Supervisory Stress Tests, Model Risk, and Model Disclosure: Lessons from OFHEO

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Federal Reserve Bank of Atlanta

Financial Markets Conference April, 9 2013

Disclaimer

• I am speaking today as a researcher and as a concerned citizen

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 - or the Federal Reserve System

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- U.S. started this trend with its 2009 Supervisory Capital Assessment Program (SCAP) which targeted its 19 largest banking organizations.

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- In 2010, the Federal Reserve introduced an annual Comprehensive Capital Assessment and Review (CCAR).
 - Stress testing framework to evaluate capital planning processes and capital adequacy at banking organizations with total assets > \$100 billion.
 - Capital adequacy: Post-stress ratio of common equity to risk-weighted assets > 5%.

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- Introduction of supervisory stress testing requirements may confer substantial benefits.
 - Insight into the portfolio decisions and risk management practices of large financial institutions that could lead to enhanced risk measurement and management.
 - Increased knowledge with respect to system-wide vulnerabilities.
- But, there are inherent risks in stress-testing:

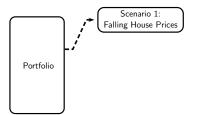
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Portfolio

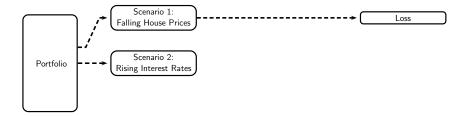
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- (1) Wrong scenario
- (2) Modeling errors
- Or both...



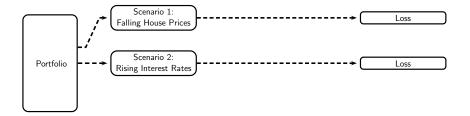
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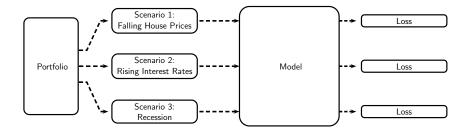
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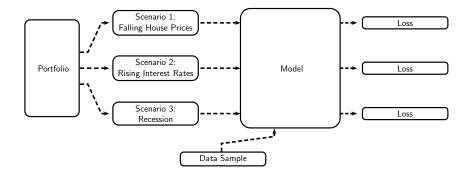


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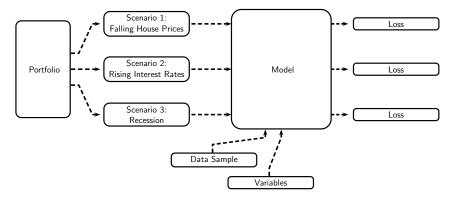
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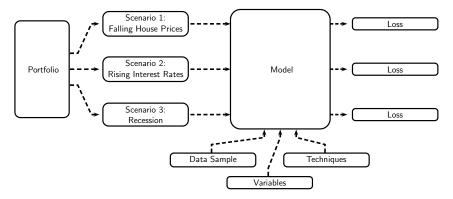
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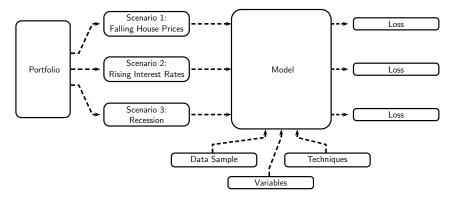
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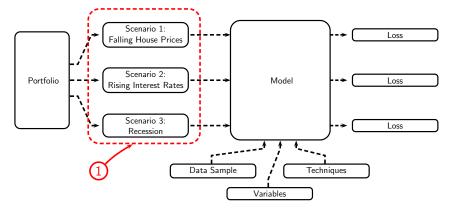
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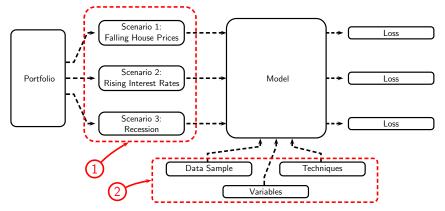
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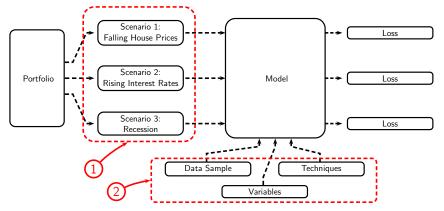


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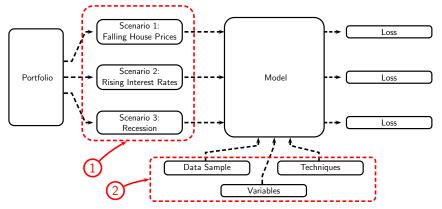
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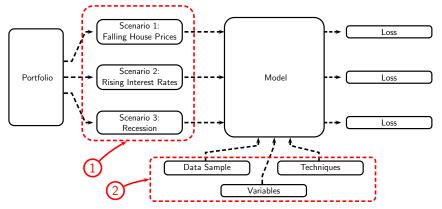
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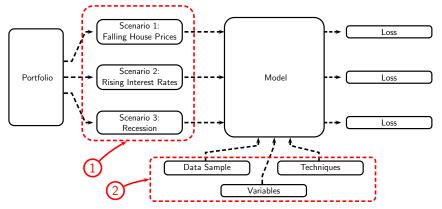
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- FNMA and FHLMC failed, costing taxpayers > \$100 billion.
- What went wrong?

Gerardi (FRB Atlanta)



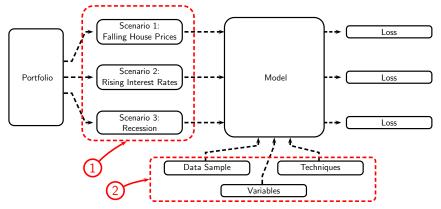
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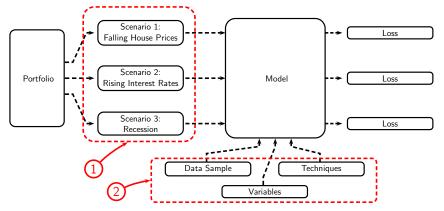
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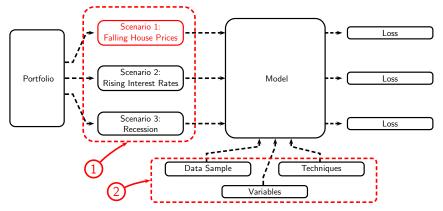
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 - 2 Lack of key variables
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- With (3) by far the most important.
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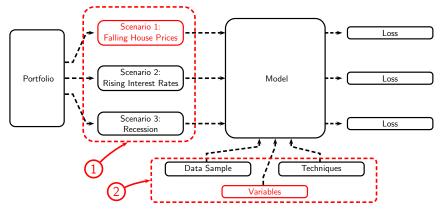
OFHEO Stress Test



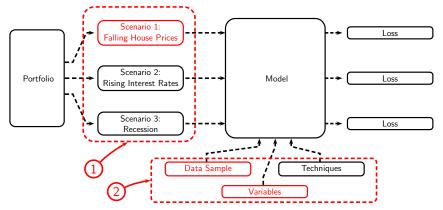
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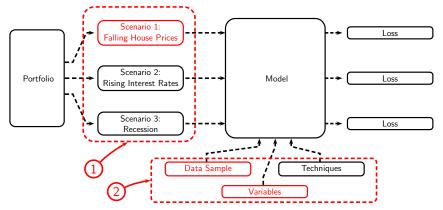
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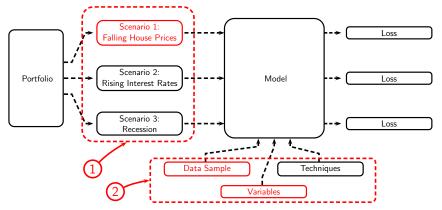
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	Name	Scenario	Loss	Probability
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- Actual HPA: -10% annualized from Q4, 2005 to Q4, 2008
- Forecast losses as of 2/2009 in 2006-1 ABX from JPM: 23.44% (assuming -30% HPA in 2009!)

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 - Risk-based requirement produced by OFHEO and based on a stress test.
 - Capital requirement = max[2.5%, RBC from stress test]
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 - Overall treatment of credit, market, and operational risks.
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 - Assumed no new business.
- Stress applied via house prices and interest rates.
- House price scenario derived from "benchmark loss experience".
 - Based on worst cumulative credit losses originated during a period of two consecutive years in contiguous states with at least five percent of the population.
 - AR + LA + MS + OK = ALMO during 1983-1984. 10-year default rate = 14.9%
- Interest rates: "down rate" and "up rate".
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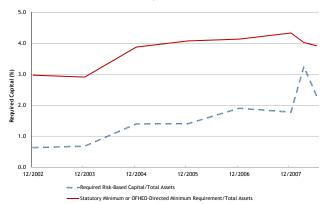
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 Risk-based capital requirement from stress test *never* binding – even in beginning of 2008!



Panel B: Freddie Mac

Timeline of the OFHEO Stress Test

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1996	First Notice of Proposed Rulemaking
1999	Second Notice of Proposed Rulemaking
2001	Final Rule Announced
2002	Stiglitz, Orszag and Orszag conclude that stress test means that risk of insolvency of GSEs is "effectively zero."
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- Focus on single-family, 30-year, FRMs (they account for the vast majority of loans guaranteed by the GSEs).
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• Sample means for LTV and UPB for Fannie Mae loans originated 1995 to 2005:

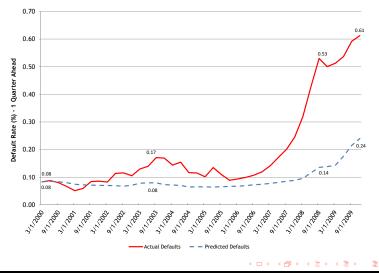
Year	Avg. LTV Ratio (%)		Avg. UPB (\$)		Avg. Interest Rate (%)	
	OFHEO	LPS	OFHEO	LPS	OFHEO	LPS
1995	80.1	79.5	101,518	101,393	8.1	8.6
1996	79.1	77.3	105,059	107,358	8.0	8.1
1997	78.1	78.5	111,398	115,546	7.8	8.0
1998	76.2	78.0	122,646	129,966	7.1	7.1
1999	77.6	76.8	123,600	128,224	7.4	7.2
2000	78.9	77.9	128,041	137,490	8.2	8.1
2001	76.2	74.9	145,435	148,313	7.1	7.1
2002	74.3	74.2	153,982	155,927	6.7	6.7
2003	72.2	72.4	162,743	160,537	5.9	5.9
2004	74.4	70.8	162,513	161,472	6.0	6.0
2005	73.8	72.4	175,886	164,631	6.0	6.1

- Focus on quarterly 1-step ahead forecasts of 30-year FRM default and prepayments based on OFHEO model parameters using LPS data.
 - Also can look at *k*-steps ahead forecasts, which are always significantly worse than the 1-step ahead forecasts.
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• Default Forecasts (1-Quarter Ahead)



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OFHEO Stress Tes

Model Analysis

• Prepayment Forecasts (1-Quarter Ahead)



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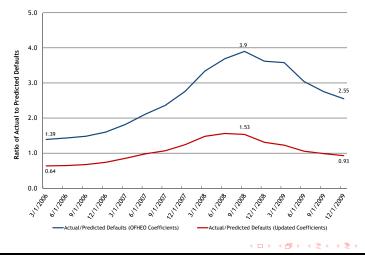
• What if OFHEO had updated their model by simply re-estimating it with newer data?

- Re-estimate OFHEO model with LPS data using 7-year rolling windows (also tried 3 year windows).
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OFHEO Stress Test

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 - More disaggregated house prices (county-level Corelogic indices)
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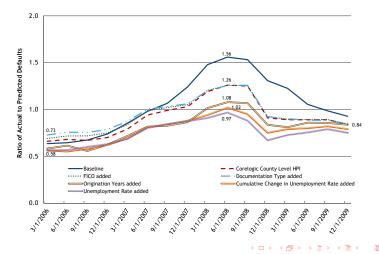
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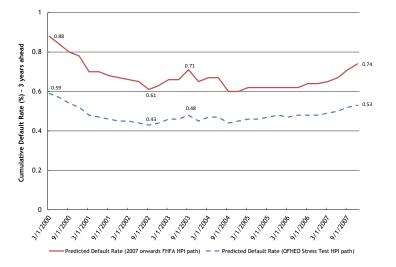
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Concluding Remarks

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