House Price Beliefs and Mortgage Leverage Choice

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- Objective: Explore relationship between beliefs about house prices and leverage choices

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 - Main Result: Ambiguous relation between optimism and leverage

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- ► Key parameter: Willingness/ability to adjust property size
 - High return sensitivity of housing investment: (1) dominates
 - ightarrow Optimists (appropriately defined) have higher leverage;
 - Low return sensitivity of housing investment: (2) dominates
 - \rightarrow Optimists (appropriately defined) have lower leverage;
 - Which forces restrict adjustment of exposure to asset?
 - Owner-occupied housing: family size, neighborhood, etc.

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 - 1. Theoretically
 - Parsimonious model to relate homebuyers' beliefs to mortgage leverage choices
 - Main Result: Ambiguous relation between optimism and leverage
 - 2. Empirically
 - Cross-sectional relationship between homebuyers' beliefs and leverage
 - Main Result: More optimistic households choose lower leverage

Environment

- Two dates $t = \{0, 1\}$
- Borrower i's preferences (+ housing target zone)

 $u_{i}(c_{0i}) + \beta \mathbb{E}_{i}[w_{1i}]$

- Borrowers choose
 - \blacktriangleright Initial consumption c_{0i}
 - ► House size *h*_{0*i*}

• Leverage
$$\delta_i = \frac{b_{1i}}{p_0 h_{0i}}$$

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Collateralized non-recourse loan

• Default loss: $-\phi_i p_1 h_{0i}$ ($\phi_i = 0$ for the talk)

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Heterogeneous beliefs about house price growth rates

$$g = \frac{p_1}{p_0}$$
, where $g \sim F_i(\cdot)$

Homebuyers' problem

► Homebuyers choose c_{0i} , h_{0i} and $\delta_i = \frac{b_{1i}}{p_0 h_{0i}}$ (leverage) to solve

$$\max_{c_{0i},\delta_{i},h_{0i}}u\left(c_{0i}\right)+\beta p_{0}h_{0i}\int_{\delta_{i}}^{\overline{g}}\left(g-\delta_{i}\right)dF_{i}\left(g\right)$$

s.t.

 $c + p_0 h_{0i} \left(1 - \Lambda \left(\delta_i \right) \right) = n_{0i} \qquad (\lambda_{0i})$

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- LTV ratio Λ (δ_i) schedule determined by competitive, risk-neutral lenders
 - Depends only on lenders' beliefs

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$$\underline{h_i} \le h_{0i} \tag{ν_{0i}}$$

Return Sensitivity of Housing Investments: Captures "consumption forces" on property size choice (e.g., family size)

Allows to explore polar cases.

Optimality conditions

•
$$c_{0i}: \quad \lambda_{0i} = u'_i(c_{0i})$$

$$h_{0i}: -\underbrace{\lambda_{0i}p_{0}\left(1-\Lambda\left(\delta_{i}\right)\right)}_{\text{Mg. Cost}} +\underbrace{\beta p_{0}\int_{\delta_{i}}^{\overline{g}}\left(g-\delta_{i}\right)dF_{i}\left(g\right)}_{\text{Mg. Benefit}} +\nu_{0i}=0$$

$$\delta_{i}: \underbrace{\lambda_{0i}p_{0}h_{0i}\Lambda'\left(\delta_{i}\right)}_{\text{Mg. Benefit}} -\underbrace{\beta p_{0}h_{0i}\int_{\delta_{i}}^{\overline{g}}dF_{i}\left(g\right)}_{\text{Mg. Cost}} = 0$$

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$$\underbrace{Mg. \text{Benefit}}_{\text{Mg. Cost}} -\underbrace{\beta p_{0}h_{0i}\int_{\delta_{i}}^{\overline{g}}dF_{i}\left(g\right)}_{\text{Mg. Cost}} = 0$$

Two channels through which homebuyer beliefs matter

- 1. Expected return of investment
- 2. Marginal cost of borrowing/saving

Variable House Size Scenario

Housing target constraint is slack

House size determined by investment aspect of housing

Leverage pinned down by:

$$\frac{\Lambda'\left(\delta_{i}^{*}\right)}{1-\Lambda\left(\delta_{i}^{*}\right)} = \frac{1}{\mathbb{E}_{i}\left[g|g \geq \delta_{i}^{*}\right] - \delta_{i}^{*}}$$

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 $\blacktriangleright \text{ If } \mathbb{E}_{j}\left[g \,|\, g \geq \delta\right] > \mathbb{E}_{i}\left[g \,|\, g \geq \delta\right], \ \forall \delta \quad \Longrightarrow \quad \delta_{j}^{*} > \delta_{i}^{*}$

Optimism = "Truncated Expectation Dominance"

"Expected return" force > "Mg. cost of borrowing" force

Disagree about return to investment conditional on repayment

Fixed House Size Scenario

Housing target constraint is binding

House size determined by considerations such as family size

Leverage pinned down by:

$$\underbrace{u_{i}^{\prime}\left(c_{0i}\right)p_{0}h_{0i}\Lambda^{\prime}\left(\delta_{i}^{*}\right)}_{\text{Mg. Benefit}} = \underbrace{\beta p_{0}h_{0i}\left(1-F_{i}\left(\delta_{i}^{*}\right)\right)}_{\text{Mg. Cost}}$$

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$$\blacktriangleright \text{ If } 1 - F_j(\delta) > 1 - F_i(\delta) \text{, } \forall \delta \implies \delta_j^* < \delta_i^*$$

Optimism = First-Order Stochastic Dominance

- Only "Marginal cost of borrowing" force
- Disagree about probability of repayment

Empirical Predictions



Empirical Predictions



Pro: No distributional assumptions

Con: No complete ordering

Empirical Predictions



Pro: Complete order

- Pro: Additional predictions
- Con: Requires distributional assumptions

Parametric predictions: $g \sim N(\mu_i, \sigma_i^2)$



Variable house size: ↑ μ → ↑ 𝔼_i [g | g ≥ δ_i] → ↑ LTV
 Fixed house size: ↑ μ → ↑ (1 − F_i (δ_i)) → ↓ LTV

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Challenges

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Approach

- Belief shifters, as in Bailey, Cao, Kuchler, Stroebel (JPE, 2017)
- House price experiences of geographically-distant friends affect beliefs about future house price changes

Orthogonal to

- Homebuyer characteristics
- Other factors influencing leverage decision

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Two steps

- 1. Survey: Friends' experiences \Rightarrow beliefs
- 2. Regression: Friends' experiences \Rightarrow leverage

Data

Anonymized snapshot of Facebook Social Graph (2015)

- Observe number of friends in each county-location
- \blacktriangleright On average, ~ 400 friendship links, spread over 50+ counties

Belief Survey

Public Records Housing Transaction Data

- 1.35 million housing transactions in 2,900 zip codes (33 states)
- Property details, transaction price, mortgage information
- Transactions from 2008 to 2014
- Caveat: Can only match buyers for owner-occupied properties.

Summary Statistics

 $FriendHPMean_{i,t,t-24m} = \sum_{c} ShareFriends_{i,c} \times \Delta HP_{c,t,t-24m}$

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$$Friend HPM ean_{i,t,t-24m} = \sum_{c} Share Friends_{i,c} \times \Delta HP_{c,t,t-24m}$$



• Substantial variation in *ShareFriends*_{*i*,*c*} and $\Delta HP_{c,t,t-24m}$

Validating Belief Shifters

► A	pril 2017; targe	ted FB users	through Newsfeed;	426 responses				
Focus on a few LA zip codes; representative demographics								
Facebook you public questions	: is helping researchers understand cly share on Facebook and average s, your responses will be kept anony	what real people think about the housing prices to help us bette mous:	e economy. Your survey responses will be co r understand the housing economy. Help us	ombined with the information that out by answering the following				
How ofter	n do you talk to your friends about v	vhether buying a house is a goo	d investment?					
	Never	Rarely	Sometimes	Often				
What wou	IId you say is the percent chance th increase by 12% or more	at over the next 12 months the a	werage home price in your zip code will					
0%	increase by 8% to 12%							
0%	increase by 4% to 8%							
0%	increase by 0% to 4%							
0%	decrease by 0% to 4%							
0%	decrease by 4% to 8%							
0%	decrease by more than 8%							
0 %	Total							

Validating Belief Shifters

- > April 2017; targeted FB users through Newsfeed; 426 responses
- Focus on a few LA zip codes; representative demographics

	Dep. Var.: Mean	of the Belief Dist	Dep. Var.: SD of the Belief Dist			
	(1)	(2)	(3)	(4)		
Δ House Prices - Past 24 Months						
All Friends - Mean	0.326**	0.322**		-0.024		
	(0.144)	(0.148)		(0.055)		
All Friends - St. D		0.027	0.182**	0.184**		
		(0.145)	(0.089)	(0.090)		
Zip Code Fixed Effects	Y	Y	Y	Y		
Demographic Controls	Y	Y	Y	Y		
Ν	426	426	426	426		

 $CLTV_{i,t,c,l} = \alpha + \beta_1 MeanFriendHP_{i,t} + \beta_2 StDFriendHP_{i,t} + \beta_3 X_{i,t} + \psi_{t,c,l} + \epsilon$

Controls

- Purchase month × county × lender FE
- Borrower characteristics: age, marital status, education, occupation, income, household size

	(1)	(2)	(3)	(4)	(5)	(6)
Δ Friends' House Prices (24m)						
Mean	-0.087*** (0.005)	-0.107*** (0.006)	-0.136*** (0.008)	-0.060*** (0.012)	-0.144*** (0.008)	-0.027* (0.012)
St. D.	0.318*** (0.013)	0.319*** (0.014)	0.546*** (0.021)	0.276*** (0.015)	0.439*** (0.019)	-0.027 (0.023)
Mean X Recourse			0.063*** (0.011)			
St. D. X Recourse			-0.451*** (0.031)			
Mean X Mean				0.0005* (0.0002)		
St. D. X Mean				-0.004*** (0.00)		
Mean X Recovery					0.046*** (0.012)	
St. D. X Recovery					-0.268*** (0.027)	
Mean X HO-Rate						-0.103*** (0.014)
St. D. X HO-Rate						0.463*** (0.025)
Month x County x Lender FE	Y	Y	Y	Y	Y	Y
Demographic Controls	Y	Y, x Year				

 $\uparrow\,1$ ppt Expected House Price Growth (12m) $\rightarrow\downarrow\,\frac{0.087}{0.326}=27$ bps LTV

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Effect stronger in non-recourse states.

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Effect dampened at times of high expected house price growth.

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Effect stronger in areas with high homeownership rate.

Robustness Checks and Alternative Channels

Not driven by wealth through bequests effects

- Effect same across different networks: Employer, Family, College
- Using out-of-state friends as experiences as instruments for all friends' experiences
- Not driven by common shocks
 - Can control for income changes where friends live
 - Geographically non-clustered professions (teachers, lawyers)
- Control for friends' foreclosure rate

Ancillary Evidence

Evidence for the mechanism

- 1. NYFed Survey of Consumer Expectations
- 2. Downpayment Motivation Survey
- 3. Financial Advice Websites
- 4. Beliefs about Default Costs
- 5. Collateral Adjustment Friction

Downpayment Motivation Survey

Table: Reasons for Smaller Downpayment In Pessimistic Scenario

	Wave 1	Wave 2
Optimistic First	 Less money at risk when the chance of a decline in value increases Less money invested in potential loss No need to put more for a down payment if the value will drop. If he defaults and housing prices decrease so that he cannot sell to recoup his investment, he loses less deposit if he puts less down. Because the house MAY be worth less I would rather have cash on hand than tied up in the house 	 Put down less money in case house prices go down. Risk of losing equity with house devaluation. Because I am anticipating that the friend may need to file for a bankruptcy and would want to be sure to be able to shield his or her equity in the property. If the value of the home decreases substantially, he wouldn't have as much invested in the asset which is losing value, yet will still have a better interest rate than the first option.
Pessimistic First	 Cheaper rate so total cost is lower and down payment is not in jeopardy Could be a chance he defaults on the loan in the first case to get out from under a mortgage. If the house is not going to appreciate in value I wouldn't put too much money in 	 Because if they think they are going to lose money, they shouldn't risk much. So he would put less money/savings down on a house that could quickly decrease in value. As long as the housing market (and his investment in the house) stays stable, he should go for the smaller monthly

Financial Advice Websites

From Barron's #1 ranked financial adviser

Have you noticed that your home is worth much more than it was 10 years ago?

You might be worried that your home's value will fall. If you're afraid that your home's value might decline, you should sell the house before that happens.

But you don't want to do that! It's your home, after all. You have roots in the community. Uproot the kids? And where would you move? No, selling is not a practical idea.

Still, you fret that your home's equity is at risk. Can you protect it without having to sell? Yes! Simply get a new mortgage, and pull the equity out of the house. It's the same thing as selling, except that you don't have to sell!

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- Effects of "optimism" on leverage choice are ambiguous
- Housing dual role as consumption and investment good
- Key: willingness of households to adjust property size based on investment considerations

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 More optimistic agents (appropriately defined) take on lower leverage in the cross-section

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Aggregate implications

- Optimism by homebuyers is not enough to generate increasing aggregate leverage
- Credit supply factors are needed to explain joint movement of prices and leverage during a housing boom

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Aggregate implications

- Optimism by homebuyers is not enough to generate increasing aggregate leverage
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- Note: County-level social network data available to share with other researchers
 - "Measuring Social Connectedness"

LTV schedule



$$\Lambda\left(\delta_{i}\right) = \frac{\kappa \int_{\underline{g}}^{\delta_{i}-\chi_{i}} g dF_{L}\left(g\right) + \delta_{i} \int_{\delta_{i}-\chi_{i}}^{\overline{g}} dF_{L}\left(g\right)}{1+r}$$

Summary Statistics

back

	Mean	Standard Deviation	P10	P50	P90
Purchase Characteristics					
Transaction price (k\$)	302.3	237.8	125	225	550
Combined Loan-to-Value (CLTV) Ratio	88.5%	16.9%	69.2%	94.7%	100.0%
Network Statistics					
Number of Friends	353.9	408.3	63	241	733
Number of Out-of-Commuting Zone Friends	194.3	272.6	27	114	427
Number of Out-of-State Friends	155.7	241.3	19	83	351
Number of Counties with Friends	74.7	65.5	19	59	144
Neighborhood Statistics					
Homeownership Rate	74.3%	11.7%	58.7%	76.7%	87.2%
Recourse	0.54	0	0	1	1
A Friends' House Prices (24m)					
Mean - All Friends	-6.4%	13.3%	-22.6%	-7.7%	12.1%
Mean - Out-of-Commuting Zone Friends	-5.3%	10.3%	-16.3%	-7.4%	10.2%
St.Dev All Friends	8.0%	3.3%	4.2%	7.5%	12.5%
St.Dev Out-of-Commuting Zone Friends	9.0%	3.1%	5.1%	8.8%	13.2%
Other Friend Experiences					
Δ Friends' County Income (24m) - Mean	3.1%	6.5%	-4.4%	1.7%	11.3%
Δ Friends' County Income (24m) - St.Dev.	5.7%	3.3%	2.8%	5.0%	9.3%
Friends' Foreclosure Rate (24m, Share of Units) - Mean	3.7%	2.3%	1.1%	3.2%	7.1%
Friends' Foreclosure Rate (24m, Share of Units) - St.Dev	2.0%	0.9%	0.9%	1.9%	3.2%
Property Characteristics					
Home Size (sqft)	2,032	12,766	1,056	1,730	3,077
Lot Size (sqft)	12,033	12,549	2,500	7,500	25,000
Property Age (years)	29.0	24.0	3.0	23.0	62.0
SFR	0.82	0	0	1	1
Has Pool	0.19	0	0	0	1
Buyer Characteristics					
Age at Transaction (years)	37.7	12.7	24	35	56
Has Max High School Degree in 2010	0.64	0.48	0	1	1
Has Max College Degree in 2010	0.26	0.44	0	0	1
Has Max Graduate Degree in 2010	0.10	0.30	0	0	0
Income in 2010 (\$)	82,116	49,413	25,000	62,500	175,000
Married in 2010	0.41	0.49	0	0	1
Household Size in 2010	2.55	1.51	1	2	5