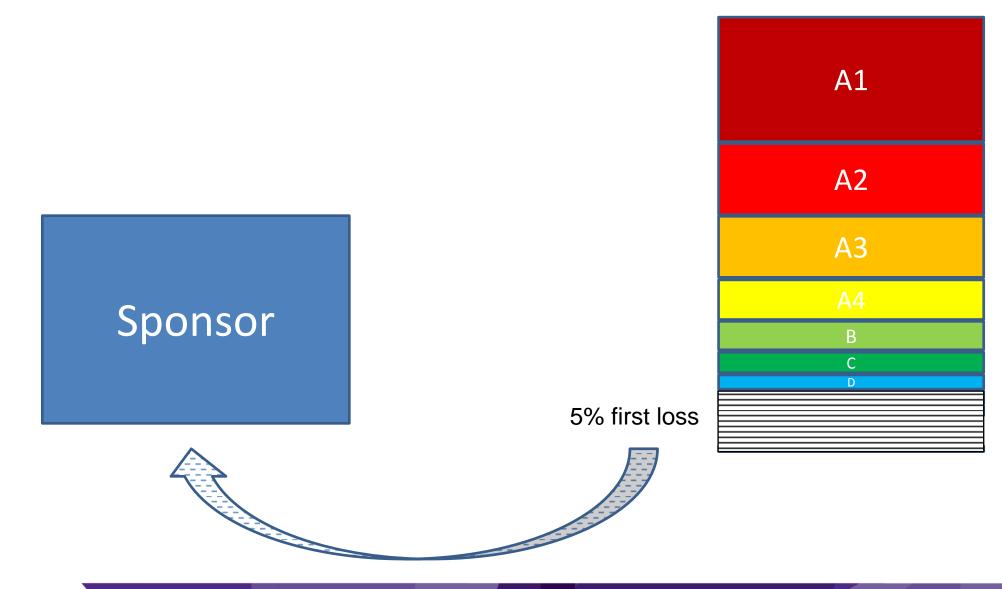
Commercial Mortgage Backed Securities (CMBS)



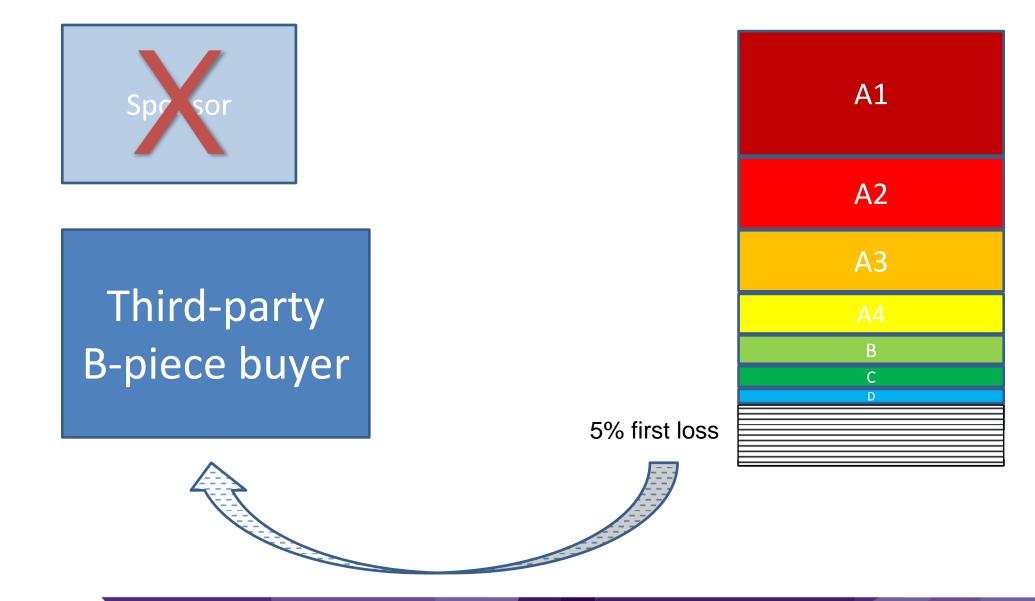
Vertical (V) risk-retention



Horizontal (H) risk-retention

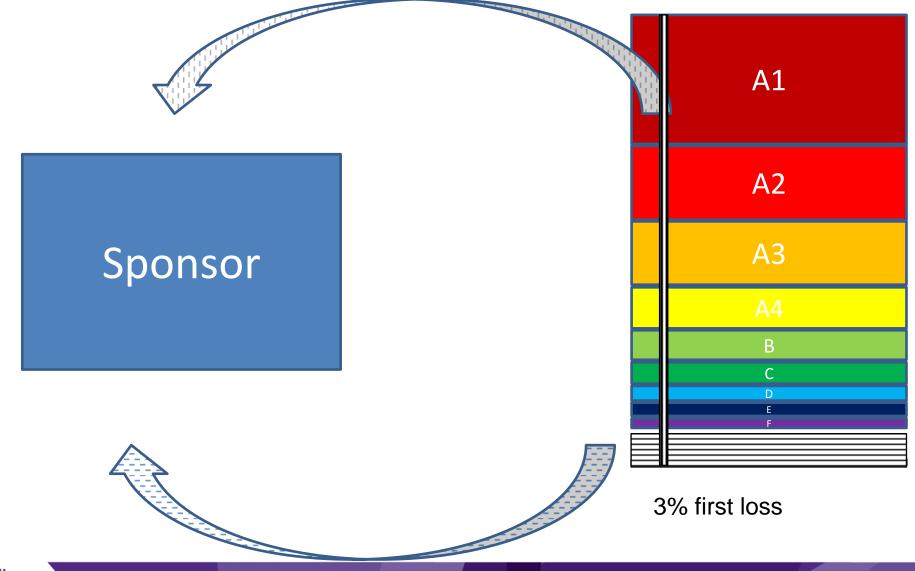


CMBS Horizontal (H) risk-retention



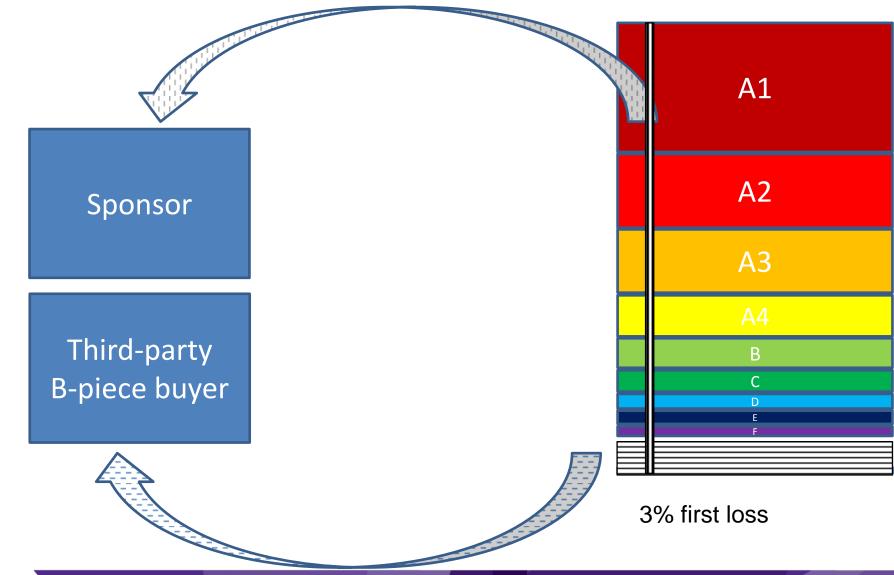
L-shaped (L) risk-retention





CMBS L-shaped (L) risk-retention

2% of each tranche



Risk retention exemptions

- Government sponsored enterprises
 - Full guarantee (for timely principal and interest) by the Enterprises while they operate under the conservatorship or receivership of FHFA with capital support from the United States (satisfies) the risk retention requirements.
- Qualifying Commercial Real Estate loans
 - Minimum DSCR
 - Fixed rate
 - Maximum amortization
 - Minimum term
 - Maximum LTV/CLTV



- Complete set of multi-borrower Commercial Mortgage Backed Securities that settled between January 1, 2014 and March 31, 2018.
 - 844 Agency
 - 301 Non-agency
- Prospectus supplements
 - Size, originator, interest rate, LTV, DSCR, collateral location and type, amortization, etc.

Data

- Dropped loan observations where ...
 - Interest rate not observable
 - Loans secured by multiple properties
 - Loans secured by properties outside of the United States
 - More than 18 months between origination and securitization
- Final sample of 62,155 loans
 - 49,319 Agency
 - 12,836 Non-agency

TABLE 1: SUMMARY STATISTICS ON THE COMPLETE LOAN SAMPLE

	10th percentile	Median	90th percentile Panel A: Full Sa	Mean mple	SD	Count		
	Agency Loans							
Loan Size (in millions)	1.192	6.59	27.942	11.714	15.384	49319		
Interest rate	3.18	3.91	4.73	3.936	0.631	49319		
LTV	0.554	0.706	0.793	0.686	0.102	24857		
DSCR	1.275	1.46	2.145	1.614	0.472	24457		
	Non-Agency Loans							
Loan Size (in millions)	2.513	8.35	50	30.296	107.637	12836		
Interest rate	4.077	4.655	5.32	4.681	0.538	12836		
LTV	0.513	0.668	0.746	0.643	0.103	12314		
DSCR	1.37	1.68	2.48	1.855	0.611	12206		
	All Loans							
Loan Size (in millions)	1.351	7	30.253	15.552	51.35	62155		
Interest rate	3.25	4.074	4.94	4.09	0.683	62155		
LTV	0.542	0.695	0.783	0.672	0.104	37171		
DSCR	1.29	1.53	2.274	1.694	0.535	36663		

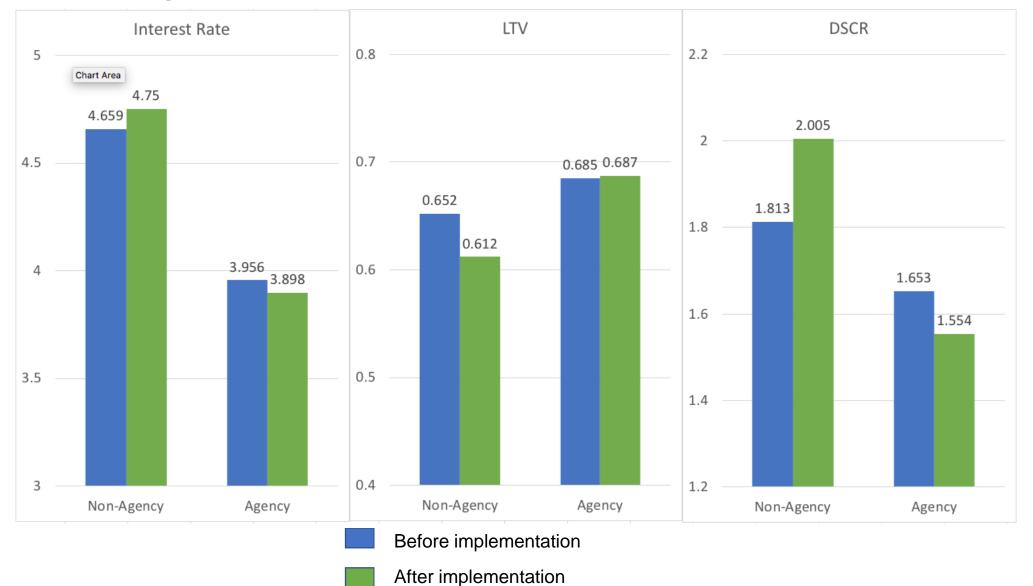
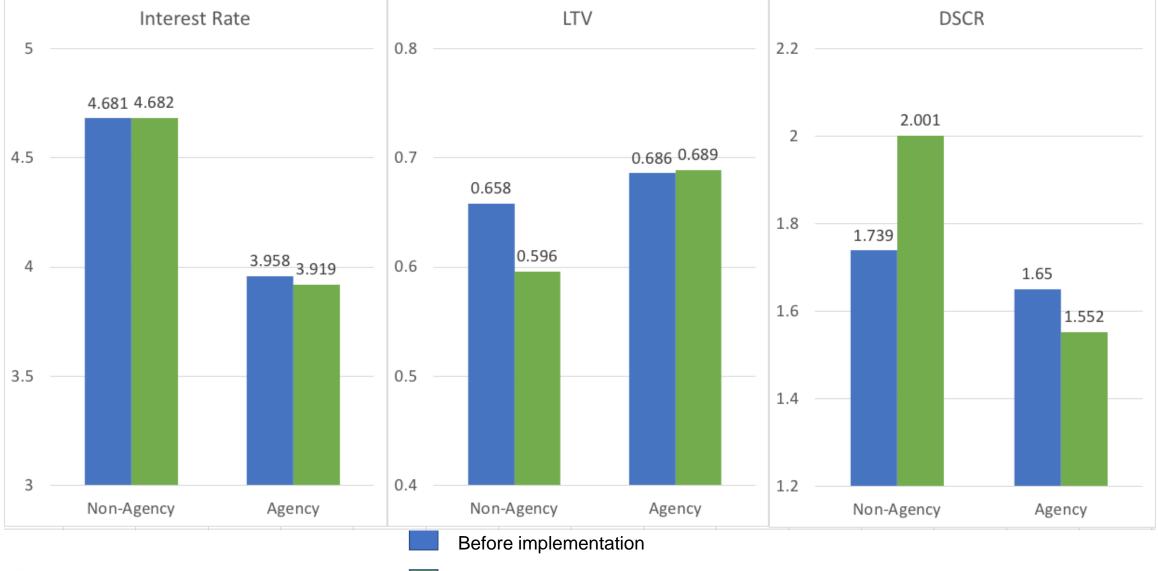


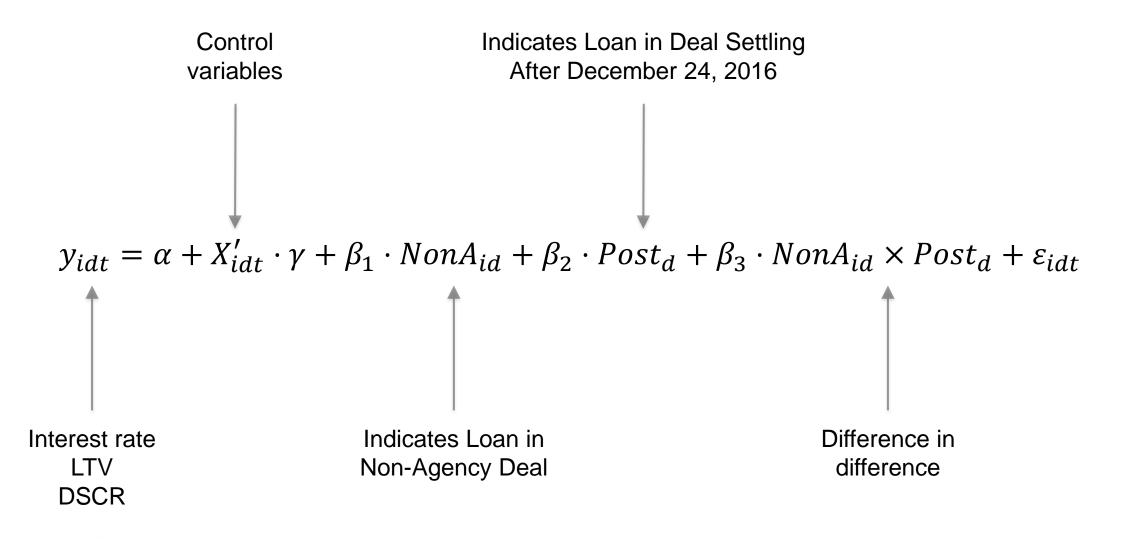
TABLE 3: SUMMARY STATISTICS ON THE MULTIFAMILY LOAN SAMPLE

	10th percentile	Median	90th percentile Panel A: Full Sa	Mean mple	SD	Count		
	Agency Loans							
Loan Size (in millions)	1.2	6.625	29.35	12.129	15.997	43079		
Interest rate	3.15	3.93	4.75	3.944	0.646	43079		
LTV	0.556	0.708	0.793	0.687	0.102	23880		
DSCR	1.273	1.457	2.144	1.611	0.472	23485		
	Non-Agency Loans							
Loan Size (in millions)	1.5	6.225	24.25	11.203	17.702	2661		
Interest rate	3.949	4.64	5.5	4.681	0.616	2661		
LTV	0.482	0.696	0.75	0.648	0.139	2199		
DSCR	1.31	1.55	2.32	1.779	0.77	2185		
	All Loans							
Loan Size (in millions)	1.225	6.599	28.978	12.076	16.102	45740		
Interest rate	3.18	3.96	4.81	3.987	0.667	45740		
LTV	0.55	0.706	0.792	0.684	0.106	26079		
DSCR	1.276	1.463	2.165	1.625	0.507	25670		



After implementation

Empirical specification



Evidence regarding underwriting changes

TABLE 4: RISK RETENTION DIFFERENCE IN DIFFERENCE SPECIFICATIONS (ALL LOANS)

VARIABLES	Interest rate	Interest rate	Interest rate	Interest rate	LTV	DSCR
Non-Agency Loan	0.703***	0.676***	0.131	0.383*	0.207***	-1.428***
	(0.0303)	(0.0219)	(0.208)	(0.200)	(0.0272)	(0.182)
Deal Settled After 24Dec2016	-0.0581	-0.0324	-0.00944	0.231***	-0.00766	-0.0865***
	(0.0376)	(0.0384)	(0.0353)	(0.0317)	(0.00499)	(0.0288)
Non-Agency x Deal Settled After 24Dec2016	0.149***	0.267***	0.294***	0.373***	-0.0307***	0.232***
	(0.0465)	(0.0480)	(0.0397)	(0.0351)	(0.00442)	(0.0287)
Observations	62,155	62,155	62,155	62,155	37,922	$37,\!424$
R-squared	0.197	0.250	0.393	0.435	0.275	0.193

Robust standard errors (clustered by both origination month and originator) in parentheses. *** p<0.01, ** p<0.05, * p<0.1

Column 2 adds interest rate controls. Column 3 adds loan size and amortization controls as well as fixed effects for Originator, Property Type, and Location. Columns 4-6 also include fixed effects for month of origination.

- Originator knows whether or not the loan being made will be securitized in an Agency or Non-Agency deal.
- Originator knows whether or not the loan being made will be securitized before or after December 24, 2016.

• Originator knows whether or not the loan being made will be securitized in an Agency or Non-Agency deal.

	Non-Agency Loans	Agency Loans
Health Care	0	5521
Full Service Hotels	616	0
Limited Service Hotels	1115	0
Industrial	580	0
Mixed Use	672	15
Mobile Home Parks	446	699
Multifamily Housing	2662	43084
Office	2084	0
Other	116	0
Anchored Retail	2312	0
Unanchored Retail	1453	0
Self Storage	858	0
Warehouse	14	0
Total	12928	49324

 Originator knows whether or not the loan being made will be securitized in an Agency or Non-Agency deal.

Originator	Agency	Non-Agency	Total
Arbor	$1,\!396$	1	$1,\!397$
Bank of America, NA	29	634	663
Berkadia Commercial	$2,\!429$	0	$2,\!429$
Berkeley Point Capi	$1,\!048$	0	$1,\!048$
CBRE Capital Markets	$3,\!349$	0	$3,\!349$
CCRE	0	712	712
Capital One Multifa	857	0	857
Citigroup Inc.	97	634	731
Goldman Sachs	0	515	515
Grandbridge Real Es	573	0	573
Greystone Servicing	$1,\!417$	1	1,418
Holliday Fenoglio F	$1,\!174$	0	$1,\!174$
Hunt Mortgage	500	10	510
JPMorgan Chase & Co.	18	548	566
KeyBank NA	$1,\!342$	248	$1,\!590$
Ladder Capital Fina	0	558	558
Morgan Stanley Mort	0	509	509
NorthMarq Capital	$1,\!074$	0	$1,\!074$
PNC	545	0	545
Red Mortgage Capita	$2,\!062$	0	$2,\!062$
Rialto Mortgage Fin	0	616	616
Starwood Property M	0	545	545
Walker & Dunlop	$2,\!213$	29	$2,\!242$
Wells Fargo Bank, NA	$1,\!164$	$1,\!148$	$2,\!312$

 Originator knows whether or not the loan being made will be securitized in an Agency or Non-Agency deal.

Originator	Agency	Non-Agency	Total
Arbor	$1,\!391$	1	$1,\!392$
Bank of America, NA	29	122	151
Berkadia Commercial	$2,\!351$	0	$2,\!351$
Berkeley Point Capi	$1,\!031$	0	$1,\!031$
CBRE Capital Markets	$3,\!298$	0	$3,\!298$
CCRE	0	105	105
Capital One Multifa	808	0	808
Citigroup Inc.	97	87	184
Goldman Sachs	0	69	69
Grandbridge Real Es	509	0	509
Greystone Servicing	$1,\!403$	0	$1,\!403$
Holliday Fenoglio F	$1,\!137$	0	$1,\!137$
Hunt Mortgage	495	5	500
JPMorgan Chase & Co.	18	98	116
KeyBank NA	940	31	971
Ladder Capital Fina	0	75	75
Morgan Stanley Mort	0	92	92
NorthMarq Capital	$1,\!059$	0	$1,\!059$
PNC	485	0	485
Red Mortgage Capita	$1,\!730$	0	$1,\!730$
Rialto Mortgage Fin	0	143	143
Starwood Property M	0	54	54
Walker & Dunlop	$2,\!126$	9	$2,\!135$
Wells Fargo Bank, NA	949	94	$1,\!043$

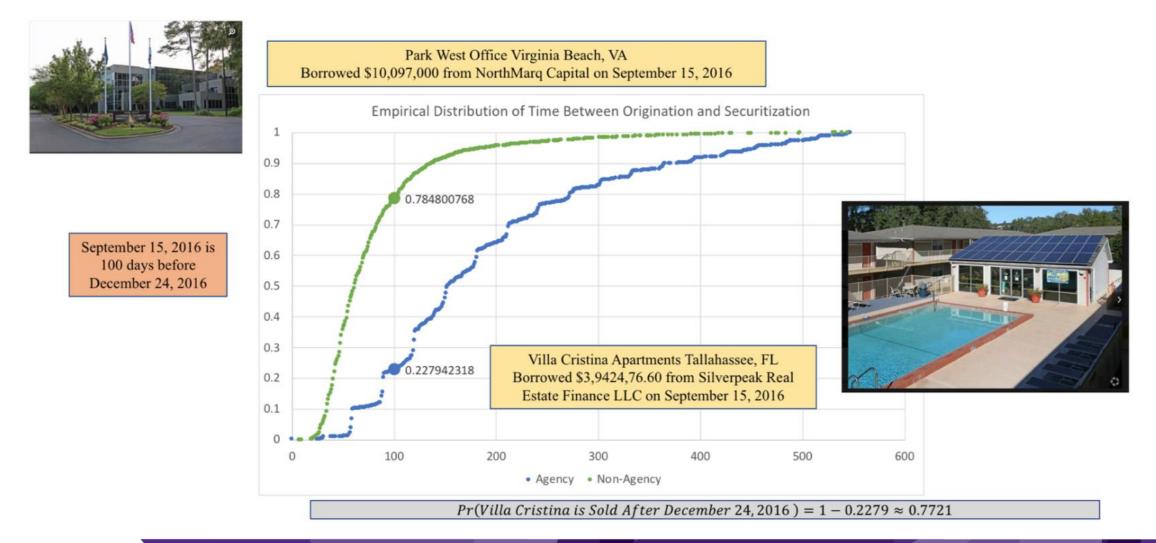
• Originator knows whether or not the loan being made will be securitized before or after December 24, 2016.

 $y_{idt} = \alpha + X'_{idt} \cdot \gamma + \beta_1 \cdot NonA_{id} + \beta_2 \cdot \Pr(Post_d) + \beta_3 \cdot NonA_{id} \times \Pr(Post_d) + \varepsilon_{idt},$

Estimated Probability that Loan will be placed in Deal Settling After December 24, 2016 (2)

Estimating securitization timing

 $Pr(ParkWest is Sold After December 24, 2016) = 1 - Pr(PW Sold Within 100 days) = 1 - 0.7848 \approx .2152$



Evidence regarding underwriting changes

TABLE 5: RISK RETENTION D-I-D SPECIFICATIONS WITH FORECASTED PROBABILTIES OF SETTLEMENT TIMING

	ALL LOANS			MULTIFAMILY LOANS		
VARIABLES	Interest rate	LTV	DSCR	Interest rate	LTV	DSCR
Non-Agency Loan	0.381*	0.211***	-1.413***	-0.802**	-0.0933*	0.968***
	(0.201)	(0.0272)	(0.181)	(0.400)	(0.0560)	(0.362)
Probability Deal Settles After 24Dec2016	-0.472^{***}	0.0215	-0.121*	-0.401**	-0.0340	-0.0170
	(0.106)	(0.0132)	(0.0733)	(0.198)	(0.0254)	(0.141)
Non-Agency x Probability Deal Settles After 24Dec2016	0.470***	-0.0363***	0.259^{***}	0.279***	-0.0415***	0.354^{***}
	(0.0368)	(0.00464)	(0.0302)	(0.0775)	(0.00896)	(0.0685)
Observations	62,155	37,922	37,424	45,740	26,772	26,396
R-squared	0.433	0.275	0.194	0.327	0.294	0.182

Robust standard errors (clustered by both origination month and originator) in parentheses. *** p<0.01, ** p<0.05, * p<0.1

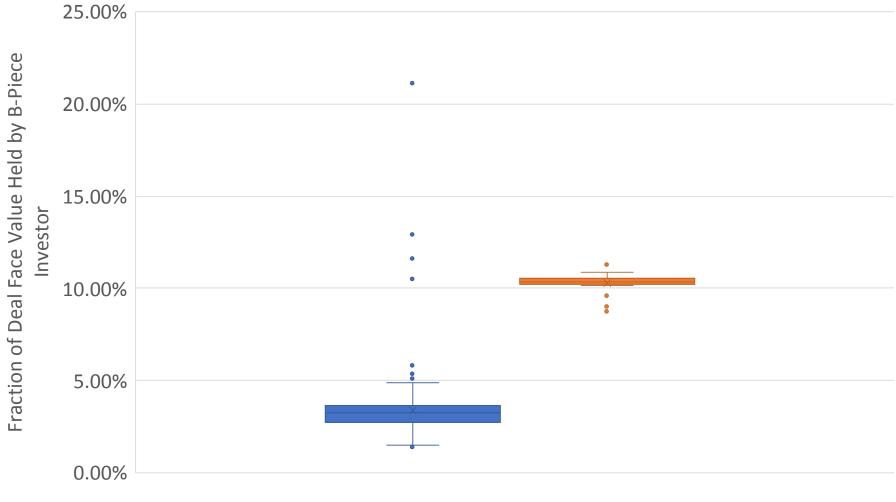
All specifications include interest rate controls, loan size and amortization controls as well as fixed effects for Originator, Property Type (Columns 1-3 only), Location, and month of origination.

F*

Evidence on securitization changes

- Size and informativeness of retained tranches
- Rushing to securitize before implementation

Risk retention is a binding constraint

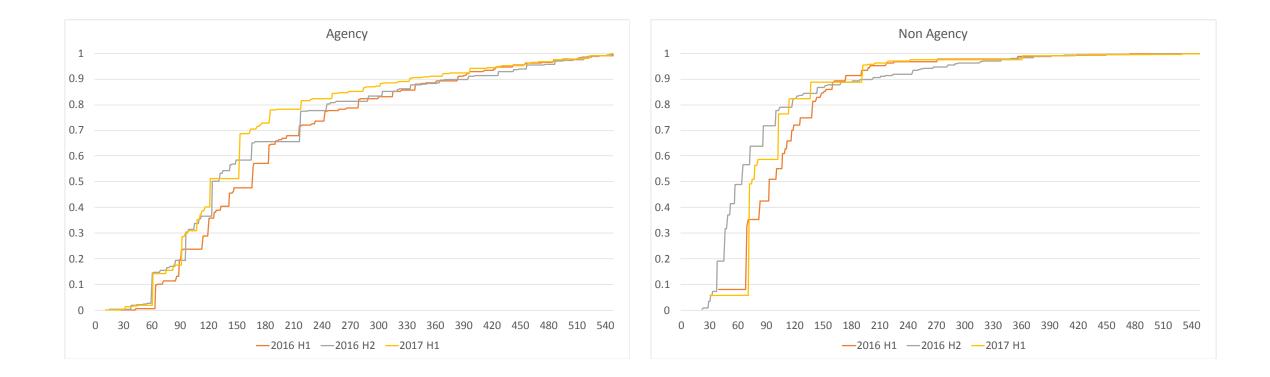


B-Piece Size 2004-2007 Horizontal Risk Retention

Risk retention is less informative

VARIABLES	B-Piece Size 2005-2007	Horizontal Risk Retention Since December 2016			
Pool LTV	0.000995***	-0.000969			
	(0.000337)	(0.000737)			
Pool Interest Rate Spread over Treasuries	0.0143***	-0.00593			
	(0.00301)	(0.00556)			
Pool Debt Service Coverage Ratio	0.00566	-0.00168			
	(0.00477)	(0.00706)			
Constant	-0.0602*	0.177***			
	(0.0306)	(0.0586)			
Observations	234	24			
R-squared	0.418	0.393			
Robust standard errors in parentheses					
*** p<0.01, ** p<0.05, * p<0.1					

Lenders hurried to beat deadline



Evidence on ex-post performance

		Multifamily		
	All Loans	Loans		
VARIABLES	Loan is non-per	forming/watchlist		
Loan interest rate	0.00481	0.00261		
	(0.00355)	(0.00315)		
Loan LTV	0.0295	0.0271		
	(0.0202)	(0.0202)		
Loan DSCR	-0.00512	-0.00730*		
	(0.00402)	(0.00436)		
Non-Agency Loan	0.0717	0.0857		
	(0.0490)	(0.0638)		
Deal Settled After 24Dec2016	-0.00494	-0.0188		
	(0.0273)	(0.0489)		
Non-Agency x Deal Settled After 24Dec2016	-0.0482***	-0.0415***		
	(0.0107)	(0.0158)		
Observations	$34,\!964$	24,079		
Pseudo R-squared	0.0986	0.1097		
Analysis also includes fixed effects for origination month, origination (State) of the collateral property.	ginator, property type (firs	st column),		

Robust standard errors (clustered by both origination month and originator) in parentheses.

*** p<0.01, ** p<0.05, * p<0.1

Review of findings

- Evidence consistent with originators charging more and being less generous with LTVs and DSCRs post riskretention.
- Effects are economically large.
- Risk retention was a binding constraint.
- Securitizers rushed in the months before implementation.
- Loans subject to risk retention have been less likely to become non-performing.

The impact of risk-retention regulation on commercial mortgage underwriting

Craig Furfine September 2018



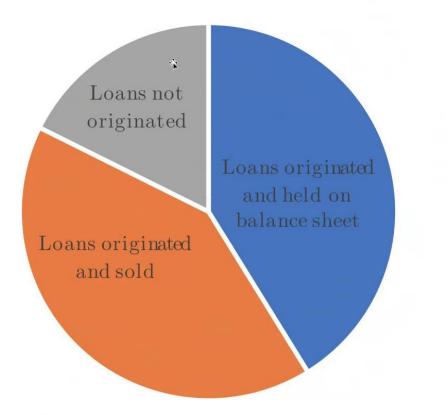


Related literatures

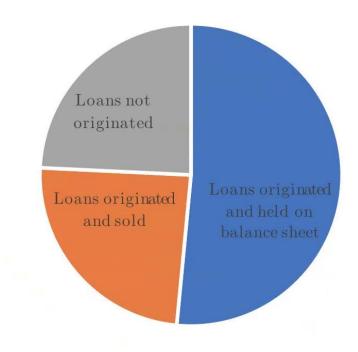
- Skin in the game and securitization
 - Begley and Purnanandam (2017), Guo and Wu (2014), Pagès (2013), Demiroglu and James (2012), DeMarzo (2005), DeMarzo and Duffie (1999), Riddiough (1997), Leland and Pyle (1977)
- The effectiveness of crisis-era government programs
 - DeFusco, Johnson, and Mondragon (2017), Eberly and Krishnamurthy (2014), Zhang et al. (2013), Agarwal et al. (2011), ...

Impact of risk retention regulation

Before risk retention



After risk retention



Northwestern | Kellogg

Additional specifications

- Originators who are sponsors
- Type of originator
- Shape of risk retention

Results – Originator who is a sponsor

TABLE 6: RISK RETENTION – IS THE ORIGINATOR THE DEAL SPONSOR?

	ALL LOANS			MULTIFAMILY LOANS			
VARIABLES	Interest rate	LTV	DSCR	Interest rate	LTV	DSCR	
Non-Agency x Probability Deal Settles After $24Dec2016$	0.424^{***} (0.114)	-0.0217^{*} (0.0130)	0.410^{***} (0.0724)	0.278 (0.180)	-0.000298 (0.0184)	0.412^{***} (0.0951)	
Non-Agency x Probability Deal Settles After 24Dec2016	, ,						
x Originated by Deal Sponsor	0.0657	-0.0174	-0.152**	0.0198	-0.0456**	-0.0948	
	(0.117)	(0.0132)	(0.0729)	(0.192)	(0.0194)	(0.107)	
Observations	62,155	37,922	37,424	45,740	26,772	26,396	
R-squared	0.432	0.270	0.188	0.327	0.295	0.183	

+

Robust standard errors (clustered by both origination month and originator) in parentheses. *** p<0.01, ** p<0.05, * p<0.1

All specifications include interest rate controls, loan size and amortization controls as well as fixed effects for Originator, Property Type (Columns 1-3 only), Location, and month of origination.

Results – Originator type

TABLE 7: RISK RETENTION – VARIATION ACROSS LENDER TYPE

+

	ALL LOANS			MULTIFAMILY LOANS			
VARIABLES	Interest rate	LTV	DSCR	Interest rate	LTV	DSCR	
Non-Agency x Probability Deal Settles After 24Dec2016	0.340***	-0.0296***	0.150***	-0.235**	-0.0302***	0.163**	
	(0.0490)	(0.00729)	(0.0408)	(0.0956)	(0.0114)	(0.0783)	
Non-Agency x Probability Deal Settles After 24Dec2016							
x Originated by Bank	0.109	-0.0126	0.159^{***}	0.439***	-0.0225	0.384^{***}	
	(0.0745)	(0.00973)	(0.0532)	(0.133)	(0.0179)	(0.127)	
Non-Agency x Probability Deal Settles After 24Dec2016							
x Originated by REIT	0.304^{***}	-0.00867	-0.0176	0.901***	-0.00634	0.0151	
	(0.0912)	(0.0128)	(0.0577)	(0.139)	(0.0181)	(0.101)	
Observations	62,155	37,922	37,424	45,740	26,772	26,396	
R-squared	0.438	0.275	0.195	0.337	0.295	0.187	

Robust standard errors (clustered by both origination month and originator) in parentheses. *** p<0.01, ** p<0.05, * p<0.1

All specifications include interest rate controls, loan size and amortization controls as well as fixed effects for Originator, Property Type (Columns 1-3 only), Location, and month of origination.

Results – Shape of risk retention

+‡+

TABLE 8: RISK RETENTION – VARIATION ACROSS FORMS OF RETENTION

	ALL LOANS			MULTIFAMILY LOANS			
VARIABLES	Interest rate	LTV	DSCR	Interest rate	LTV	DSCR	
Non-Agency x Probability Deal Settles After 24Dec2016	0.520***	-0.0258***	0.237***	0.322***	-0.0279**	0.285***	
	(0.0451)	(0.00570)	(0.0381)	(0.0903)	(0.0123)	(0.108)	
Non-Agency x Probability Deal Settles After 24Dec2016							
x Horizontal Risk Retention	-0.0434	-0.00438	-0.0260	-0.454*	0.00120	0.315	
	(0.153)	(0.0152)	(0.106)	(0.259)	(0.0358)	(0.217)	
Non-Agency x Probability Deal Settles After 24Dec2016							
x Vertical Risk Retention	0.0106	-0.0384	0.217	-0.431	-0.0262	0.663**	
	(0.125)	(0.0235)	(0.163)	(0.280)	(0.0667)	(0.292)	
Observations	62,155	37,922	37,424	45,740	26,772	26,396	
R-squared	0.434	0.275	0.194	0.328	0.294	0.183	

Robust standard errors (clustered by both origination month and originator) in parentheses. *** p<0.01, ** p<0.05, * p<0.1

All specifications include interest rate controls, loan size and amortization controls as well as fixed effects for Originator, Property Type (Columns 1-3 only), Location, and month of origination.

Suggestive evidence

