## New Developments in Housing Policy

## Andrew Haughwout <br> Research FRBNY



The views and opinions presented here are those of the authors, and do not necessarily reflect those of the Federal Reserve Bank of New York or the Federal Reserve System.

## Housing played a crucial role in the crisis

- Unprecedented increases in mortgage defaults and foreclosures 2007-present
- One result has been a sharp decline in homeownership
- As officially measured
- Effective (accounting for negative equity)
- High negative equity an ongoing risk for housing, banking sectors
- And economy
- Much recent policy action thus focused on housing
- Buyer tax credits, Fed MBS purchase \& loan modifications
- Latter is major (\$75B) component of Obama's MHA program
- 3-4 million foreclosures to be avoided by 12/31/2012


## Overview

- Background
- Equity \& ownership
- Implications for foreclosure and savings
- Policy response: Mortgage modifications
- What works best?
- Conclusions


## Some background

- Three key determinants of loan performance
- Willingness to pay - borrower credit record
- Ability to pay - debt burden as share of income
- Incentive to pay - borrower equity position
- Mortgage default decision is exercise of an option
- Axiom: Borrowers with positive equity have better options than default
- Sell the house
- Collect cash
- Have to move anyway
- Preserve credit rating


## Nonprime Market Shares



## Nonprime CLTV Ratios by Year of Origination



Source: FirstAmerican CoreLogic LoanPerformance

## Foreclosures and Home Prices

Index
Number of Foreclosures


Source: FRBNY consumer credit panel and FirstAmerican CoreLogic

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## Some policies supporting homeownership

- Federal Taxes
- Interest and p-tax deductible ( $\sim$ \$140B per year)
- Implicit rent exclusion (~\$40B per year)
- Like a business allowed to deduct costs without paying tax on revenue
- First-time buyer credit (2009)
- Housing finance
- GSEs securitizations and guarantees
- FHA/VA loan guarantees
- Fed's MBS purchase program
- Rhetoric (bipartisan)


## Benefits of homeownership

- Private
-Participation in a particular asset class
- Part of mortgage payment a form of saving
- Possibly too much?
- Public
"Homevoter" concept
- House values affected by LT prospects of place
- Homeowners have financial stake in LT
- Homeowners participate more, LT-oriented
- Classic example: Childless hh supports schools


## Aggregate Measured Homeownership Rate



Source: U.S. Census Bureau, Housing and tconomıc Statıstıcs Division.

## Definitions of homeownership

- Official: Census Bureau

$$
h=\frac{\# O w n e r O c c}{\# O c c}
$$

"Rapid increase after 1996

- Alternate: Owners with equity stake in unit

$$
\tilde{h}=\left(h-\frac{\# N E \text { OwnerOcc }}{\# O c c}\right)=\frac{\# P E \text { OwnerOcc }}{\# O c c}
$$

"Excludes negative equity households

## Defining negative equity homeowners

- Borrower Equity:
"Current house value - mortgage balance (all liens)
- Mortgage data give us good estimate of $1^{\text {st }}$ lien balance
"Probable undercount of junior liens
- Change in value since origination estimated -FHFA (comprehensive but limited)
-Case-Shiller (limited geography, more complete)


## Why exclude negative equity "owners"?

- Equity determines financial interest
-E>0: Increase in HV go to owner
" $\mathrm{E}<0$ : Less clear; depends on how much
-For borrower X\% underwater, first X\% of HV appreciation goes to lender


## Aggregate Measured and Effective Homeownership



## Table 2. MSA Measured and Effective Homeownership Rates

|  | Measured Homeownership |  | Effective <br> MSA |  |
| :--- | :---: | :---: | :---: | :---: |
| Rate | Peak | Current | Homeownership Rate | Homeownership Gap |
| Atlanta | 70.8 | 68.5 | 53.9 | Case-Shiller |
| Boston | 67.7 | 64.9 | 60.9 | 14.6 |
| Charlotte | 68.3 | 66.4 | 60.8 | 4.0 |
| Chicago | 71.3 | 69.5 | 54.7 | 5.6 |
| Cleveland | 78.6 | 67.2 | 58.8 | 14.8 |
| Dallas | 64.5 | 60.1 | 52.0 | 8.3 |
| Denver | 72.0 | 68.3 | 59.7 | 8.0 |
| Detroit | 78.4 | 72.6 | $\mathbf{4 2 . 2}$ | 8.6 |
| Las Vegas | 65.0 | 60.4 | $\mathbf{1 5 . 7}$ | $\mathbf{3 0 . 3}$ |
| Los Angeles | 55.2 | 50.7 | $\mathbf{3 3 . 2}$ | $\mathbf{4 4 . 6}$ |
| Miami | 71.0 | 66.9 | $\mathbf{4 2 . 0}$ | $\mathbf{1 7 . 5}$ |
| Minneapolis | 74.8 | 68.8 | $\mathbf{4 2 . 6}$ | $\mathbf{2 5 . 0}$ |
| New York | 55.9 | 51.1 | $\mathbf{4 6 . 9}$ | $\mathbf{2 6 . 2}$ |
| Phoenix | 74.9 | 70.9 | $\mathbf{3 7 . 5}$ | $\mathbf{4 . 2}$ |
| Portland | 72.7 | 61.0 | 53.7 | $\mathbf{3 3 . 4}$ |
| San Diego | 63.3 | 57.7 | $\mathbf{3 1 . 7}$ | 7.2 |
| San Francisco | 61.7 | 57.1 | $\mathbf{3 4 . 7}$ | $\mathbf{2 6 . 0}$ |
| Seattle | 65.7 | 62.7 | 54.4 | $\mathbf{2 2 . 4}$ |
| Tampa | 74.1 | 68.2 | 50.2 | 8.3 |
| Washington DC | 70.9 | $\mathbf{6 7 . 7}$ | $\mathbf{4 6 . 0}$ | 18.1 |

[^0]
## Los Angeles



## Miami



## Phoenix

Percent


## Las Vegas

Percent


## Implications of the Homeownership Gap

- How the gap closes depends on:
- Flow into homeownership
- "First-time" buyers (former renters)
- Flow out of homeownership
- Foreclosures, unlikely to lead to continued ownership
- Sale from negative equity, ditto
- In order to remain a homeowner, NE borrower must remain current on mortgage plus save:
- New down payment (20\%-ish)
- Transactions cost (6\%-ish)
- Pay off NE
- Debt amortization helps a little
- But (lots of) additional savings likely required


## Resaving a downpayment

|  | Monthly (\$) | Annual (\$) | Aggregate <br> (\$billion) | \% 42009 Q1 savings <br> (\$464.2 B) |
| :--- | :---: | :---: | :---: | :---: |
| 3 year horizon | 1,436 | 17,232 | 163.9 | 35.3 |
| 5 year horizon | 847 | 10,164 | 96.7 | 20.8 |

## Policy responses: Modifications

- High costs of foreclosure to all parties, possibly including "innocent bystanders"
- Private servicers' traditional response to problems with a borrower is modification
- Add missed payments to balance
- Bring borrower status back to "Current"
- Start over
- 2007/2008: servicers and investors begin wholesale subprime mortgage mods
- 2009: Obama Administration adds a public plan: HAMP
- What are the features of these mods?
- What features are most effective?


## Table 4: Nature of Modifications

| Variable | (a) Total modifications: |  |  |
| :---: | :---: | :---: | :---: |
|  | Reduction | No Change | Increase |
| Monthly payment | 65 | 16 | 19 |
| Balance | 30 | 5 | 64 |
| Excluding small balance reductions | 5 | 30 | 64 |
| Interest rate | 70 | 28 | 2 |

## Table 4: Nature of Modifications - Estimation sample

(d) Dataset used in analysis $(51,626)$

|  | Reduction | No Change | Increase |
| :--- | :---: | :---: | :---: |
| Monthly payment | $\mathbf{1 0 0}$ | - | - |
| Balance | 9 | 0 | 90 |
| Excluding small balance <br> reductions | 7 | 3 | 90 |
| Interest rate | 97 | 3 | 0 |

## Table 4: Nature of Modifications - Estimation sample

(d) Dataset used in analysis $(51,626)$

Average payment reduction: 20\%
Reduction No Change Increase

| Monthly payment | $\mathbf{1 0 0}$ | - | - |
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| :--- | :---: | :---: | :---: |
| Monthly payment | 100 | - | - |
| Balance | 9 | 0 | 90 |
| Excluding small balance | 7 | 3 | 90 |
| reductions | Unusual for mods to "right" underwater borrowers |  |  |
| Interest rate | 97 | 3 | 0 |

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| reductions | Mean balance reduction=20\% |  |  |
| Interest rate | 97 | 3 | 0 |

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Mean rate reduction=300bps

## Kaplan-Meier Survival Plots



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## Kaplan-Meier Survival Plots



## Table 5. Proportional hazard estimates of re-default

Step-function
Cox proportional hazard proportional hazard

| Variable | $(1)$ | $(2)$ | $(3)$ |
| :--- | :---: | :---: | :---: |
|  |  |  |  |
| Reduction in monthly payment | $-0.135^{* *}$ | $-0.128^{* *}$ | $-0.128^{* *}$ |
| $(10 \%)$ | $(0.006)$ | $(0.006)$ | $(0.006)$ |
| Local unemployment rate lagged | 0.002 | 0.009 | 0.009 |
| 6-months less average local rate | $(0.006)$ | $(0.007)$ | $(0.007)$ |
| Current LTV: |  |  |  |
| $100-104$ | $0.237^{* *}$ | $0.218^{* *}$ | $0.218^{* *}$ |
|  | $(0.029)$ | $(0.029)$ | $(0.029)$ |
| $105-109$ | $0.277^{* *}$ | $0.235^{* *}$ | $0.234^{* *}$ |
|  | $(0.034)$ | $(0.034)$ | $(0.034)$ |
| $110-114$ | $0.387^{* *}$ | $0.330^{* *}$ | $0.330^{* *}$ |
|  | $(0.038)$ | $(0.038)$ | $(0.038)$ |
| $115+$ | $0.508^{* *}$ | $0.444^{* *}$ | $0.444^{* *}$ |
|  | $(0.021)$ | $(0.025)$ | $(0.025)$ |

Total at risk months 217,847 . Fixed rate mortgage indicator as well as four property type indicators included. Reference property is a single family residence with an adjustable mortgage with positive equity and an origination FICO score of 620 or higher.
${ }^{* *}$ significant at the 5 percent level ${ }^{*}$ significant at the 10 percent level

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## Probability of re-default within 12 months

| Variable | re-default rate |
| :--- | :---: |
| Reduction in monthly payment | $-0.044^{* *}$ |
| $(10 \%)$ | $(0.002)$ |
| Local unemployment rate lagged 6- | 0.003 |
| months less average local rate | $(0.003)$ |
| Current LTV: |  |
| $100-104$ | $0.076^{* *}$ |
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## Modification Programs and their Effects

| House value | $\$$ | $207,250 \$$ | $169,945 \$$ | 169,945 |
| :--- | :---: | :---: | :---: | ---: |
| Mortgage balance | $\$$ | $200,000 \$$ | $200,000 \$$ | 152,951 |
| LTV |  | 96.5 | 117.7 | 90.0 |
| Interest rate |  | $8.44 \%$ | $5.60 \%$ | $8.24 \%$ |
| Income | $\$$ | $4,341 \$$ | $4,341 \$$ | 4,341 |
| Taxes \& insurance | $\$$ | $207 \$$ | $207 \$$ | 207 |
| Principal \& interest | $\$$ | $1,529 \$$ | $1,148 \$$ | 1,148 |
| PITI | $\$$ | $1,737 \$$ | $1,355 \$$ | 1,355 |
| DTI | 0.40 | 0.31 | 0.31 |  |
| \% decline in payment | --- | $-25 \%$ | $-25 \%$ |  |
| $\Delta \operatorname{Pr}($ Re-default, 12 mo$)$ | --- | $-11.0 \%$ | $-26.5 \%$ |  |

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## Conclusions

- Housing boom-bust cycle pushed many borrowers into negative equity
- Absent increases in house prices, most will remain underwater for years
- Possible effects include
- Reduced mobility
- Reduced maintenance of housing stock
- Reduced participation in local public affairs
- Loss of household wealth will be difficult to recover in medium term (3-5 years)
- Doing so would imply large increases in already elevated savings rates
- And reduced consumption


## Conclusions

- Modification programs are becoming very important
- Borrower equity remains important even after modification
- An effective anti-foreclosure program would exploit this fact
- How general are these results?
- Limitations
- Subprime only
- Voluntary mods are selected
- Hard to draw definitive conclusions about likely effect of HAMP


## END

Reference Slides

## An example - effects of principal mod

(a) Mortgages and Modifications

House value

Mortgage Balance

Interest rate

Mortgage Principal, Interest, Taxes and Insurance (PITI)

Monthly Income

DTI

Original Modification 1 Modification 2
\$ 181,818 \$ 181,818 \$ 181,818
\$ 200,000 \$ 200,000 \$ 181,818
7.0\%
4.8\%
5.6\%
\$ $1,700 \quad \$ \quad 1,382 \quad \$ \quad 1,382$
\$ $4,474 \quad \$ \quad 4,474 \quad \$ \quad 4,474$
$38 \%$
$31 \%$
$31 \%$

## An example - effects of principal mod

| (b) Saving for a new down payment | Original |  | Modification 1 |  | Modification 2 |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Borrower equity after 5 years* | \$ | $(3,822.83)$ | \$ | $(1,312.06)$ | \$ | 13,387.86 |
| Downpayment req'd to buy a house of this price | \$ | 36,363.64 | \$ | 36,363.64 | \$ | 36,363.64 |
| Transactions costs @ 6\% | \$ | 10,909.09 | \$ | 10,909.09 | \$ | 10,909.09 |
| Savings required to buy again in 5 years | \$ | 51,095.55 | \$ | 48,584.78 | \$ | 33,884.86 |
| Savings per month (5 years, assuming $1.6 \%$ interest rate) | \$ | 818.55 | \$ | 778.33 | \$ | 542.84 |
| "Full" housing cost to income ratio** |  | 56.3\% |  | 48.3\% |  | 43.0\% |

## Equity at t

$$
E_{t}=\left[H V_{o}-\sum_{l=1}^{L} M_{o}^{l}\right]+\left[\Delta H V_{t}-\sum_{l=1}^{L} \Delta M_{o}^{l}\right]
$$

## Table 5. Proportional hazard estimates of re-default

Cox proportional hazard

## Step-function proportional <br> hazard

| Variable | $(1)$ | $(2)$ | $(3)$ |
| :--- | :---: | :---: | :---: |
| House price change in 12-months prior to |  | 0.027 | 0.027 |
| modification $(10 \%)$ |  | $(0.018)$ | $(0.018)$ |
| House price index relative to 2000 average | $0.030^{* *}$ | $0.030^{* *}$ |  |
| $(10 \%)$ | $(0.003)$ | $(0.003)$ |  |
| 2-year variance in house price changes (1\%) | -0.005 | -0.004 |  |
|  |  | $(0.037)$ | $(0.037)$ |
| FICO at origination: |  | $0.040^{*}$ | $0.040^{*}$ |
| < 560 | $0.126^{* *}$ | $(0.022)$ | $(0.022)$ |
|  | $(0.022)$ | $0.061^{* *}$ |  |
| $560-589$ | $0.112^{* *}$ | $(0.022)$ |  |
| $590-619$ | $(0.022)$ | $(0.022)$ | 0.019 |
|  | $0.052^{* *}$ | 0.019 | $(0.021)$ |
| Missing | $(0.021)$ | $(0.021)$ | $0.209^{* *}$ |
|  | $0.216^{*}$ | $0.209^{*}$ | $(0.117)$ |
| Months current in year prior to modification | $(0.117)$ | $(0.117)$ | $-0.050^{* *}$ |
|  |  | $-0.050^{* *}$ | $(0.003)$ |
| Full documentation at origination | $(0.003)$ | $-0.152^{* *}$ |  |
|  | $-0.152^{* *}$ | $(0.017)$ |  |
| Age of mortgage (6 months) | $(0.017)$ | $-0.078^{* * *}$ |  |
| $90+$ delinquency rate in MSA (10\%) | $-0.201^{* *}$ | $(0.004)$ |  |


[^0]:    Notes: Current Population Survey data, LPS Applied Analytics and LP data; authors calculations

