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Residual Mortgage Debt Insurance and Defaults in the Netherlands

Presenter: Mauro Mastrogiacomo

with: Madi Mangan & Hans Bloemen

Bank of Italy 2025

July 4th, 2025

Rome



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Mortgage insurance



In a nutshell

- **Aim:** evaluate effectiveness of residual mortgage insurance (Nationale Hypotheek Garantie NHG) in increasing financial stability, using a microsimulation of the option to default
- **Research question:** Can mortgage insurance impact loan non-performance?
- **Answer:** Yes, the insurance helps lowering mortgage defaults and boosts financial stability.
- But ... there are signals of moral hazard
 - Separations increased among insured, and separated participants default more.
 - Insured borrower prepay less, even when they receive unexpected inheritances.
- **Conclusion**: NHG is valuable, but more efficient with sharper design.

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Residual mortgage debt insurance?

- Managed by a fund (Stichting Waarborgfonds Eigen Woningen), that is government-backed, and takes on residual debt upon selling the house.
- Mortgage providers co-pay in case of loss of the fund.
- Only for borrowers who buy houses under a varying price threshold
- Eligibility: unemployment, separation, disability, death.
- Defaulting on loans is not a necessary condition for the insurance to pay out.
- Insured borrowers receive insurance & bottom interest rate. But:
 - They must amortize at least 50%
 - Respect LTI-cap
 - Fix interest rate for at least 10 years

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Layout

- **Structural approach**: modeling default as an optimal decisions.
- **Microsimulation**: option value setting, where revealed preferences are assumed optimal and non-chosen alternatives must be simulated.
- **Validation**: quasi-natural experiment (RDD) of defaults based on institutional discontinuity at the insurance threshold.
- Study of separations and prepayments around the threshold, including inheritances.

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Related Literature

• Mortgage Default

- Liquidity Defaults
 - Mian and Sufi 2011, 2013, 2014.
 - Adelino, Schoar, and Severino 2016

2 Strategic Default

- Gerardi et al. 2018 Gerardi et al. 2013 can pay but wouldn't pay very rare
- Guiso, Sapienza, and Zingales 2013, Riley 2013, Mayer et al. 2014 no recourse mortgages
- little evidence about NHG Kim et al. 2022, Haan and Mastrogiacomo 2020

Optimal Stopping Model

- Foster and Van Order 1984, 1985
- Campbell and Cocco 2015 dynamic model of households' mortgage decisions
- Hatchondo, Martinez, and Sánchez 2015 Life-cycle model with house-price risk

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Data

• Loan-level-data (LLD) collected by DNB. (2012-2018)

- Credit-register type of data (with retrospective information (11 years: 2007-2018)
- Unique information: account status, insurance, prepayments, plus 60 more loan and borrowers characteristics (LTV, LTI, origination, interest rate percentage ...)

• Linked to admin data, using pre-loading by tax office, by CBS:.

- Registry data; household composition
- Social security registry: current employment status
- Tax data: income and wealth
- Transfer data: inheritances
- ... data collection requested a modification of Dutch law, **but ...**

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Descriptives 1: threshold and prices

- Threshold does not follow predictable pattern
- First slightly above average purchase prices
- Significantly surpassed average prices during crisis (almost all sold houses qualified)
- Eventually settled below prices



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Descriptives 2: an offer one cannot refuse?

- During crisis take-up rate was almost 100%
- This implies little room for adverse selection in insurance.





Descriptives 3: defaults around the threshold

- Non-performance low by international standards
- Negative slope at the left of the threshold (effect of affordability?)
- Defaults jump up at the right of the threshold
- No slope at the right



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Image: A math

Ancillary

DP vs Option Value Model

- DP: Default is a result of optimizing behaviour of the borrower.
 - Inter-temporal choice, optimal path to default within given period.
 - We do not observe all possible periods, so no further results presented here.
- Option value: at each period, borrower decides whether to pay their mortgage or default, considering the lifetime return of each action.
 - Defaulted borrower have to pay rent for ever, can exploit different fiscal facilities/subsidies that affect their gross-net trajectory.
 - otherwise, they make the same decision the following period.
- Model delivers the marginal utility of present and future consumption

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Estimation results

	All	Α	Age		yment	Туре о	of House	Location	
		≤ 35	>35	Employees	Others	Detached	Apartment	Randstad	Other
Consumption	2.853***	19.57***	1.108***	3.797***	0.695***	2.893***	2.886***	2.857***	2.944***
Home Equity	0.0174***	-0.170***	0.229***	-0.017***	1.100***	0.0649***	-0.0747***	-0.087***	0.0368***
Age	-0.001***	-0.491***	0.0173***	-0.024***	0.003***	-0.012***	-0.009***	-0.026***	-0.001***
NHG	3.906***	1.962***	4.650***	3.262***	9.194***	4.881***	1.593***	1.365***	4.310***
а	-21.57								
Observations	4 805 933	$1 \ 031 \ 592$	$3 \ 774 \ 341$	3 830 937	974 996	3 689 279	$1 \ 116 \ 654$	507 375	$4 \ 298 \ 558$

✤ rental price

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RDD ba	sic set	ир				
		$Y_{d_{ii}} = \alpha + \beta_1 u$	$w_{i,t} + \beta_2 NHG_i + \beta_3 N_i$	HG _i * uw _{i.t} + a	U	

Where *NHG* = 1 indicates participation and *uw* = underwater status

NHG threshold qualifies as a sharp cutoff point (c) that allows assignment to treatment. The assignment variable is the value of the house at purchase h_{i1} and the treatment status implies that $NHG = 1[h_1 < c]$.

Two assumptions are relevant:

- treatment effect is constant (it does not differ by household),
- Continuity, s.t. unobservables v imply that $E(v_i | h_{i1} = h_1)$ is continuous in h_1 .

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Smoothness around threshold (2014)



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Quasi Natural Experiment

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Effect (around the threshold)

		Drop 5%	Drop 10%	Drop at	Drop 5000 EUR
	All	tails	tails	threshold	from threshold
Underwater (β1)	0.0355***	0.0351***	0.0351***	0.0355***	0.0353***
NHG (β2)	-0.0005*	-0.0006**	-0.0009***	-0.0005*	-0.0004
NHG * underwater (β₃)	-0.0179***	-0.0211***	-0.0215***	-0.0178***	-0.0173***
Constant	0.0129***	0.0131***	0.0130***	0.0129***	0.0129***
Observations	1 594 766	1 261 260	1 120 874	1 569 792	1 522 232
R-squared	0.0090	0.0091	0.0094	0.0090	0.0089

robustness

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Qualification criteria

Honoured claims of NHG participants by qualification criteria (left), versus national separation and unemployment rate (right)



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Augmented model

$$Y_{d_{it}} = lpha + eta_1 u w_{i,t} + eta_2 NHG_i + eta_3 NHG_i * u w_{i,t} + eta_3 NHG_i + eta_3 NHG_i$$

 β_4 separated + β_5 NHG * separated +

 β_{6} unemployed + β_{7} NHG * unemployed + $\delta X_{i,t} + v$

- Separating is (partly) a choice within the household.
- Other criteria like disability, death, and unemployment are (usually) involuntary.
- If no effect of insurance, we would expect no significant difference in defaults between those separating or not with and without insurance.
- in *X* we also add risk triggers and other characteristics

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Quasi Natural Experiment

Augmented model results

	201	2-2018
	Model A	Model B
Underwater (β 1)	0.0293^{***}	0.0223^{***}
NHG $(\beta 2)$	-0.0024***	-0.0056***
NHG $*$ underwater (β 3)	-0.0157***	-0.0140***
Separated (β4)	0.0042^{***}	0.0003
Separated*NHG (β5)	0.0007*	0.0016***
Unemployed (β6)	0.0129^{***}	0.0097^{***}
Unemployed * NHG (β 7)	0.0075***	0.0077^{***}
Debt service to income ratio		0.0016^{***}
Income (ihs)		-0.0099***
Assets (ihs)		-0.0027***
LTV at origination		0.0121^{***}
Current age		-0.0006***
Self-employed at origination		0.0058^{***}
Dummies for year of origination	yes	yes
Year of birth dummies	yes	yes
Constant	0.0278***	0.1737***
Observations	10,108,840	10,108,840
R-squared	0.0093	0.0128



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Prepayments

- Prepayments can reduce potential residual debt
- NHG insured are less wealthy, lower prepayments only indicative near threshold?
- Inheritances could induce prepayments, but insured could be less likely to expect/receive one.
- "Unexpected" inheritances should be less endogenous.
 - Inheritances & transfers micro data 2007-2018
 - All inheritances > 6000 euro
- Prepayment rate = (cumulative prepayments) / (original debt)

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Prepayment discontinuity





Prepayments: wrap up

- Progressive levels of exogeneity: inheritances, unexpected inheritances, NHG threshold.
- All checks reveal that NHG induces 3% lower prepayment rate
- Checks: inheritance vs gifts, age of unexpected death, bandwidth around and away from threshold. •• checks
- Specifications including bank dummies correct for prepayment fees.
- Conclusion: residual debt insurance induces borrowers to prepay less, and increases therefore their likelihood to be/stay underwater.

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Conclusions

- NHG is a valuable tool to stabilize the housing market, as it sets higher lending standards and reduces defaults.
- Does the design need sharpening? Moral hazard could play a role:
 - in increasing separations
 - in disincentivizing prepayments
- Options:
 - Upfront: make premium depend on riskiness? or (draconically) remove separation from qualification criteria?
 - Ex-post: introduce co-payment? or conditionality on repayment capacity?
 - Do nothing: we accept a "moderate" amount of moral hazard.
- During the crisis little role for adverse selection, but now participation is dropping: should we remove the threshold?

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Prepayment share by bank





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Quasi Natural Experiment

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Checks: prepayment rate

	Coefficient <i>NHG</i>	Coefficient NHG × inheritance	N		Coefficient <i>NHG</i>	Coefficient NHG × inheritance	N
Baseline Estimation(NHG × Inheritance)	-0.0285***	-0.0079***	656 159	Rich parents dummy × Inheritance	0.0099***	0.0018	390 279
NHG × Unexpected Inheritance:died before 70(65)	-0.0283***	-0.013***	597 795	Close to the threshold(\pm 200,000)	-0.0251***	-0.0097***	552 717
NHG × Unexpected Inheritance:died before 65(60)	-0.0283***	-0.018***	592 169	Loans that originate since 2007	-0.0279***	-0.0076***	433 998
NHG × Unexpected Inheritance:died before 75(70)	-0.0283***	-0.009***	604 966	Loans that originate since 2013	-0.0217***	-0.0051***	192 773
NHG × Transfer	-0.0285***	-0.0050***	656 159	Add amount inherited	-0.0286***	-0.0072***	656 159
NHG × Inheritance after buying houses	-0.0288***	-0.0048***	635 481	Add bank dummy	-0.0267***	-0.0085***	656 159
NHG × Gift	-0.0291***	-0.0004	656 159				





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Competing qualification criteria

Unemployment and disability hazards do not show significant discontinuity at the threshold. (* back)



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Model	NHG*underwater (β3)
Baseline	-0.0141***
Robustness checks:	
Dropping 5% tail	-0.0170***
Dropping 10% tail	-0.0175***
Drop observation €5000 from threshold	-0.0134***
Drop observation €10000 from threshold	-0.0123***
Observations within €50000 from threshold	-0.0165***
Placebo tests:	
Treatment: income above €40000	0.0370***
Treatment: income above €60000	0.0130***
Treatment: fin. wealth above €50000	0.0041
Treatment: fin. wealth above €100000	0.0277***

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Policy simulations for share of defaults based on 2014 data

	Predicted defaults	St. Dev.
Baseline model	2.04%	0.0183
NHG threshold increases by 10000 euro	1.86%	0.0183
NHG threshold increases by 50000 euro	1.80%	0.0182
NHG threshold increases by 100000 euro	1.76%	0.0182
LTI limit increases by 10%	2.19%	0.0181
LTI limit increases by 20%	2.23%	0.0185
LTI limit increases by 30%	2.47%	0.0189
LTV at origination increase by 10%	2.17%	0.0187
LTV at origination increase by 20%	2.31%	0.0192
LTV at origination increase by 30%	2.47%	0.0197

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Sensitivity analysis: rental prices

In baseline model we assume that alternative rental price is 25% of gross income. This is very low by current market conditions, and corresponds to prudential DSTI share (NIBUD) for purchase. • back

	Rent as a percentage of total household income						
	22%	25%	28%	30%	34%	38%	
Consumption	-0.679***	2.853***	2.870***	3.723***	4.008***	3.218^{***}	
Home Equity	0.0170***	0.0174***	0.0165***	0.0204***	0.0231***	0.0259***	
Age	0.0261***	-0.00988***	-0.00900***	-0.0251***	-0.0348***	-0.0261***	
NHG	5.042***	3.906***	3.559***	3.235***	2.448***	2.032***	

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