

A Close Look at Loan-To-Value Ratios in Japan: Evidence from Real Estate Registries

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BACKGROUND AND MOTIVATION

Background and Motivation

- ✘ Recent **financial crisis** witnesses:
 - + **Credit booms/busts** often accompanied by **surges in real estate prices**
 - + \leftrightarrow “**excessive risk taking** by banks”
 - ✘ **loans secured by real estate** underwritten based on **lax lending standards**
- ✘ A measure of risk-taking: **Loan-to-value (LTV) ratios**
 - + = (amount of a loan) / (value of assets pledged as collateral)
 - ✘ represent lenders’ **risk exposure**
 - ✘ decrease in V by 1-LTV percent \rightarrow debtor is in negative equity \rightarrow lender may suffer from losses (given default)

Background and Motivation

- ✘ LTV ratios are important in **shock amplification mechanism** within an economy
 - + IMF (2011) and Almeida, Campello, and Liu (2006)
 - ✘ Effects of income shocks on house prices and/or mortgage borrowings are larger in countries/periods where the LTV ratios are higher
 - + → strong *financial accelerator* mechanism positively associated with high LTV ratio

Background and Motivation

- ✘ Discussion on **macroprudential policy**
 - + to construct the effective framework to
 - ✘ ... deal with banks' excessive risk-taking through secured loans
 - ✘ ... curb the amplification of external shock within market /economy
- ✘ One prospective measure
 - + restriction (**cap**) on **LTV** ratio (e.g., FSB 2012)
 - ✘ Already applied in a number of countries to tame real estate booms and busts
 - ✘ Example) Hong Kong and Korea (hard limit), U.S., U.K. and Germany (soft limit (BIS risk weight))
 - ✘ But mostly for **residential loans**
 - ✘ Japan: No restriction

Background and Motivation

- ✘ Our focus: LTV ratios for **business loans**
 - + LTV for business loans also important
 - ✘ Taking real estate as collateral is a common practice
 - ★ “**fixed-asset lending**” as one of the lending technologies (Berger and Udell 2002)
 - ✘ Japan’s experience during its **bubble** period (late 1980s – early 1990s)
 - ★ **Conventional wisdom**
 - ✘ Banks’ excessive risk-taking through higher LTV ratio loans
 - ✘ lax lending standards **in anticipation of further surges in real estate prices**
 - ✘ → credit bubbles and the bad loans problems
 - + “Caps on the LTV ratio could have curbed banks’ excessive risk-taking?”

Background and Motivation

✘ Sparse empirical evidence on the LTV ratio using micro-data

+ → validity of the conventional wisdom unclear:

1. whether the LTV ratio procyclical
2. what determines the ratio?
3. whether high LTV borrowers perform poorly?

+ → also, no evidence to judge:

✘ whether we should impose caps on LTV ratios

✘ Do the caps constrain risky loans only?

→ Important to answer the questions above

THIS PAPER

Aim of this paper

- ✘ **Aim of the paper:** answer these questions by showing various facts of the LTV ratios
 - + We examine
 1. the **evolution** of loan-to-value (LTV) ratios,
 2. their **determinants**, and
 3. the **ex post performance** of the borrowers by LTV ratios
 - + Using unique data
 - ✘ nearly 400,000 LTV ratios from 1975 to 2009
 - ✘ Source: real estate registry info compiled by the Teikoku Databank (TDB)
 - ★ the largest credit information provider in Japan

LTV definition

- ✘ LTV ratios = L/V (443,379 obs.)
 - + **L**: loan amount (extended or committed)
 - ✘ Available in the TDB database
 - + **V**: value of land pledged
 - ✘ Lands pledged identified in the TDB database
 - ✘ $V = \text{its acreage} * \text{estimated price}$ (hedonic approach: [Appendix A](#))
- ✘ Other information (to link with LTV)
 - + Basic **borrower characteristics** (for 288,472 obs. (in 1981-2009))
 - ✘ e.g., # of employees, industry, location, and identity of mortgagees (lenders)
 - + **Borrower financial statement** information (for 73,454 obs.)
 - + **Lender financial variables** (for a further subset of the sample)
 - ✘ For ordinary banks, Shinkin banks

Data

✘ Data restrictions

+ In return for the rich information, the data have limitation

✘ Due to the data collection by TDB's credit research

1. Sample firms mostly small and medium-sized enterprises (**SMEs**)

2. **Limited coverage**

✘ Not cover the entire registration (but sufficient coverage)

3. **Mortgages registered in 1975-2009** but **existed** in database as of **2008-2010**

✘ 1975-2007 registration = those survived until 2008 on

✘ → Concern for **survival bias**

✘ → **Control** for firm- and loan-characteristics

Our analysis

✘ Threefold analyses

1. the **evolution** of loan-to-value (LTV) ratios ([sec. 3.1](#))
2. their **determinants** ([sec. 3.2, 3.3](#))
3. the **ex post performance** of the borrowers by LTV ([sec. 4](#))

✘ Findings

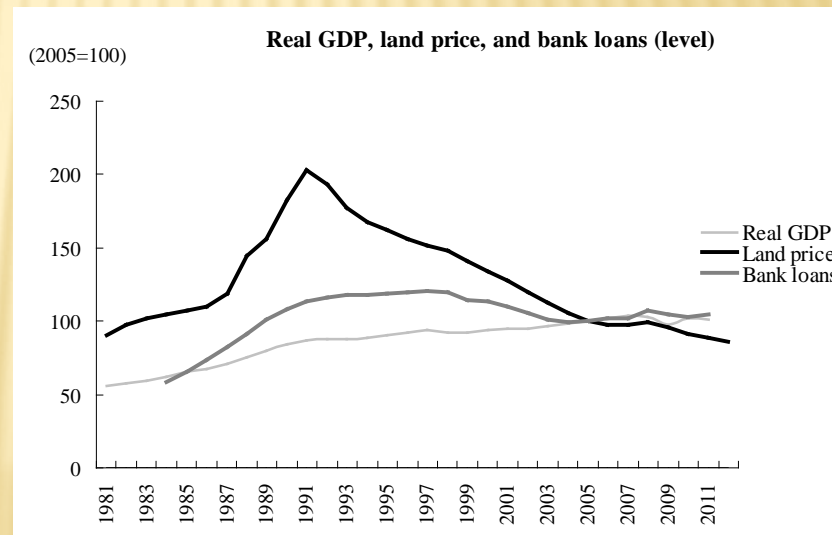
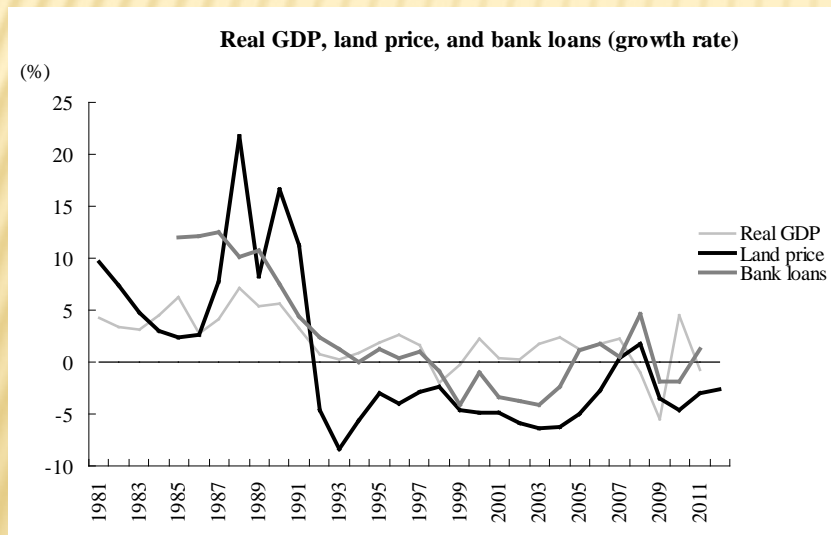
1. LTV ratio exhibits **counter-cyclicality**
2. LTV ratios **associated** with many **loan-, borrower- and lender-characteristics**
3. **No worse ex post performance** for **high** LTV firms

RESULT 1

EVOLUTION OF LTV (SEC. 3.1)

Background information

- ✘ Business cycle and the land price evolution in Japan
 - + **Figure 2 (aggregate data)**: real GDP, the average land price, bank loans and the business conditions index
 - + Confirm: **surges** during the **bubble** (late 1980s and early 1990s)

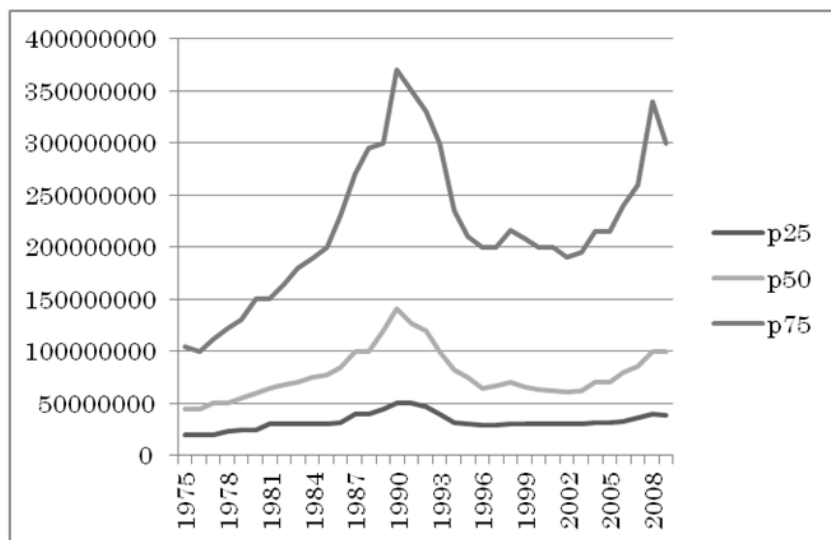


Evolution of L and V

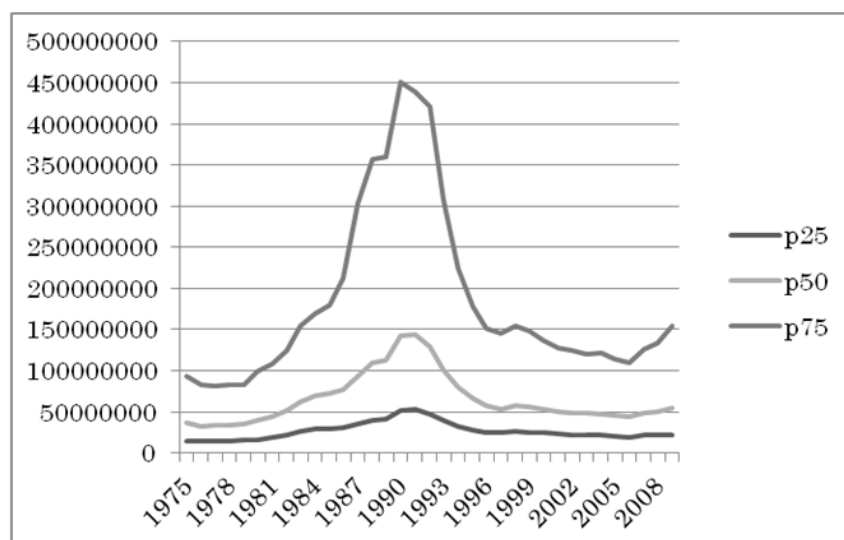
- ✦ Figure 3: 25, 50, and 75 percentile of L and V through the business cycle (our micro data: for individual loans)
 - + Finding: Both L and V fluctuate in a *pro-cyclical* manner

Figure 3 Loans and values over the business cycle

(A) Amount of Loans (L)



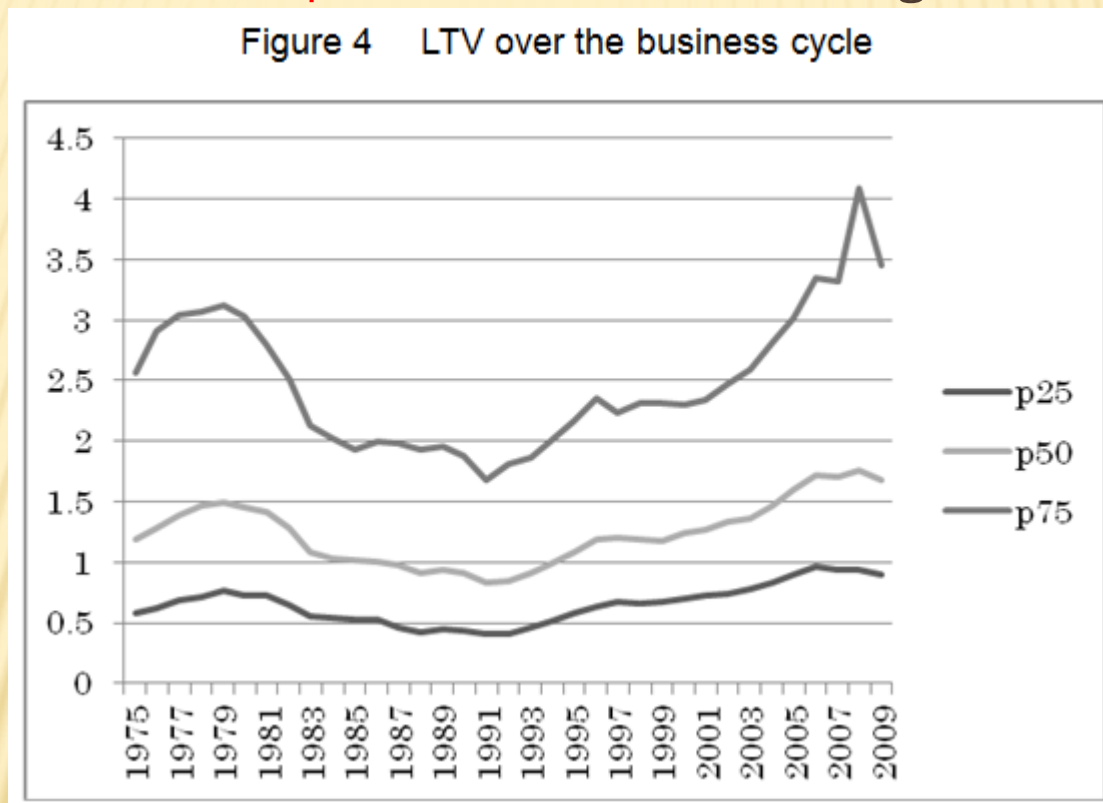
(B) Values of Land (V)



(Unit: in 1 Japanese yen)

Evolution of LTV

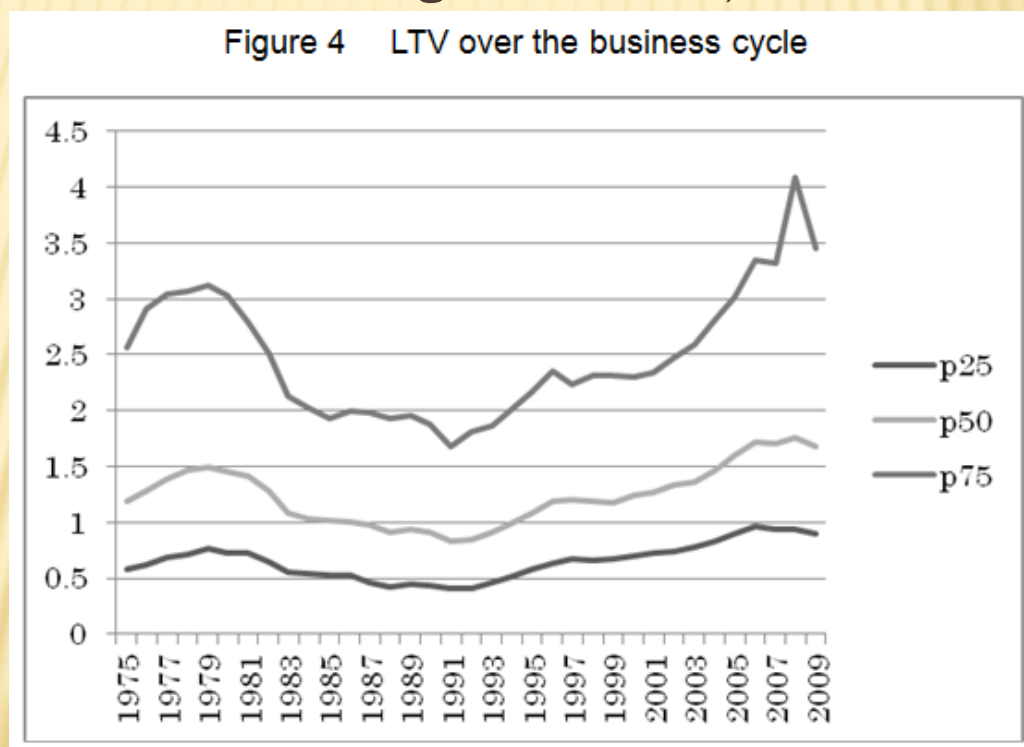
- × Figure 4: 25, 50, and 75 percentile of our LTV through the business cycle



- + Finding: **counter-cyclicality**, at least until early 2000s
 - × Increase in L during the bubble more than offset by increase in V
 - × Banks' exposure did not increase during the bubble
 - × Simple LTV cap might not have been effective

Evolution of LTV

- ✘ Anything wrong with data or methodology?
 - + Counter-cyclicality not due to land price stickiness (see fig. 3)
 - + Unlikely due to survival bias (bias → older borrower better → more L for older borrowers → decreasing trend in LTV)



- ✘ Consistent evidence : counter-cyclicality of LTV for housing loans
 - + Goodhart et al.(2012) (simulation), Bank of Japan (2012) (1994-09)

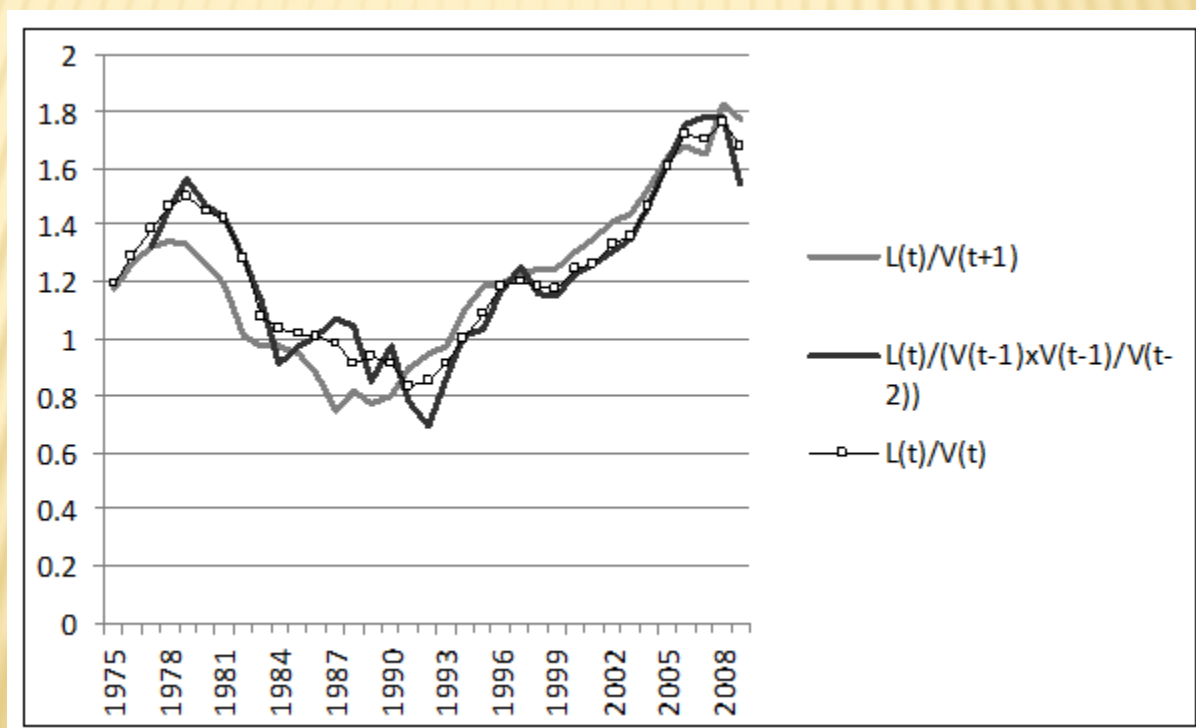
Evolution of LTV

× Robustness

+ Figure 6: Median LTV under different definition of V (denominator)

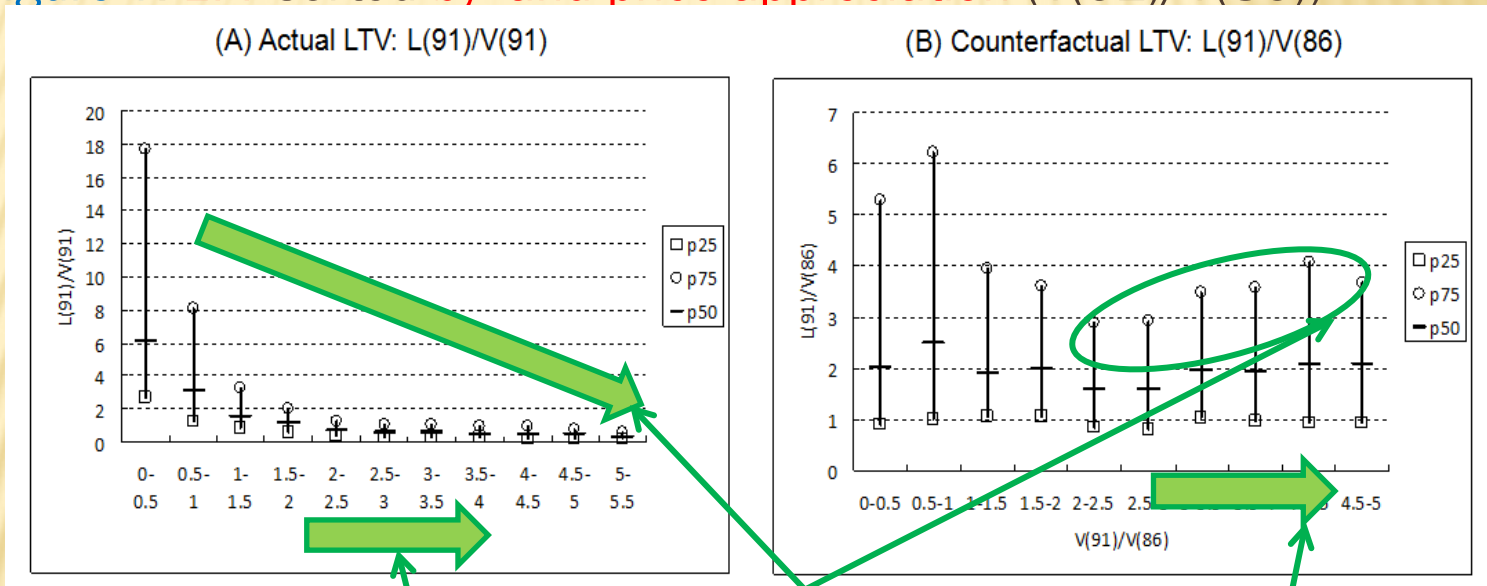
× Perfect foresight: $V(t+1)$

× Naïve interpolation: $V(t-1) \cdot \{V(t-1)/V(t-2)\}$



Land price increase and LTV during the bubble

- ✘ Closer look at **LTV during the bubble (y1991)**
 - + Higher LTV for more land price surge? (lax lending?)
 - + **Figure 7: LTV sorted by land price appreciation** ($V(91)/V(86)$)



- + Finding
 - ✘ Panel (A): more land price surge \rightarrow lower LTV \rightarrow (interpretation) reluctant to lend more (given V)
 - ✘ Panel (B) **Counterfactual** LTV ($L(91)/V(86)$): land price surge \rightarrow L larger (comp. w/ $V(86)$) for higher LTV loans (Interpre.: lax standards)

RESULT 2

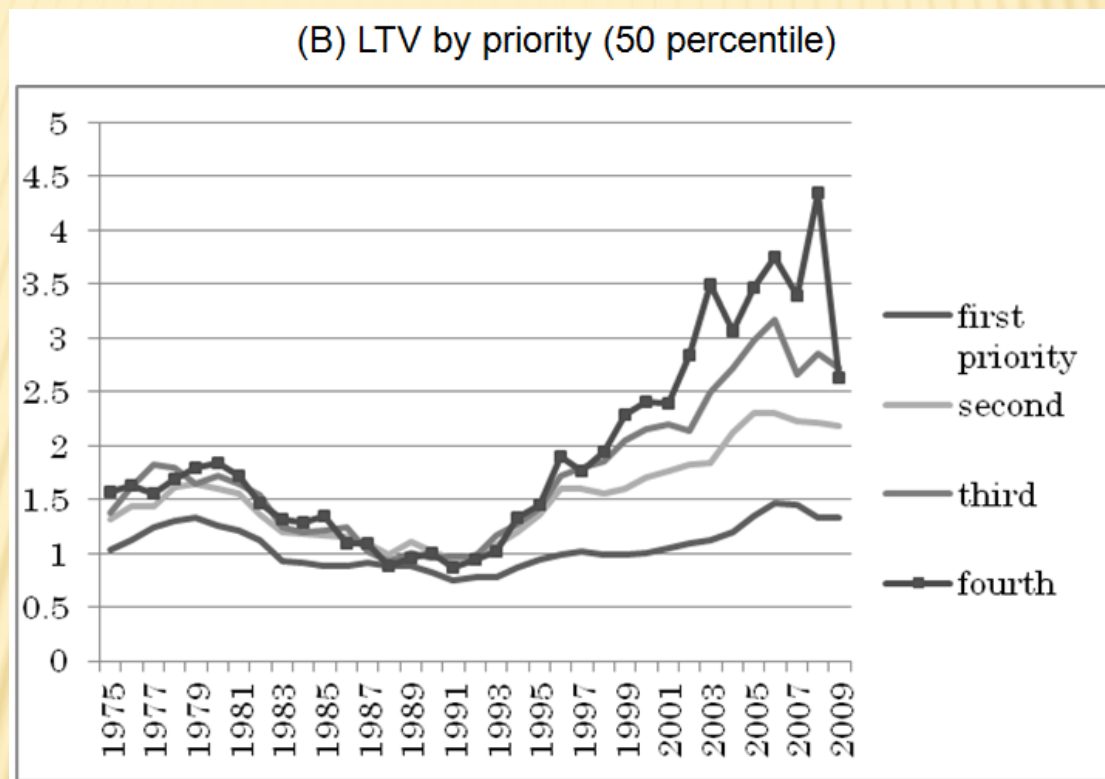
UNIVARIATE ANALYSIS (SEC. 3.2)

Univariate analyses

- ✘ Compare LTV by loan-, borrower-, and lender-characteristics
 - + Aim
 - ✘ To show various facts of LTV ratios
 - ✘ Determinants of LTV ratios
 - ✘ Especially, association with borrower risk and performance (for policy purpose)
 - + In this presentation
 - ✘ Below, we report only notable results
 - ★ The other results: please refer to the paper

LTV by priority

- × Sec. 3.2.2 (Figure 9): Median LTV by mortgage priority

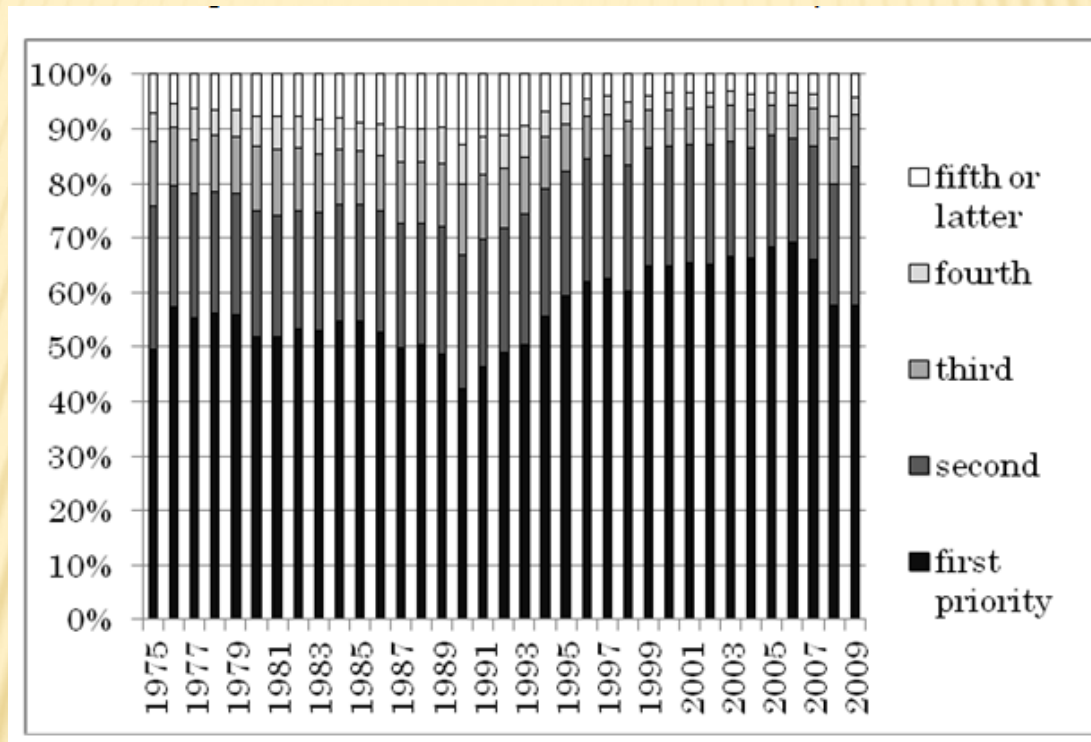


- × Finding

- + Higher priority mortgages have lower LTV ratios (almost by definition)

Share of loans by priority

- × Sec. 3.2.2 (Figure 10): Share of loans by priority

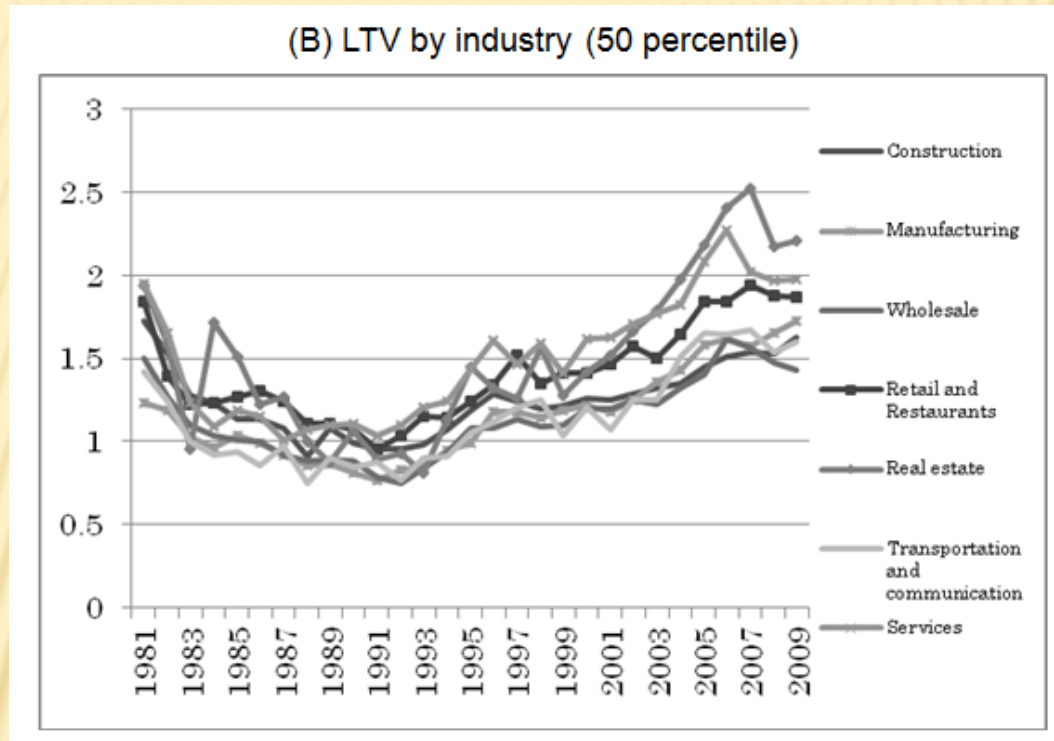


- × Finding

- + Higher share for lower priority mortgages during the bubble period (interpretation: lax standard)

LTV by industry

- × Sec. 3.2.3 (Figure 11): Median LTV by industry

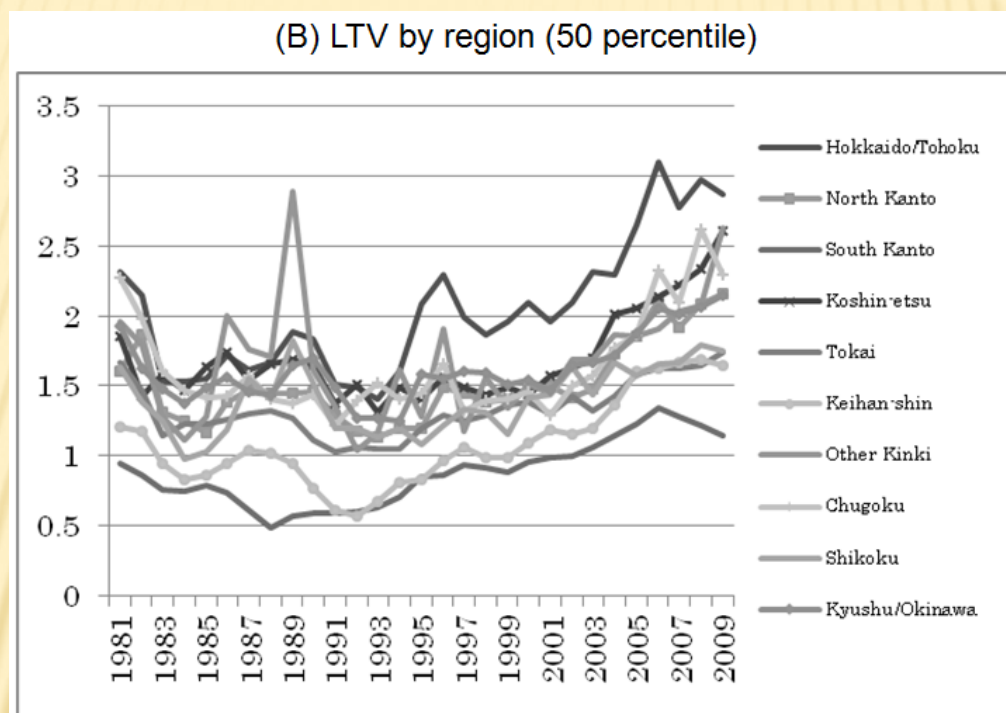


- × Finding

- + Higher LTV for Real estate, Services, and Retail and restaurants
- + Higher LTV for Construction before the bubble
- + Volatile LTV for Real estate

LTV by region

- ✗ Sec. 3.2.4 (Figure 12): LTV by region

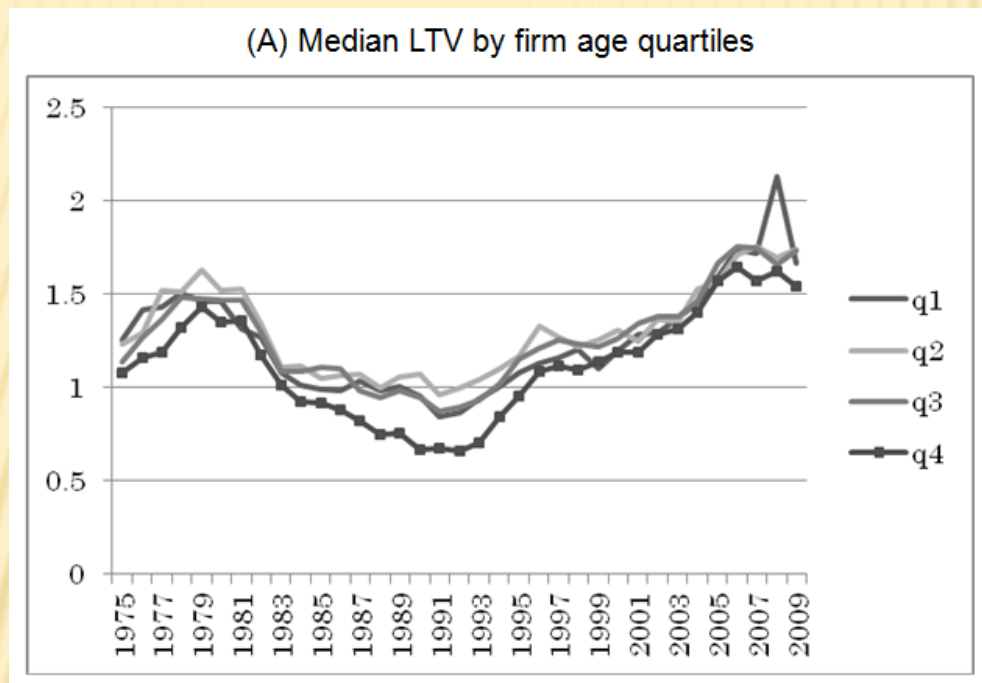


- ✗ Finding

- + Lower and stable LTV in urban areas (S. Kanto (incl. Tokyo), Keihanshin)
- + Decreasing trend in 1980s apparent only for urban areas
- + Earlier bottom for South Kanto (in 1988)

LTV by firm characteristics

- ✘ Sec. 3.2.5 (Figure 13 (A)): LTV by firm age



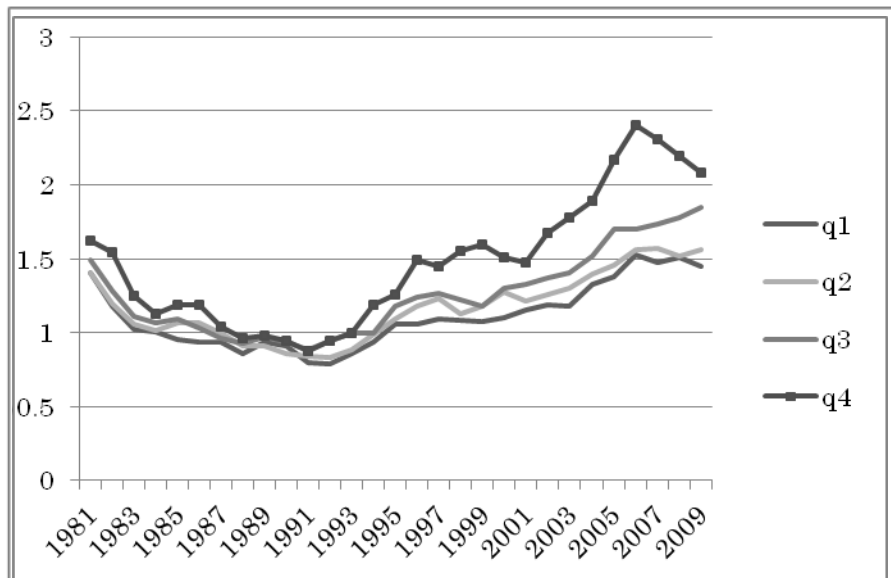
- ✘ Finding

- + Lower LTV for older firms (4th q.) especially during the bubble
- + (Interpretation: more assets or lower loan demand for older firms)

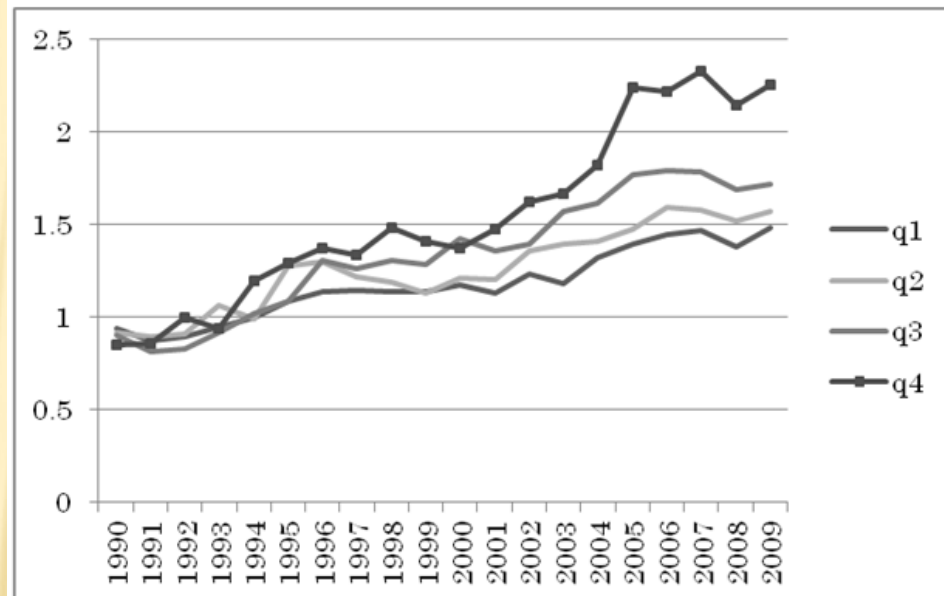
LTV by firm characteristics

- ✘ Sec. 3.2.5 (Figure 13): LTV by **employee size** (panel B), **sales** (panel C)

(B) Median LTV by employee size quartiles



(C) Median LTV by sales quartiles

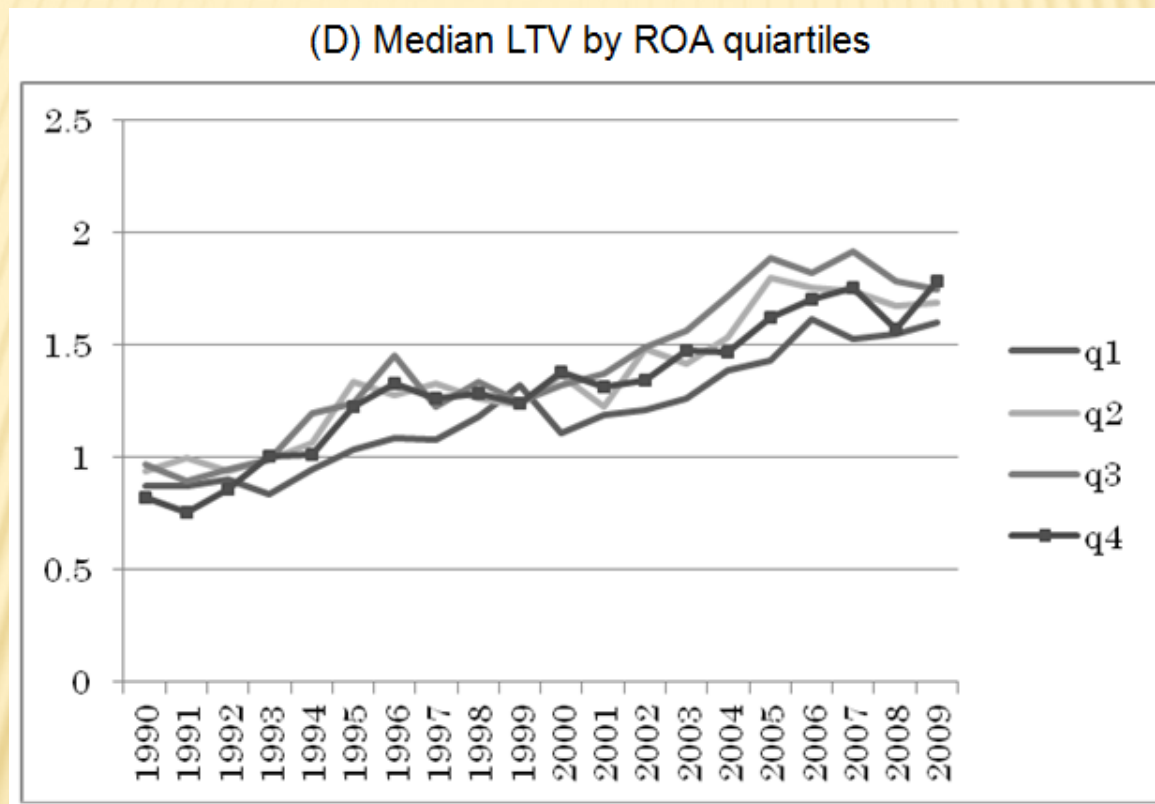


- ✘ Finding

- + **Higher** LTV ratio for **larger** firms, especially from the mid 2000s
(Interpretation: large firms less financially constrained)
- + **Smaller difference** by firm size in **pre-bubble** period

LTV by firm characteristics

- ✘ Sec. 3.2.5 (Figure 13 (D)): LTV by ROA

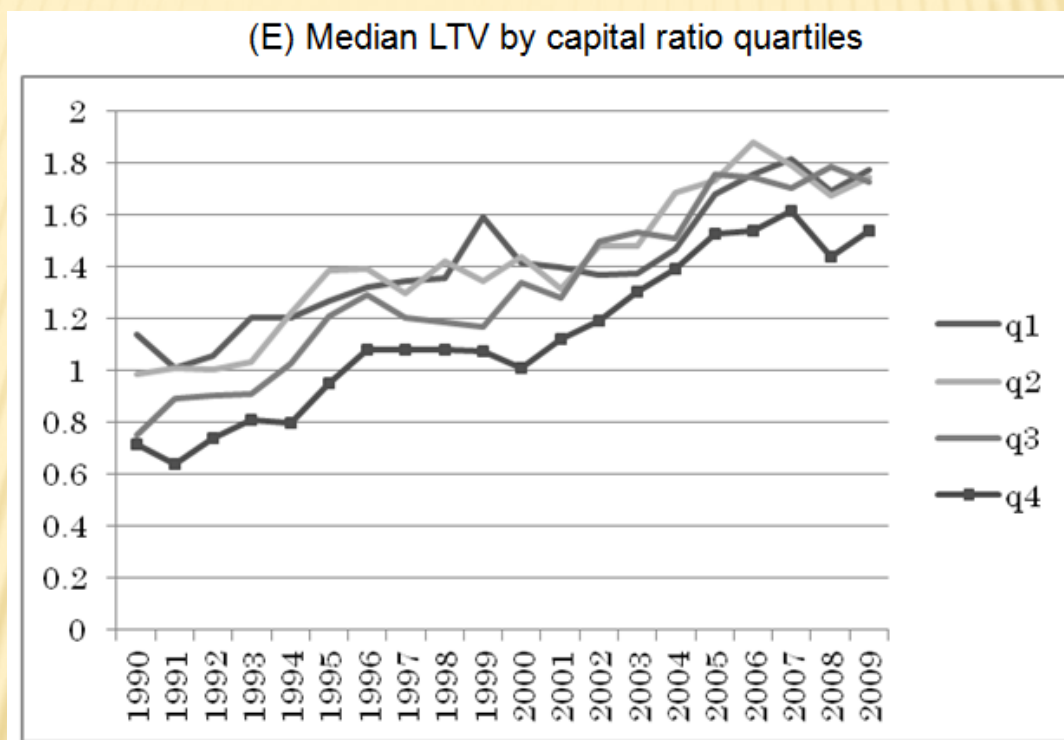


- ✘ Finding

+ No clear relationship between LTV and profitability

LTV by firm characteristics

- × Sec. 3.2.5 (Figure 13 (E)): LTV by capital asset ratio

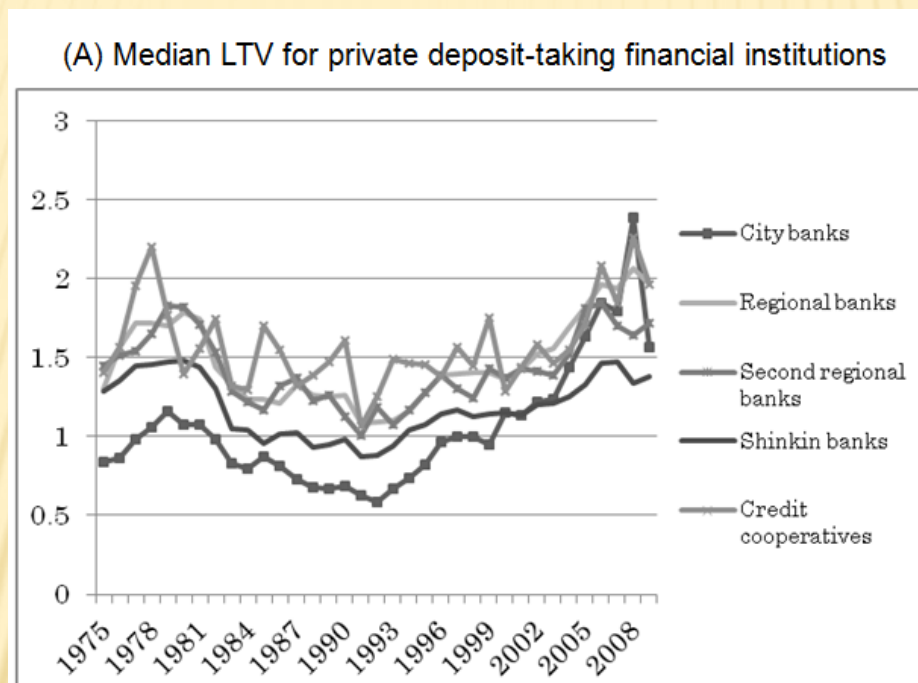


- × Finding

- + Lower LTV for higher capital-asset ratio firms (4th q.)
- + (Interpretation: lower loan demand for lower-leverage firm)

LTV by lender type

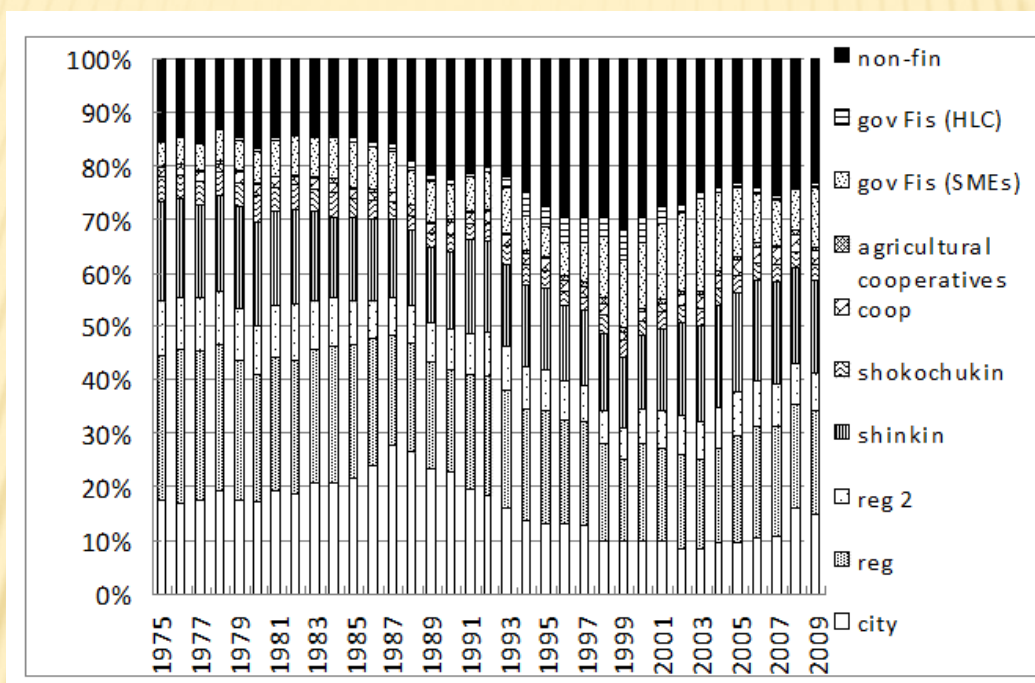
- ✘ Sec. 3.2.6 (Figure 14 (A)): LTV by lender type



- ✘ Finding
 - + Lower LTV for city (larger) banks before 2000
 - + Stable and consistently low LTV for Shinkin banks (small-sized)
 - + Note: Difference by lender type or difference by region?
 - ✘ E.g., City banks lend to borrowers in rural areas

LTV by lender type

- × Sec. 3.2.6 (Figure 15): Share of loans by lender type

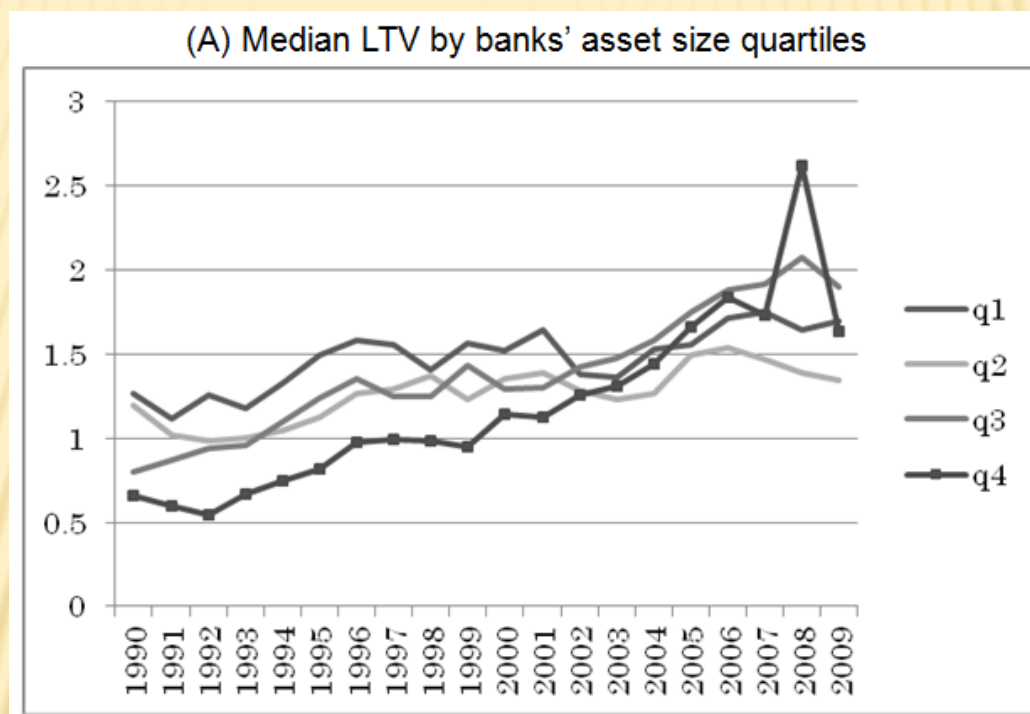


- × Finding

- + Higher share for city banks during the mid 1980s
- + (Interpretation: boom-and-bust cycle of real-estate loans by city banks)
- + Maybe a consequence of financial disintermediation
 - × Large banks lend to “non-traditional” borrowers

LTV by lender characteristics

- × Sec. 3.2.8 (Figure 18 (A)): LTV by bank size



- × Finding

- + LTV **lower** for **larger** banks (4th q.) until early 2000s
- + (Interpretation: larger clients for larger banks and/or larger banks more risk-averse)

Univariate analysis

- ✘ However, these are after all **univariate** analyses
 - + To examine **determinants** of LTV, **unsuitable**
- ✘ → **Regression** analysis (**sec. 3.3**)

RESULT 3

REGRESSION (SEC. 3.3)

Regression

- ✘ Dependent variable: **LTV ratio**
- ✘ Independent variables:
 - + **Loan characteristics**: Revolving or not, priority
 - + **Borrower characteristics**: Sales, ROA, capital asset ratio, age, industry, region
 - + **Lender characteristics**: Main bank status, bank type, asset size, ROA, capita asset ratio
 - + **Action program dummy**: = 1 if $year \geq 2004$ and lender is *regional or Shinkin bank, or credit cooperative*
 - ✘ Effect of **Action Program on Relationship Banking** by the Financial Services Agency (FSA) from 2003
 - ★ requested regional lenders (regional, Shinkin, and credit cooperatives) to avoid an “**excessive**” **reliance on collateral** and personal guarantees
 - ✘ Expected impact: **positive**
 - + **Registration year dummies**: represents unexplained **cyclicity**

Regression

- ✗ Results: [Table 2](#) (pls. see [p.41](#))
- ✗ LTV **lower** for **revolving** mortgages
 - + Lenders cautious for revolving mortgages that do not specify maturity
- ✗ LTV **lower** for **senior** loans
- ✗ LTV **higher** for **larger** firms
 - + Smaller financial constraints for large borrowers
- ✗ LTV **lower** for **sounder** and **older** firms
 - + Interpretation: no need to raise funds and/or sufficient assets to pledge
- ✗ LTV **higher** for **Real estate**, **Retail** and **restaurants**, and **Services** firms
 - + Int.: lax lending for Real estate firms
 - + Int.: insufficient properties to pledge for Retail/restaurants and Services

Table 2 Regression results

Dependent variable: LTV	Panel (A): w/o lender financial variables				Panel (B): w/ lender financial variables			
	Coef.	Std. Err.	t	P> t	Coef.	Std. Err.	t	P> t
Loan characteristics								
L_REV	-0.053 ***	0.012	-4.52	0.000	-0.034 *	0.020	-1.69	0.090
L_PR1	-0.801 ***	0.021	-37.96	0.000	-0.602 ***	0.034	-17.81	0.000
L_PR2	0.159 ***	0.022	7.12	0.000	0.006	0.036	0.18	0.859
L_PR3	0.097 ***	0.026	3.78	0.000	0.189 ***	0.042	4.53	0.000
L_PR4	0.100 ***	0.031	3.23	0.001	0.121 **	0.050	2.40	0.017
Firm characteristics								
F_IN SALES	0.178 ***	0.004	40.42	0.000	0.219 ***	0.007	31.36	0.000
F_ROA	0.189 ***	0.025	7.73	0.000	0.417 ***	0.090	4.63	0.000
F_CAP	-0.049 ***	0.005	-9.33	0.000	-0.098 ***	0.019	-5.08	0.000
F_AGE	-0.008 ***	0.000	-21.62	0.000	-0.007 ***	0.001	-13.04	0.000
F_IND1	0.665 ***	0.027	24.23	0.000	0.644 ***	0.046	14.13	0.000
F_IND2	0.568 ***	0.029	19.32	0.000	0.537 ***	0.048	11.14	0.000
F_IND3	0.493 ***	0.029	17.13	0.000	0.474 ***	0.047	9.98	0.000
F_IND4	0.876 ***	0.034	25.66	0.000	0.917 ***	0.055	16.63	0.000
F_IND5	1.141 ***	0.035	32.76	0.000	1.222 ***	0.055	22.15	0.000
F_IND6	0.527 ***	0.039	13.61	0.000	0.493 ***	0.062	7.98	0.000
F_IND7	0.900 ***	0.032	25.58	0.000	0.823 ***	0.051	16.07	0.000
F_REG1	-0.623 ***	0.032	-19.54	0.000	-0.699 ***	0.051	-13.80	0.000
F_REG2	-1.131 ***	0.017	-65.27	0.000	-1.094 ***	0.029	-37.63	0.000
F_REG3	-0.305 ***	0.024	-12.87	0.000	-0.310 ***	0.038	-8.08	0.000
F_REG4	-0.717 ***	0.021	-33.87	0.000	-0.677 ***	0.034	-20.00	0.000
F_REG5	-0.898 ***	0.019	-46.82	0.000	-0.884 ***	0.032	-27.53	0.000
F_REG6	-0.515 ***	0.044	-11.75	0.000	-0.495 ***	0.072	-6.91	0.000
F_REG7	-0.490 ***	0.024	-20.52	0.000	-0.450 ***	0.039	-11.42	0.000
F_REG8	-0.734 ***	0.035	-20.96	0.000	-0.731 ***	0.054	-13.54	0.000
F_REG9	-0.459 ***	0.022	-21.20	0.000	-0.393 ***	0.034	-11.55	0.000

Regression

- ✘ Results: [Table 2](#) (pls. see [p.41](#))
- ✘ LTV **lower** for **urban** areas
 - + Even after controlling for other borrower/lender characteristics
 - + Interpretation: Merit of agglomeration
 - + Int.: lenders cautious for revolving mortgages that do not specify maturity

Table 2 Regression results

Estimation method: Median regression	Panel (A): w/o lender financial variables				Panel (B): w/ lender financial variables			
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Regression

- ✘ Results: [Table 2](#) (pls. see [p.41](#))
- ✘ LTV higher for regional lenders (regional, Shinkin and credit cooperatives) and other lenders
 - ✘ Compared with city banks
- ✘ LTV lower for lenders subject to Action Program (to reduce dependence on collateral)
 - + Inconsistent with prior prediction
 - + Int.: to reduce NPLs (also aim of Program)
 - + Int.: non-secured lending increased
- ✘ LTV exhibit counter-cyclical!
 - + Positive compared with y1990
 - + Even after controlling for various factors
 - + Even after controlling for bank financial variables
 - + No lax lending standard during the bubble

Table 2 Regression results

Lender characteristics								
BK_MAIN	-0.007	0.013	-0.54	0.592	-0.029 *	0.017	-1.73	0.084
BK_TYPE1	0.186 ***	0.019	9.84	0.000	0.158 ***	0.038	4.14	0.000
BK_TYPE2	0.126 ***	0.021	6.08	0.000	-0.004	0.055	-0.08	0.939
BK_TYPE3	0.207 ***	0.042	4.90	0.000				
BK_TYPE4	-0.006	0.019	-0.32	0.747				
BK_TYPE5	0.163 ***	0.047	3.46	0.001	0.284 ***	0.093	3.06	0.002
BK_TYPE6	0.004	0.019	0.21	0.832				
BK_POLICY	-0.075 ***	0.020	-3.68	0.000	-0.107 ***	0.038	-2.81	0.005
BK_ROA					-0.287	1.498	-0.19	0.848
BK_LN_ASSET					-0.024 **	0.011	-2.25	0.024
BK_CAP					-1.617 **	0.716	-2.26	0.024
Registration year								
YEAR1991	-0.036	0.038	-0.95	0.343	-0.057	0.057	-1.00	0.317
YEAR1992	0.002	0.038	0.05	0.960	-0.051	0.058	-0.89	0.373
YEAR1993	0.078 **	0.038	2.04	0.041	0.084	0.059	1.42	0.156
YEAR1994	0.221 ***	0.039	5.12	0.000	0.120 **	0.061	1.96	0.050
YEAR1995	0.403 ***	0.039	10.29	0.000	0.346 ***	0.062	5.60	0.000
YEAR1996	0.503 ***	0.039	12.86	0.000	0.460 ***	0.063	7.28	0.000
YEAR1997	0.471 ***	0.038	12.33	0.000	0.409 ***	0.062	6.61	0.000
YEAR1998	0.473 ***	0.038	12.51	0.000	0.438 ***	0.063	6.90	0.000
YEAR1999	0.508 ***	0.038	13.29	0.000	0.446 ***	0.067	6.68	0.000
YEAR2000	0.587 ***	0.037	15.70	0.000	0.587 ***	0.063	9.36	0.000
YEAR2001	0.608 ***	0.037	16.48	0.000	0.577 ***	0.063	9.22	0.000
YEAR2002	0.660 ***	0.037	18.03	0.000	0.652 ***	0.060	10.92	0.000
YEAR2003	0.763 ***	0.036	21.14	0.000	0.775 ***	0.058	13.28	0.000
YEAR2004	0.883 ***	0.037	23.89	0.000	0.937 ***	0.061	15.47	0.000
YEAR2005	1.014 ***	0.037	27.51	0.000	1.119 ***	0.060	18.60	0.000
YEAR2006	1.083 ***	0.037	29.66	0.000	1.193 ***	0.060	19.98	0.000
YEAR2007	1.067 ***	0.036	29.34	0.000	1.154 ***	0.059	19.47	0.000
YEAR2008	0.978 ***	0.036	27.02	0.000	1.029 ***	0.059	17.49	0.000
YEAR2009	0.983 ***	0.037	26.60	0.000	1.051 ***	0.060	17.40	0.000
constant	-0.813 ***	0.072	-11.24	0.000	-1.120 ***	0.211	-5.32	0.000
Number of Observations	71,751				38,017			
Pseudo R ²	0.0197				0.0216			

EX POST PERFORMANCE (SEC. 4)

Ex post performance

- ✘ **Prior prediction** for ex post performance of high LTV borrowers
 - + At first glance, **POOR**
 - ✘ **High** LTV ratio loans are **riskier**
 - ✦ high credit-risk **exposure** for the lender
 - ✘ (= **reason** for the **ceilings** on LTV)
 - ✦ To curb the riskiness of the lender
 - ✦ To prevent their excessive risk taking
 - + But maybe **NOT POOR**
 - ✘ LTV is determined by **various factors**
 - ✦ **Higher** LTV ratio might be set for **safer** borrowers
 - ✦ (→ LTV cap might prevent creditworthy borrowers from borrowing)

Ex post performance

✘ Methodology

+ DID (difference-in-differences) comparison

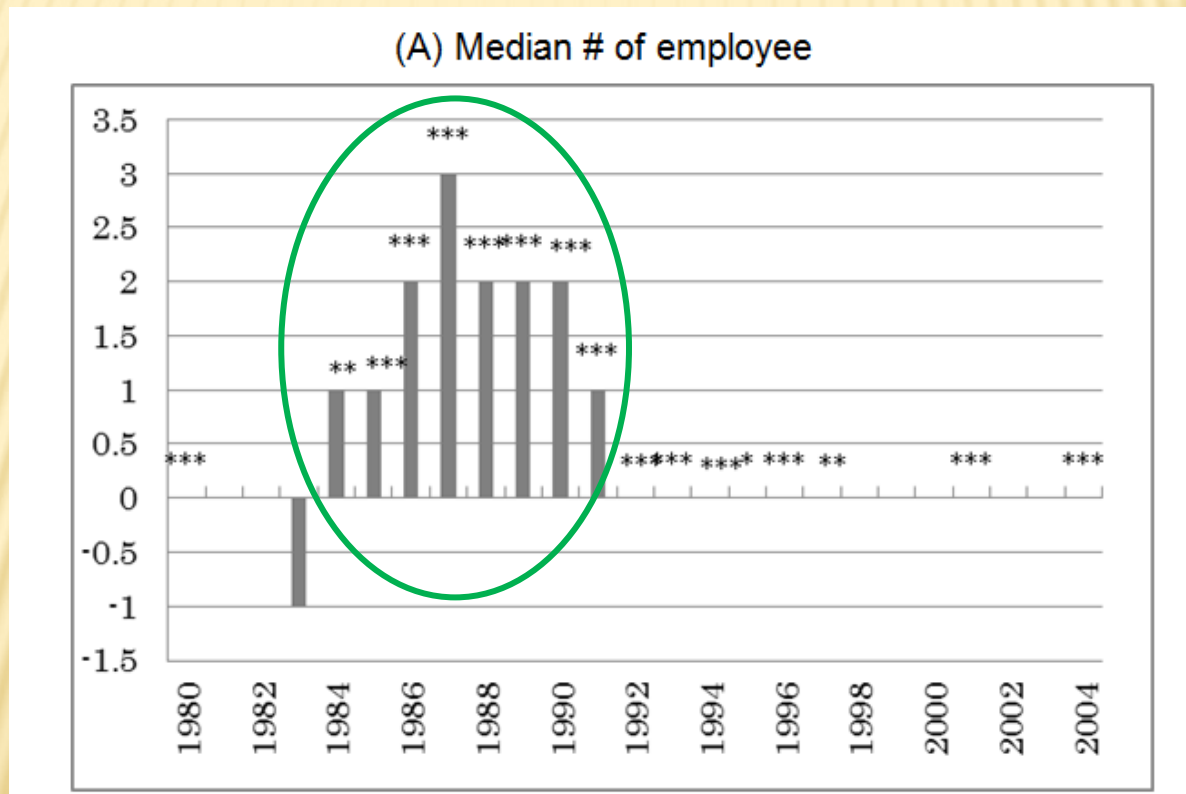
1. X : performance variable
 - ✘ Firm **size** or **growth**: # of employees (y1981-), sales (y1989-)
 - ✘ Firm **profitability**: ROA (y1989-)
 - ✘ Firm **soundness**: capital-asset ratio (y1989-)
2. Take 5 year difference in X : $(X_{t+5} - X_t)$
 - ✘ to eliminate time invariant firm-fixed effects
3. Compare the 5 year difference by LTV ratio

$$\text{DID measure} = (X_{t+5} - X_t \text{ for } \textit{high LTV firms}) - (X_{t+5} - X_t \text{ for } \textit{low LTV firms})$$

Ex post performance

- × Sec. 4 (Figure 19 (A)): Median DID in employee size

$$(X_{t+5} - X_t \text{ for high LTV firms}) - (X_{t+5} - X_t \text{ for low LTV firms})$$

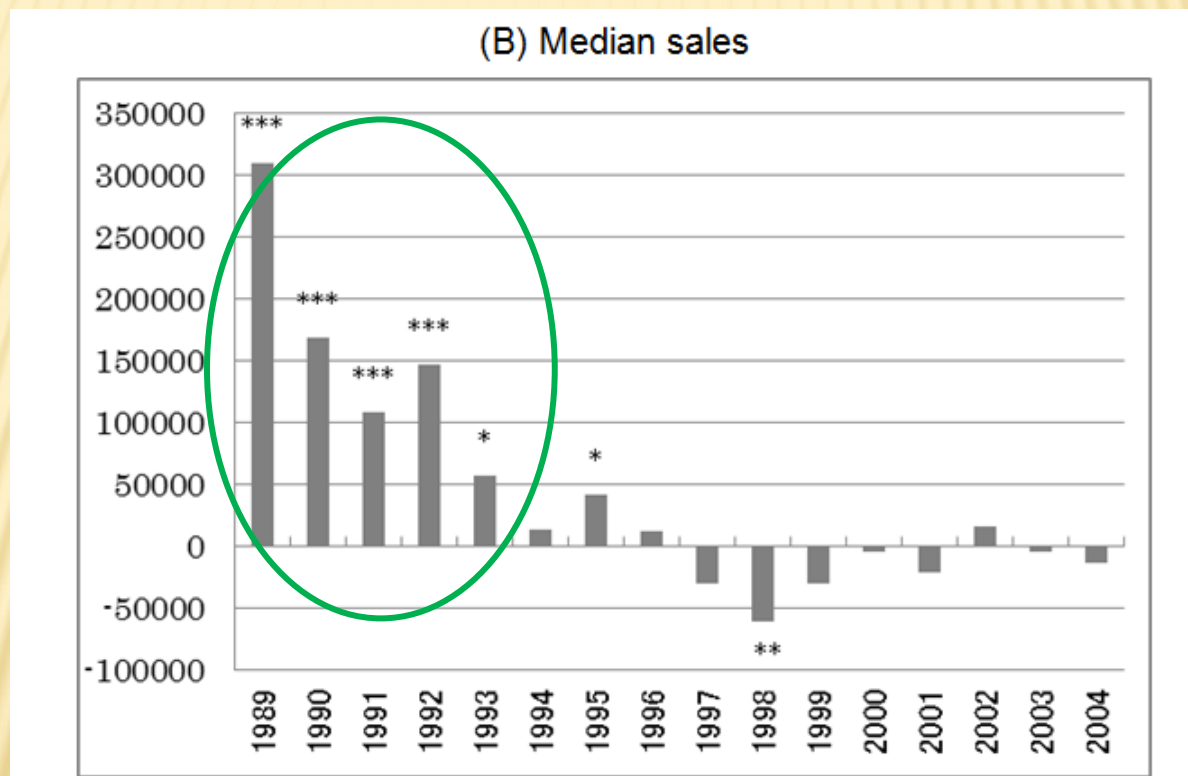


- × Finding: Better performance for high LTV ratio firms during the bubble in terms of firm growth

Ex post performance

- ✘ Sec. 4 (Figure 19 (B)) : Median DID in sales

$$(X_{t+5} - X_t \text{ for high LTV firms}) - (X_{t+5} - X_t \text{ for low LTV firms})$$

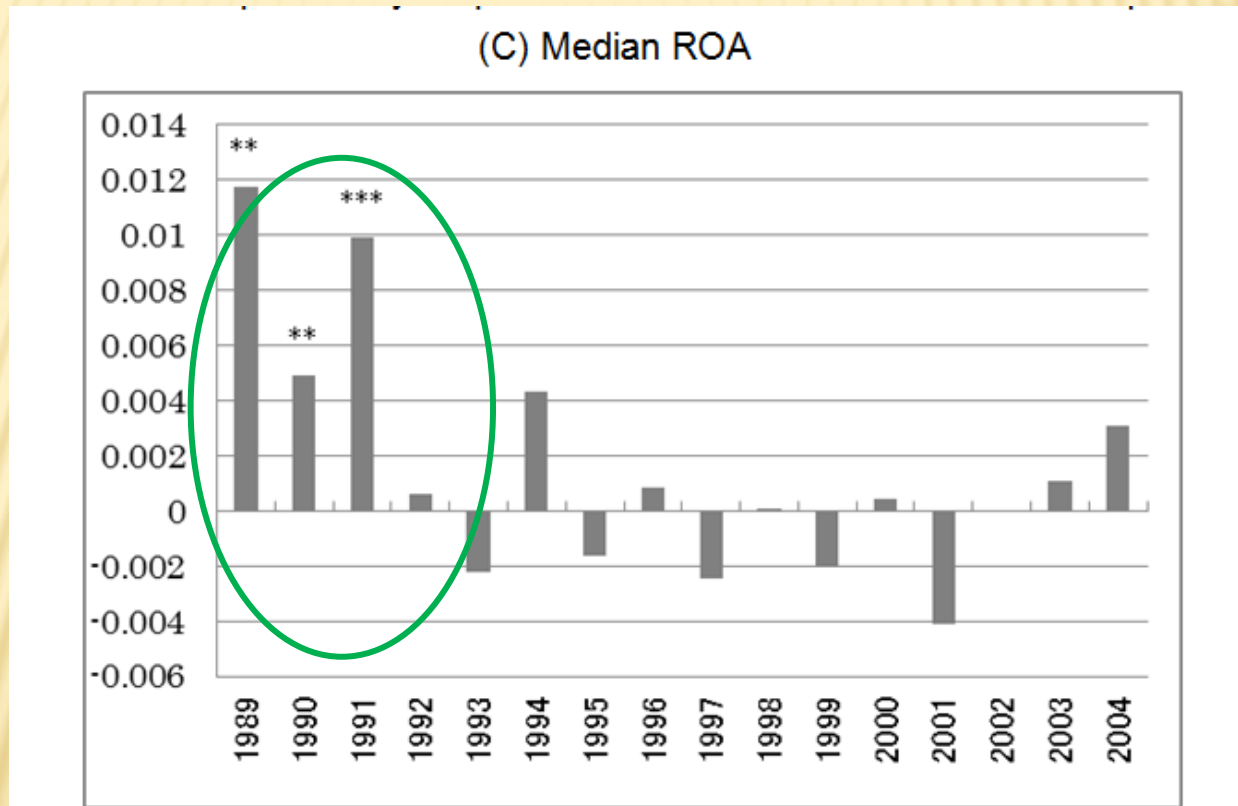


- ✘ Finding: Better performance for high LTV ratio firms during the bubble in terms of firm growth

Ex post performance

- ✘ Sec. 4 (Figure 19 (C)) : Median DID in ROA

$$(X_{t+5} - X_t \text{ for high LTV firms}) - (X_{t+5} - X_t \text{ for low LTV firms})$$

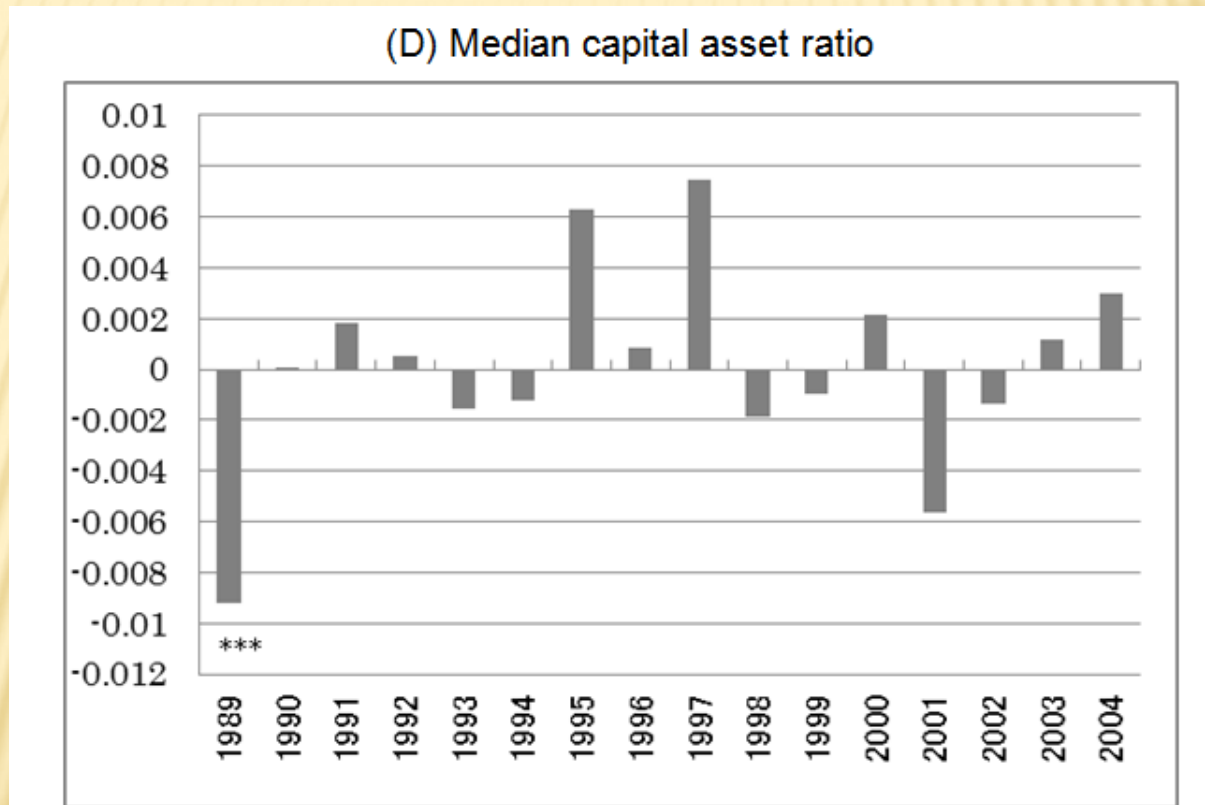


- ✘ Finding: Better performance for high LTV ratio firms during the bubble in terms of profitability

Ex post performance

- × Sec. 4 (Figure 19 (D)) : Median DID in capital asset ratio

$$(X_{t+5} - X_t \text{ for high LTV firms}) - (X_{t+5} - X_t \text{ for low LTV firms})$$



- × Finding: No significant difference in terms of soundness

Ex post performance

- ✘ Results summary
 - + In terms of **size** and **profitability** (first 3 panels)
 - ✘ Around the peak of the **bubble**
 - ✘ **Performance** of **high LTV firms** (4th LTV quartile) **better** than that of low LTV firms (1st LTV quartile)
 - ✘ **Other** periods
 - ✘ **No** such **differences**

SUMMARY AND CONCLUSION

Main findings

1. **Sec.3.1:** LTV ratio exhibits **counter-cyclicality**
 - + Lower ratios during the bubble period (**fig. 4**)
 - × Although L and V exhibit pro-cyclicality (**fig. 3**)
 - + **Robust** to controlling for various loan-, borrower-, and lender-characteristics, and to the consideration for survival bias
2. **Sec. 3.2, 3.3:** LTV ratios **associated** with many **loan-, borrower- and lender-characteristics**
 - + Various **facts** from univariate/regression analyses
3. **Sec. 4:** **No worse ex post performance** for **high** LTV firms
 - + Rather **better performance** during the **bubble** period in terms of **firm growth** and **profitability**

Implication

- × Conventional wisdom and our findings
 - + Conventional wisdom
 - × banks in Japan during the bubble lent with lax lending standards → bad loan problems
 - + Inconsistent with our MAIN findings
 - + But some of our findings are in support of the wisdom
 - × Larger amount of loans with high LTV during the bubble when land price surged
 - × More low-priority mortgages during the bubble
 - + → At least more nuanced view of bank behavior during the bubble needed

Implication

- × Policy implication

- + The cap on the LTV ratio as a macro prudential measure

- × Proponents

- × “Cap on LTV ratio → risky loans curbed → reduce bank risk”

- × Our findings

- × do not support this view

- × Low LTV ratios during the bubble period

- × No worse ex post performance for high LTV firms

- × Implication from our findings

- × Cap on the LTV ratio would be harmful for creditworthy borrowers

Extension

- ✘ Needed in many directions
 - + Esp., need to focus on the **margins** of the LTV distribution

END OF PRESENTATION

THANK YOU