

# The Roles of Borrower Private Information and Mortgage Relief Design in Foreclosure Prevention

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# Introduction

- ▶ Perception that mortgage foreclosure **exceeded socially optimal levels** coming out of the 2008 financial crisis
  - ▶ Borrowers and debt holders face significant losses
  - ▶ *7.8 million foreclosures between 2007 and 2016 in the U.S.*

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- ▶ Numerous market frictions have been studied, but open questions remain around **strategic borrower behavior** and the **role of information** in the mortgage renegotiation
- ▶ This project addresses a gap in the literature about the role of information asymmetry in **mortgage debt relief through loan modifications** and how it affects the occurrence of foreclosures

# Research question

**What prevents banks/servicers from granting debt relief to struggling borrowers?**

▶ **Information asymmetry**

Borrowers hold private information about their financial health, creating adverse selection problem

▶ **Transaction costs**

Granting relief is not worthwhile because of large costs associated with screening borrowers and modifying contractual terms

▶ **Relief sufficiency**

Borrowers may need so much relief that debt holders prefer foreclosure

# This paper

## Introduce structural model of foreclosure prevention

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## Study the Home Affordable Modification Program (HAMP)

- ▶ Quantify role of government **incentive payments**
- ▶ Assess level of **relief generosity** under program



# Loan modification under HAMP

	Annual Interest	Term in Years	Principal	Monthly Payments	NPV of Loan
Pre-mod	6.0%	25	\$200K	\$1,289	\$200k
Post-mod	4.5%	40	\$210K	\$944	\$172k

-\$345 per  
month

-14% value  
to creditor

# Loan modification under HAMP

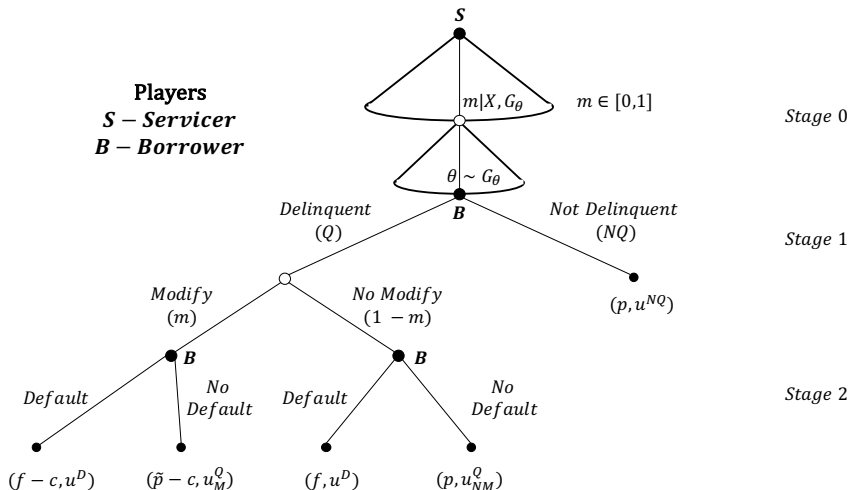
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- ▶ **Borrower HAMP savings:** typically \$300-\$400 per month
- ▶ **Payments to servicers:** Range of \$4,000 to \$6,000 per modification (Agarwal et al. 2017, Hembre 2018)

# Policy-setting game



# Fannie Mae fixed-rate mortgages

## Model estimated with single family loan performance data

- ▶ Californian loans
- ▶ Originated between 2004-2007, follow until December 2019
- ▶ Sample of around 52,000 loans

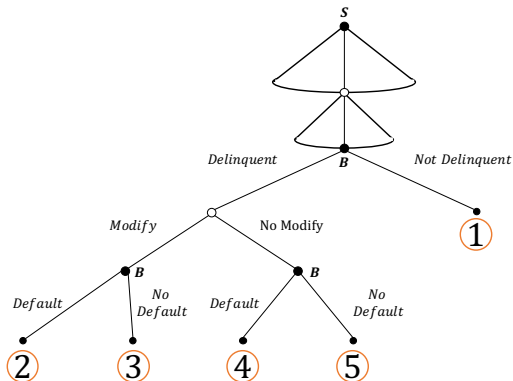
## Loan-level panel

- ▶ Monthly loan characteristics and repayment status
- ▶ Rich borrower characteristics at origination
- ▶ Detailed foreclosure outcomes, including proceeds and costs

## Supplemental data

- ▶ House Price Index from *Federal Housing Finance Agency*
- ▶ Unemployment data from *Bureau of Labor Statistics*

# Simulated Maximum Likelihood



Matching predicted probabilities to observed outcomes:

$$\mathcal{L}(Y, X; \Theta) = \prod_{i=1}^n \prod_{j=1}^5 [\Pr(y_i = j | \mathcal{X}_i, \Theta)^{\mathbb{1}(y_i=j)}]$$

# Findings: Observed outcomes for delinquent loans

		<u>Relief awarded</u>	
		No	Yes
<u>Foreclosure</u>	No	<b>Self-cure: 9%</b>	<b>Cure: 18%</b>
	Yes	<b>Default: 61%</b>	<b>Re-default: 12%</b>

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	Yes	<b>Default:</b> 61% · <i>Always Default:</i> 55% · <i>Needs aid:</i> 6%	<b>Re-default:</b> 12% · <i>Always Default:</i> 12%

**Needs aid** borrowers represent the preventable foreclosures!



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Correct to award relief only when foreclosure is preventable

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# Conclusion

**Debt relief can be a powerful tool** for preventing foreclosure but its effectiveness relies on a number of factors

- ▶ **Information asymmetry** - Key issue for policy design
- ▶ **Transaction costs** - Policy actionable, but may not be effective
- ▶ **Relief sufficiency** - Policy actionable, but will be constrained by relative foreclosure losses

**Many future avenues for research**

- ▶ Relief's effect on long-term borrower composition
- ▶ Importance of timely relief - *Work in progress!*
- ▶ Understanding bank heterogeneity

# Contribution to literature

## **Little work that leverages structural methods to study information in the context of foreclosure prevention**

*In other contexts:* Einav et al. (2007), Hendren (2013, 2017, 2021), Einav et al. (2013), Xin (2020), Marone & Sabety (2022), Matcham (2023), Nelson (2023)

## **Current project adds to literature by:**

- ▶ Modelling the **strategic interaction** between borrowers and their financial institutions
- ▶ Addressing a **new set of channels** potentially undermining relief policy
- ▶ Novel approach for quantifying **drivers of default** and **costs of foreclosure**

# Summary statistics

		Sample Q2 2004-07	All Fannie Mae SF Q2 2004-07
<i>Scale</i>	Geography	California	U.S.
	Observations	51,884	1,102,482
	Total balance (\$)	13 billion	204 billion
	Number of servicers	Top 7 (~80% of CA loans)	17+
<i>Mean origination characteristics</i>	Principal balance (\$)	244.8k	185.4k
	Loan-to-value	59.4%	71.0%
	Credit Score	730.9	722.7
	Debt-to-income	37.3%	37.0%
	Housing price %Δ (2007-11)	-43%	-21%
	Unemployment rate %Δ (2007-11)	135%	102%
<i>Outcome shares</i>	Delinquent (90-days)	15.1%	11.3%
	Modified	4.5%	4.0%
	Foreclosed	10.5%	6.4%

# Borrower utility function

## Repay without delinquency

$$u_i^{NQ} = \underbrace{x_i' \beta + \xi_i + \varepsilon_i}_{\text{Home utility relative to default } (H_i)} \quad - \quad -$$

## Repay with delinquency but without modification

$$u_i^Q | NM = x_i' \beta + \xi_i + \varepsilon_i \quad - \quad -$$

## Repay with delinquency and modification

$$u_i^Q | M = x_i' \beta + \xi_i + \varepsilon_i \quad - \quad -$$

## Default

$$u_i^D = 0 \quad - \quad -$$

■ Unknown to econometrician

■ Unknown to econometrician *and* loan servicer

# Borrower utility function

## Repay without delinquency

$$u_i^{NQ} = \underbrace{x_i' \beta + \xi_i + \varepsilon_i}_{\text{Home utility relative to default } (H_i)} - \underbrace{p_i}_{\text{Payment disutility}}$$

## Repay with delinquency but without modification

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## Repay with delinquency and modification

$$u_i^Q | M = x_i' \beta + \xi_i + \varepsilon_i - \underbrace{\tilde{p}_i}_{\text{Modification disutility}}$$

## Default

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Servicers know about borrower unobservables, causing selection into modification. This creates endogeneity when estimating the causal effect of debt relief

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Identification relies on differences in loan modification rates across servicers that are **unrelated to borrower characteristics** (Agarwal et al. 2011 and Agarwal et al. 2017, Korgaonkar 2022)

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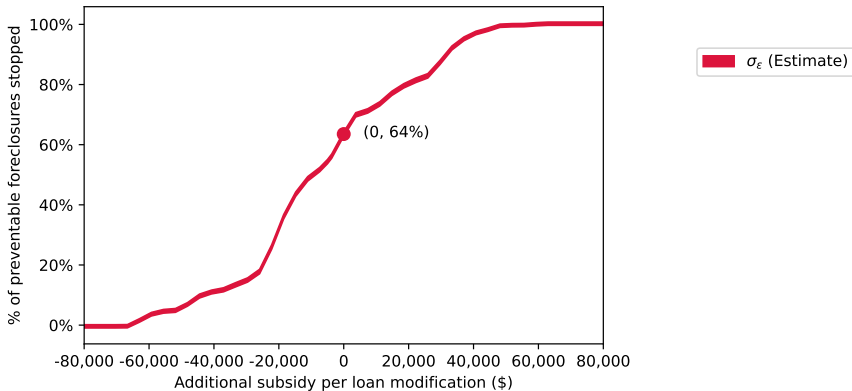
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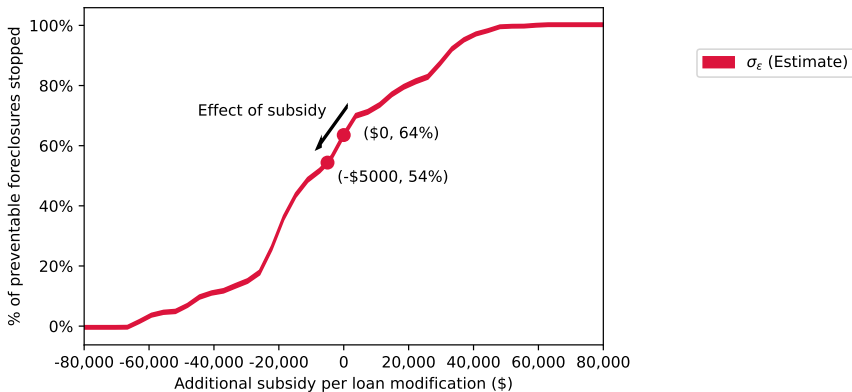
## Key assumptions:

- ▶ *Relevance*: Servicer identity drives differences in modifications rates
- ▶ *Orthogonality*: Unobservable borrower distributions are the same across servicers

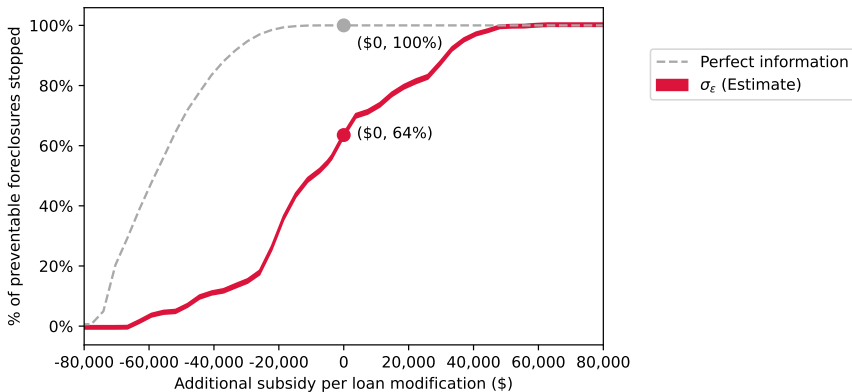
# Information, costs, & foreclosure

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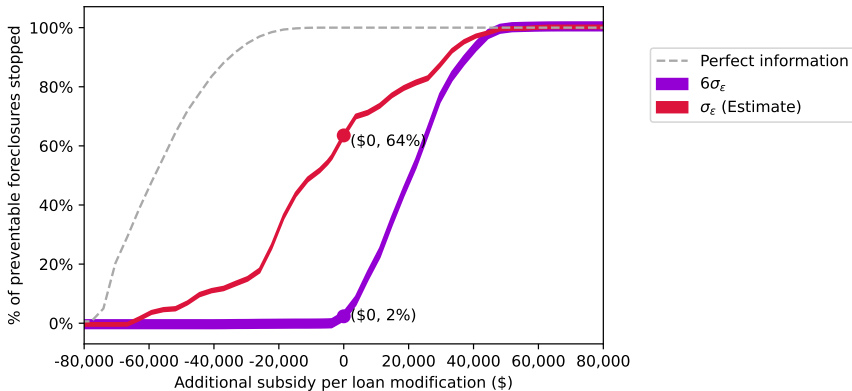
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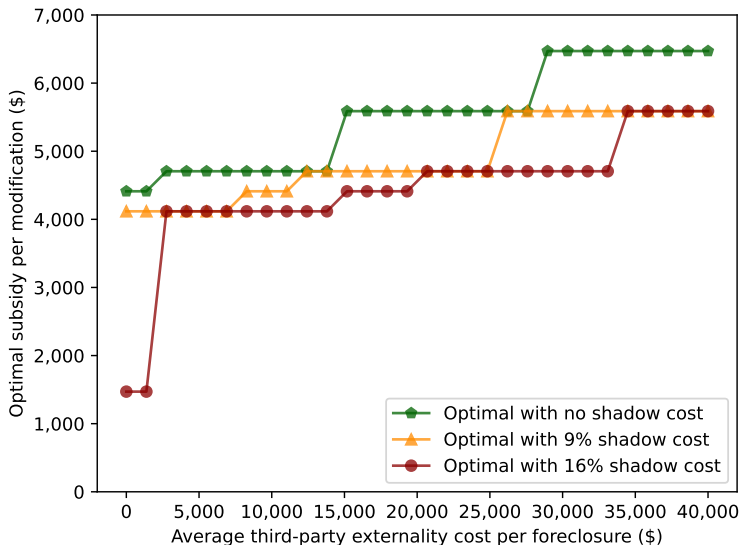
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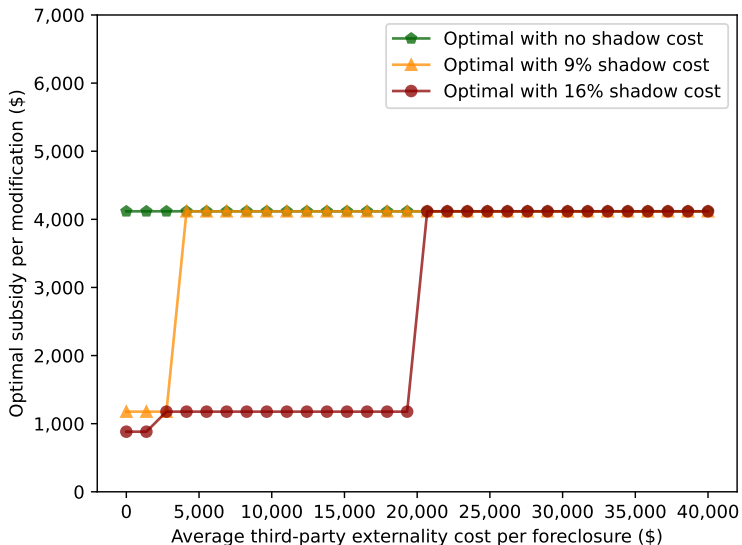
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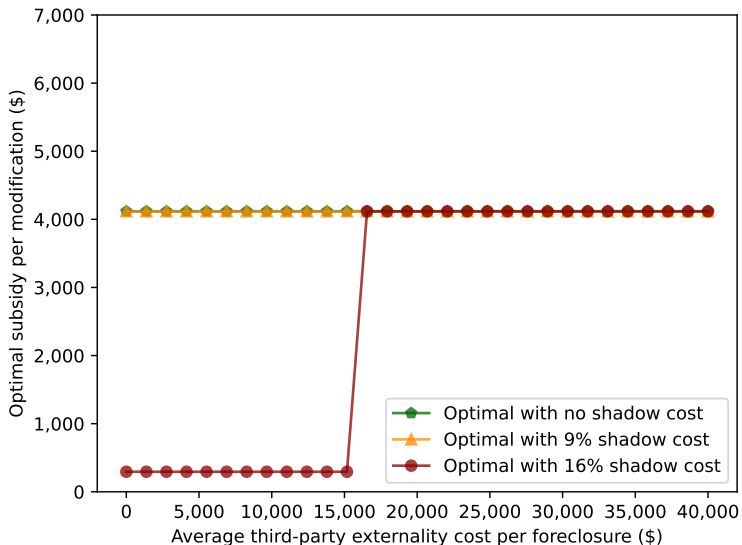
# Subsidies, cost of public funds, and externalities - Q2'04

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