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EUROSYSTÈME

Stress Testing Results: Implications for the Luxembourg Banking Sector



What is Stress Testing?

- The recent turmoil has underscored the need for improved macroprudential surveillance by national central banks
- Stress testing is one supervisory tool that can be used to this effect
- Stress testing refers to a range of techniques used to assess the vulnerability of a financial system to « exceptional but plausible » macroeconomic shocks



Methodological Approaches to Stress Testing

Stress Testing Methodologies

« Piecewise » Approach

Evaluates the vulnerability of the financial sector to a single risk-factor using FSIs

« Integrated » Approach

Evaluates the vulnerability of the financial system to *multiple risk-factors* using a single estimate of the PDF of aggregate losses under an **adverse** scenario

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Stress Testing: Procedural Overview

Stress testing is performed in the following manner:



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Scope of the Economic Model

To assess the vulnerability of the Luxembourg financial sector, the model incorporates the following macroeconomic equations:

Probability of default

Luxembourg real GDP growth

- **> Euro area real GDP growth**
- Real interest rate
- Property price index
- SX5E index



Stress Testing Model

- First we develop a stress testing framework based on the work of Wong, Choi and Fong (2006):
 - Wong, J., Choi, K., and Fong, T. (2006) "A framework for stress testing banks' credit risk", Hong Kong Monetary Authority Working Paper
- We use a SUR system to assess the impact of default in other sectors on the Luxembourg banking sector
- The SUR system allows us to capture any contemporaneous correlation structure between the macro variables used in the model
- The model structure consists of 6 equations that include lagged exogenous variables



Equation Specification



 $\mathbf{x}_{t} = \mathbf{n} + \mathbf{B}_{1}\mathbf{x}_{t-1} + \ldots + \mathbf{B}_{p}\mathbf{x}_{t-p} + \ldots$ $\mathbf{\Theta}_1 \mathbf{y}_{t-1} + \ldots + \mathbf{\Theta}_q \mathbf{y}_{t-q} + \mathbf{\varepsilon}_t$



Transform the Default Probabilities

The default probabilities must be transformed from [0,1] to R





So p and y are negatively related (y large → credit risk is low)

Define the Aggregate Balance Sheet

- We define the aggregate balance sheet to incorporate all banks in the Luxembourg banking sector
- The sample period covers the range from 1995Q1 until 2009Q3
- The observations consist of quarterly proxies for the counterparty probability of default
- These are approximated using a ratio between provisions on loans and total loans over all sectors



Calibrate the Adverse Scenarios

- For each scenario we apply exogenous shocks over 4 consecutive quarters for the period spanning 2010Q1 until 2010Q4
- The respective magnitudes of the shocks used are as follows:
 - 1. Negative shocks to Luxembourg real GDP growth of magnitude:

> (-0.04, -0.04, -0.04, -0.04)

2. Negative shocks to the Euro area real GDP growth of magnitude:

(-0.01, -0.01, -0.005, 0.00)

3. An increase in the real interest rate of magnitude:

(0.02, 0.00, 0.01, 0.00)

- 4. A reduction in real property prices of magnitude:
 - (-0.02, -0.02, -0.02, -0.02)



Quantify the Impact on the Aggregate Portfolio

- We perform the stress-testing exercise by simulating 10,000 future paths for the aggregated counterparties' probability of default
- The Monte Carlo simulations begin in the 4th quarter of 2009 and end in the 4th quarter of 2011 (a horizon length of 9 quarters is used)
- End-of-horizon adverse scenario default probabilities are then compared to the baseline values to estimate the effect of macroeconomic variables on the counterparty probability of default

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Stress Test Results





Probability of Default Distributions Under Various Shocks



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The Effect of the Shocks on the Probability of Default Distributions

- Shocks to Luxembourg real GDP increase the mean baseline probability of default from 1.31% to 1.46% under the adverse scenario
- Shocks to Euro area real GDP increase the mean baseline probability of default from 1.31% to 1.62% under the adverse scenario
- Shocks to the real interest rate increase the mean baseline probability of default from 1.31% to 1.58% under the adverse scenario
- Shocks to Luxembourg real property prices increase the mean baseline probability of default from 1.31% to 1.61% under the adverse scenario

Basel II Tier I Ratios

Capital requirements for corporate exposures under the stressed scenario are calculated using:

$$k_c^* = \left(LGD \times N \left[\frac{G(PD)}{\sqrt{(1-R_c)}} + \left(\frac{R_c}{(1-R_c)}\right)^{\frac{1}{2}} \times G(0.999)\right] - PD \times LGD \right) \times \left(\frac{1}{1-1.5b}\right)$$

Stressed Basel II capital ratio is given by:

$$capital \ ratio = \frac{K + \Pi}{RWA - 12.5E^{c} \left(k_{c} - k_{c}^{*}\right)}$$



Effect on Basel II Tier 1 Capital Ratios



- Regardless of the scenario, all Basel II Tier 1 capital ratios remain above the required minimum of 4%
- The largest impact on capital ratios results from negative shocks to Euro area real GDP growth
- Negative shocks to Luxembourg's real GDP growth have the smallest impact on Basel II capital ratios

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Conclusions (Sector Aggregate)

- Under all scenarios, the average probability of default is observed to *increase* in comparison to the baseline scenario average of 1.31%
- Under the exceptional but plausible scenarios utilized, the Luxembourg banking sector remains robust in terms of Basel II Tier 1 capital ratios
- Basel II Tier 1 capital ratios for the aggregate financial sector remain above the required minimum of 4% irrespective of the adverse scenario employed





Stress Testing of the 5 Largest Banks





The Five Systemic Banks

- The aggregate stress testing framework was applied to the 5 largest banks in Luxembourg
- These banks were ranked based on total assets
- > The banks subjected to the stress testing were:
 - Bank 1
 - Bank 2
 - Bank 3
 - Bank 4
 - Bank 5



Performance Under Adverse and Baseline **Scenarios**

LU GDP



EA GDP

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Effect of Macroeconomic Variable Shocks on the Probability of Default

- Bank 4 and Bank 5 have very low probabilities of default - on the order of 0.1% to 0.2%
- All 5 banks remain resilient to exogenous shocks in the Luxembourg real GDP growth rate

All 5 banks are noticeably affected by shocks to Euro area real GDP growth and a reduction in real property prices

Probability of default distributions under the adverse scenario are sensitive to the real interest rate

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Effect on Basel II Tier 1 Capital Ratios

Bank		Stressed Scenario			
	Baseline	LU GDP	EA GDP	Int. Rate	Property
Bank 1	0.107	0.106	0.100	0.102	0.100
Bank 2	0.137	0.127	0.116	0.120	0.116
Bank 3	0.343	0.332	0.315	0.321	0.315
Bank 4	0.162	0.160	0.154	0.156	0.154
Bank 5	0.154	0.151	0.143	0.146	0.143

Findings

- > All banks retain a Tier I capital ratio above the minimum level of 4%
- Adverse shocks to Euro area real GDP growth and a decline in the property price index affect capital ratios the most significantly
- Adverse shocks to the real interest rate affect capitalization ratios, but shocks to Luxembourg real GDP growth have only a small effect on Tier 1 capital ratios
- Bank 1 and Bank 4 appear robust under the adverse scenarios considered
- Differences in individual bank capitalization ratios can be primarily attributed to individual levels of exposure



Thank you for your attention

