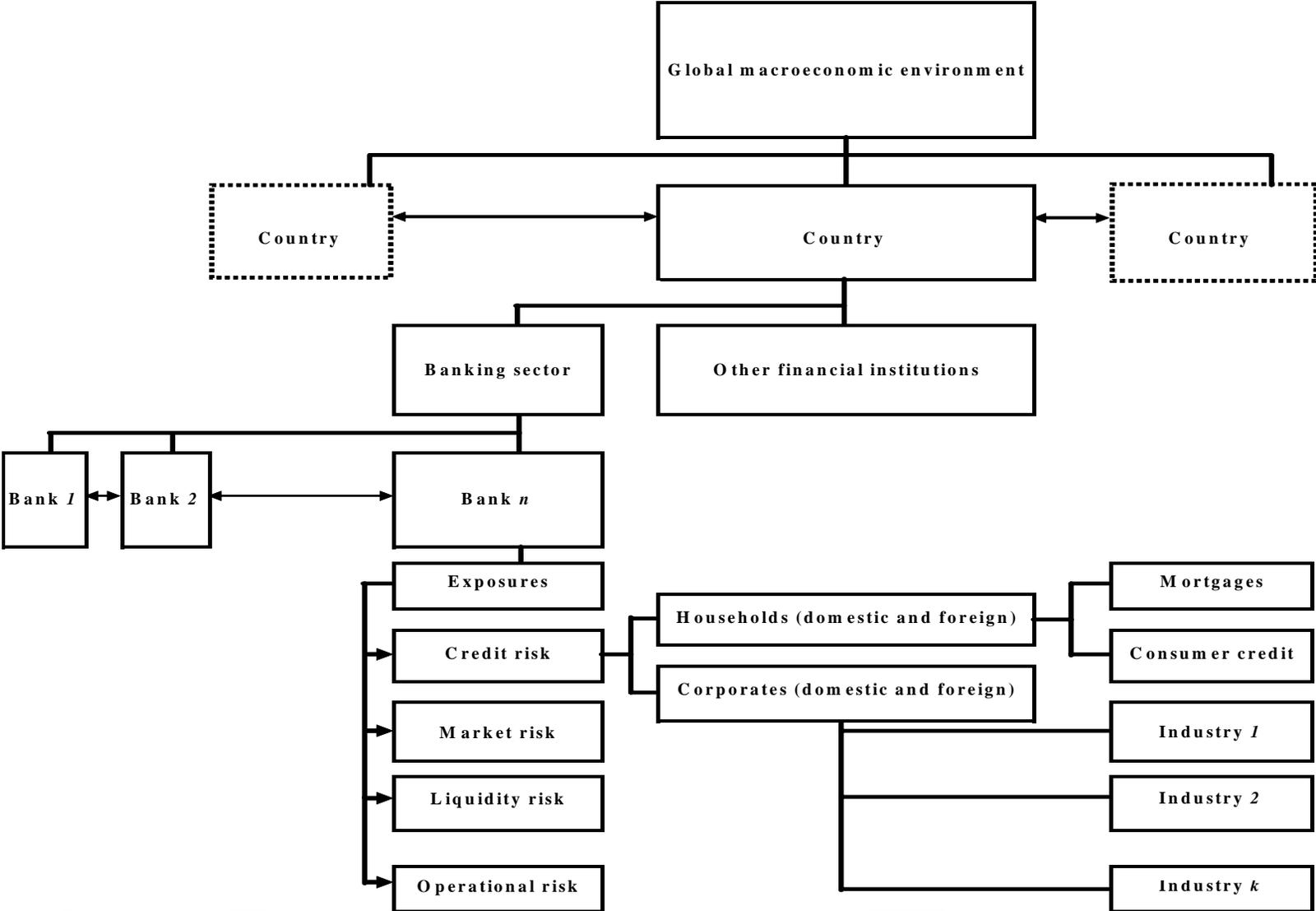


# ***Global macro-financial shocks and corporate sector expected default frequencies in the euro area***

June 2007

Olli Castrén, Stephane Déés and Fadi Zaher

# Background: financial sector stress testing



# Motivation

- **The world has become more financially integrated and firms and banks are operating in the global marketplace**
- **Large euro area banks are active in corporate lending in many countries of the euro area; corporate borrowers are often large firms with global exposures**
- **A framework linking indicators of corporate sector credit quality to a global macroeconomic model is useful:**
  - **For large banks to calculate their capital buffers**
  - **For central banks and supervisors to assess resilience at systemic level**

# Previous Literature on Macro-VARs & PDs

- **Pesaran et al. (2004): Conditional loss distributions of a credit portfolio in different regions of the world**
- **Alves (2005) and Shahnazarian and Åsberg-Sommer (2007): Corporate sector EDFs in a macroeconomic VAR model**
- **Jacobson et al. (2005): Interactions between firms' balance sheets & the evolution of the economy**
- **Drehmann et al. (2005): Non-linear VAR for corporate sector credit risks**
- **Aspachs et al. (2006): Interaction between bank equity value & bank PDs and the UK macroeconomy**

# Our approach in a nutshell

- To quantify the impact of domestic and global macroeconomic shocks on the aggregate and the sectoral EDFs of the euro area
- Combination of:
  - 1) A structural default model (Moody's KMV based on the Merton (1974) approach)
  - 2) An internal ECB macro-econometric model (Global VAR by Déés et al. (2007))
- Construct a linking equation to the GVAR model, which isolates the EDF from the global system
- The GVAR model + the linking equation of the EDF => Satellite GVAR model

# Benefits of the Satellite approach

- **Can combine a complex global macro model with a simple equation for EDFs in one country, with possibly different time series length**
- **Isolates the credit risk assessment from the macro assessment, thus avoiding inference of complex and controversial feedbacks**
- **Can easily experiment with various specifications for the satellite equation (e.g. non-linearities, heterogeneity...), without messing up the features of the macro model**

# A Primary of Global VAR (GVAR)

- **Macroeconomic policy analysis and financial risk management require taking account of the increasing interdependencies that exist across markets and countries**
- **Also financial stability issues need to be considered from a global perspective; this invariably means that many different channels of transmission must be taken into account**
- **The GVAR provides a convenient and intuitive solution to the modeling of complex high dimensional systems**
- **Other possibilities: structural models and common factor models**

# A Primary of Global VAR (GVAR)

- o The GVAR approach models the interlinkages using trade-weighted observable macroeconomic aggregates and financial variables
- o The GVAR is composed of individual country VARX\* models in which the core domestic variables are related to country-specific foreign variables

$$x_{it} = a_{i0} + a_{i1}t + \Phi_i x_{i,t-1} + \Lambda_{i0} x_{i,t}^* \\ + \Lambda_{i1} x_{i,t-1}^* + \Psi_{i0} d_t + \Psi_{i1} d_{t-1} + \varepsilon_{it}$$

for  $t=1,2,\dots,T$  and  $i=0,1,2,\dots,N$ .

# The Satellite model for EDFs

- Formulate an equation where the endogenous variables of the GVAR are exogenous variables to the Satellite model
- The endogenous variable  $z_t$  in the Satellite model is the EDF for corporate sector  $j$

$$z_{jt} = b_{j0} + b_{j1}x_t + \varepsilon_t$$

- In practice, the  $x_t$  variables in the Satellite model are the domestic variables of the euro area block of the GVAR, expressed in first differences

# Satellite-GVAR: Four steps

- **1) Estimate the GVAR**
- **2) Subject the GVAR to shocks to generate impulse response functions (GIRs)**
- **3) Separately, estimate the parameters of the Satellite model (we use 5 out of 7 factors)**
- **4) Simulate the reactions of the endogenous variable of the Satellite model (EDFs) with the estimated parameters of the Satellite model and the shocks from the GVAR**

# Data

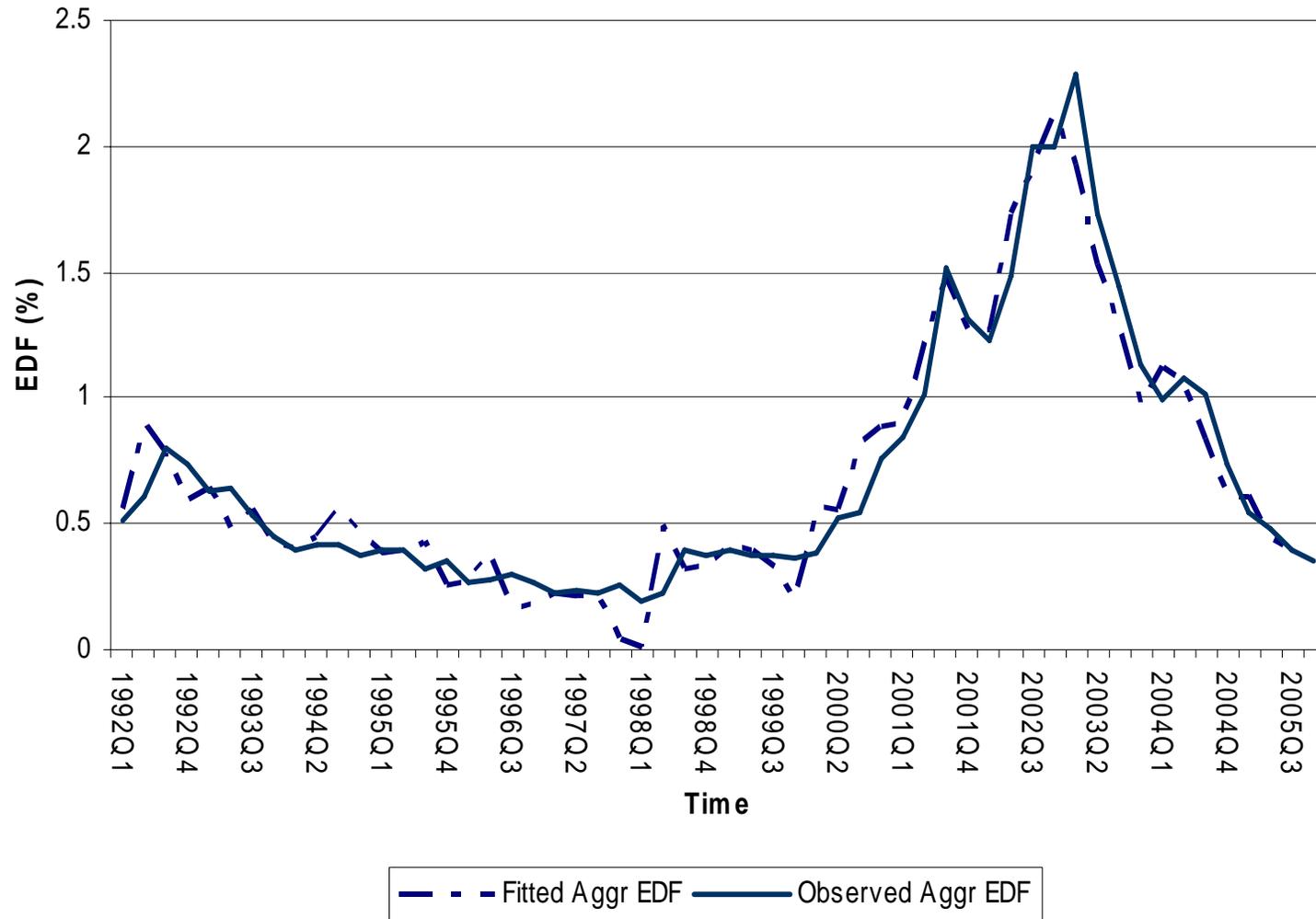
- **GVAR data includes 33 countries with the euro area comprising 8 of the 11 countries that joined in 1999**
- **For each country in the GVAR, the variables include GDP, CPI, Equity price, USD FX, SR & LR interest rates. Oil price is a common (global) variable for all countries. Sample period 1979 Q1-2005 Q4**
- **Data on aggregate and 7 sectoral corporate EDFs in the euro area 1992-2005. Source: Moody's KMV**
- **The most parsimonious specification of the Satellite equation includes 5 of the 7 "risk factors" (exogenous variables) from the GVAR**

# Estimation of the Satellite model

$$EDF_t = \alpha + \beta_1 \Delta GDP_t + \beta_2 \Delta CPI_t + \beta_3 \Delta EQ_t + \beta_4 \Delta EP_t + \beta_5 \Delta IR_t$$

|             |      | Const | GDP    | INFL   | EQUITY | EP     | IR     |
|-------------|------|-------|--------|--------|--------|--------|--------|
| <b>Aggr</b> | beta | 0.853 | -0.350 | -0.054 | -0.018 | -0.028 | -0.010 |
|             | Pval | 0.000 | 0.040  | 0.823  | 0.020  | 0.077  | 0.228  |
| <b>BaC</b>  | beta | 0.663 | -0.285 | 0.161  | -0.014 | -0.012 | -0.007 |
|             | Pval | 0.000 | 0.006  | 0.268  | 0.003  | 0.198  | 0.146  |
| <b>Cap</b>  | beta | 1.167 | -0.465 | -0.097 | -0.022 | -0.034 | -0.011 |
|             | Pval | 0.000 | 0.030  | 0.749  | 0.025  | 0.089  | 0.268  |
| <b>CCy</b>  | beta | 0.679 | -0.266 | 0.018  | -0.015 | -0.017 | -0.006 |
|             | Pval | 0.000 | 0.022  | 0.915  | 0.005  | 0.120  | 0.270  |
| <b>CNC</b>  | beta | 0.520 | -0.117 | -0.100 | -0.010 | -0.012 | -0.003 |
|             | Pval | 0.000 | 0.235  | 0.485  | 0.026  | 0.206  | 0.558  |
| <b>EnU</b>  | beta | 0.160 | -0.047 | 0.031  | -0.005 | -0.002 | 0.000  |
|             | Pval | 0.000 | 0.080  | 0.421  | 0.000  | 0.332  | 0.737  |
| <b>Fin</b>  | beta | 0.168 | -0.030 | 0.081  | -0.003 | -0.002 | -0.001 |
|             | Pval | 0.000 | 0.118  | 0.005  | 0.001  | 0.196  | 0.404  |
| <b>TMT</b>  | beta | 2.385 | -1.179 | -0.831 | -0.062 | -0.135 | -0.038 |
|             | Pval | 0.006 | 0.108  | 0.433  | 0.066  | 0.052  | 0.272  |

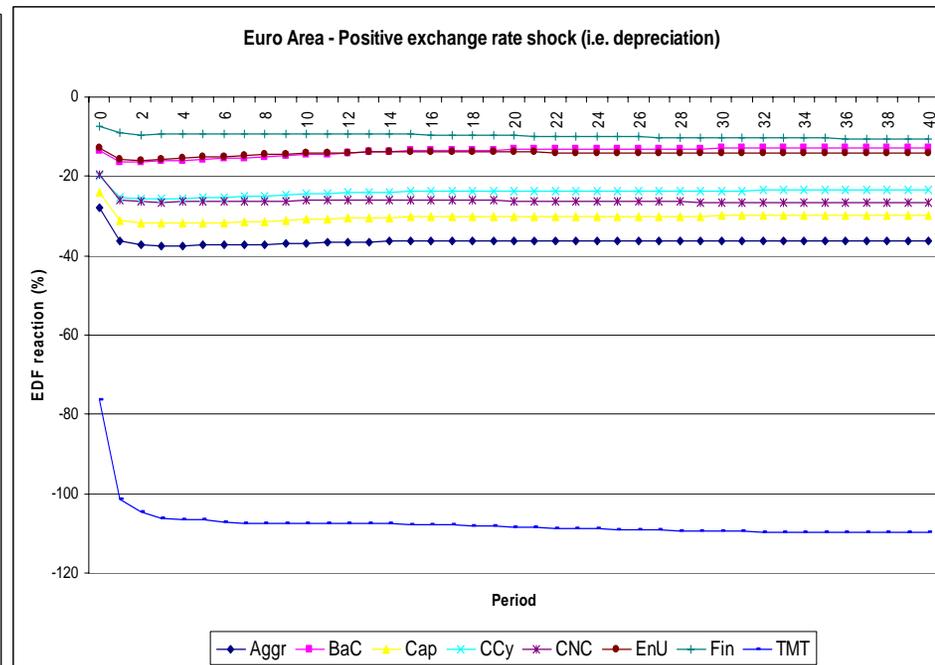
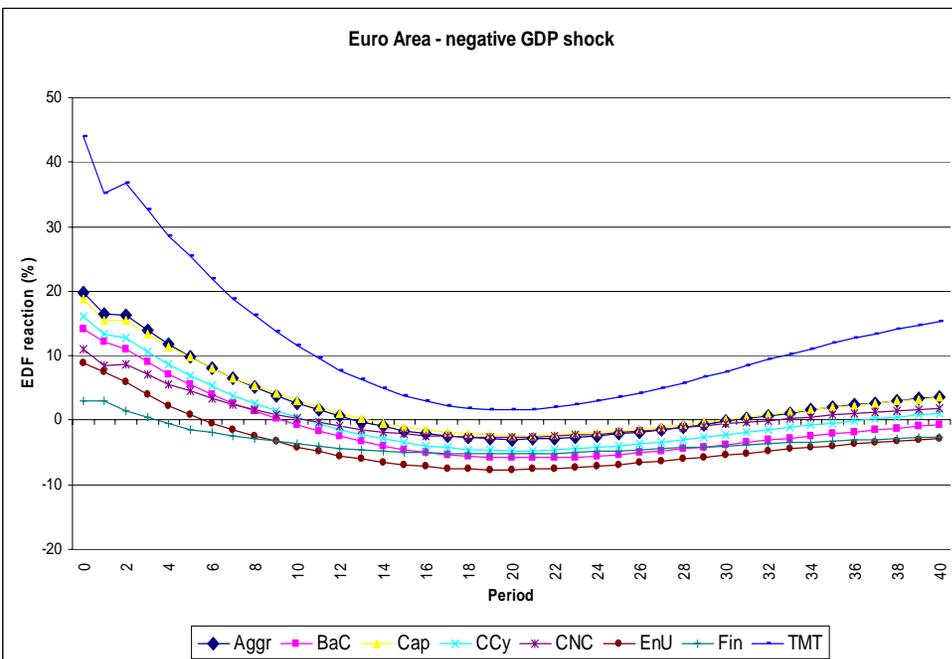
# Satellite model: goodness of fit



# Summary: Satellite-GVAR results

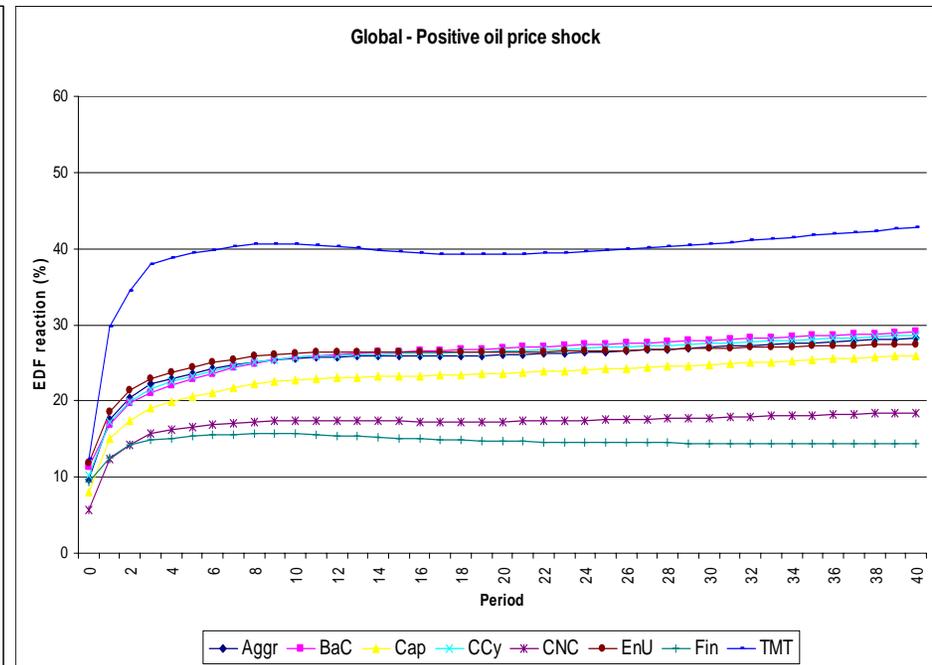
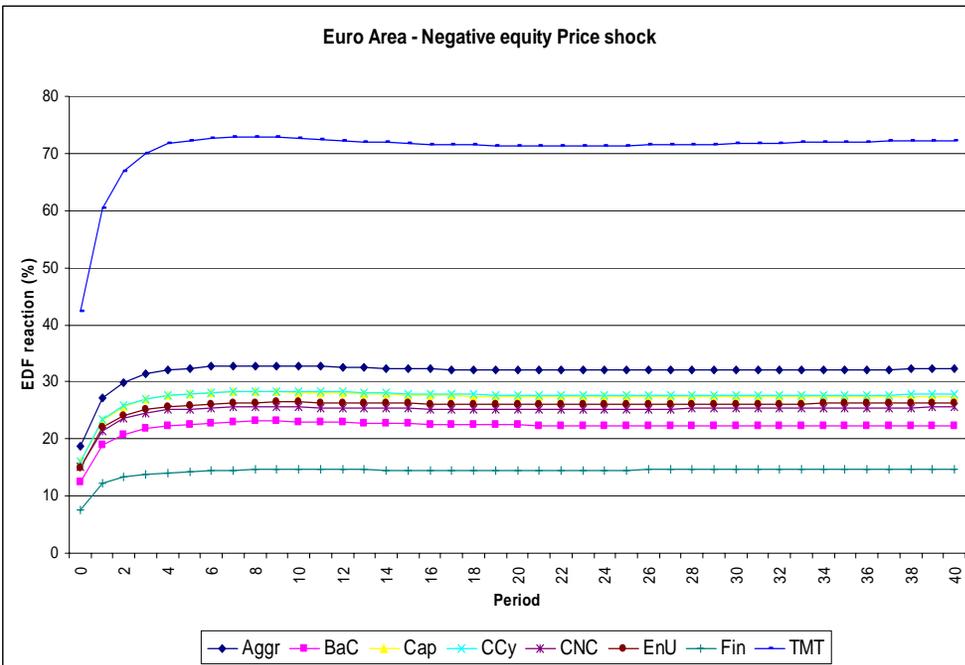
- On the aggregate Euro Area EDF level, the EDF reactions are most sensitive to shocks to:
  - 1) Global and euro area GDP
  - 2) Global equity prices
  - 3) Interest rates (short and long)
  - 4) Exchange rates
  - 5) Oil prices
- In general, most sectoral EDFs react similarly to the benchmark (i.e., the aggregate EDF case)
- **BUT** the technology sector EDF is more affected than the other EDFs in our sample period

# Satellite-GVAR reactions



*Note: graphs show deviations from the baseline profile*

# Satellite-GVAR reactions



*Note: graphs show deviations from the baseline profile*

# Bootstrap simulation exercise

- **The Satellite-GVAR model, given a shock, is rejected if the EDF reaction falls outside the 90% confidence interval range at least once in the 40 quarters**
- **The results show that the model representing the aggregate EDFs is within the 90% confidence interval for all types of shocks.**
- **By contrast, for some sectors the model fit appears less satisfactory**

# Future extensions

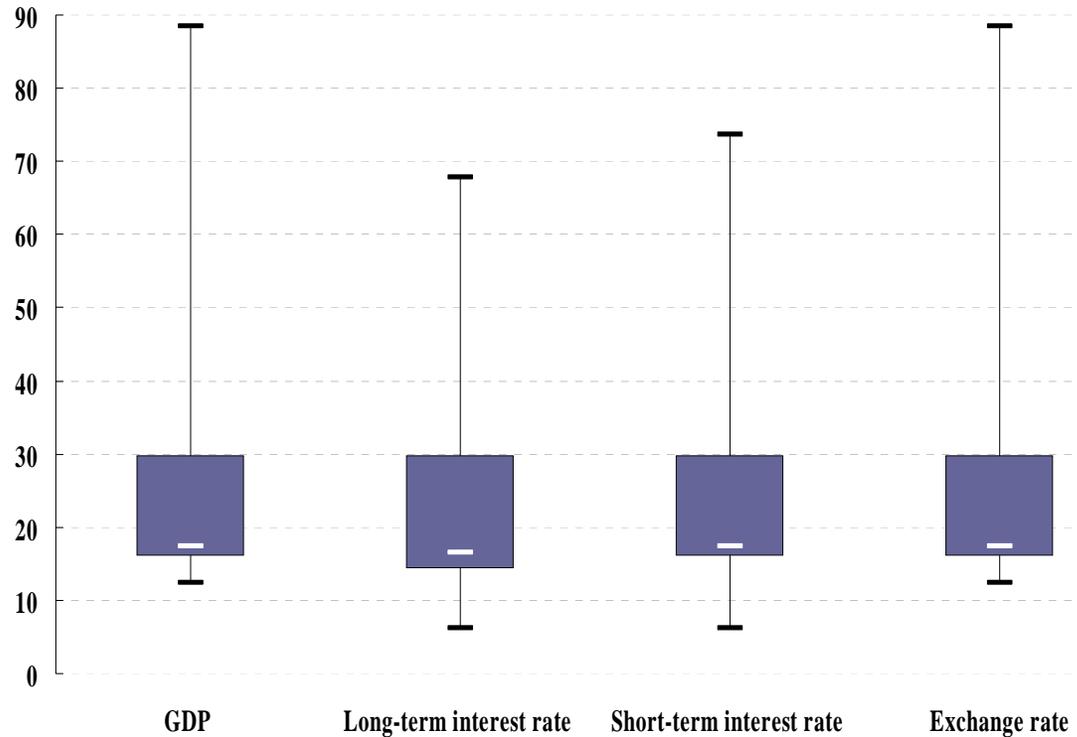
- **Exploit the distribution of sectoral EDFs (instead of only median EDFs) to find out possible effects of firm *heterogeneity***
- **Further efforts to estimate a *non-linear* satellite equation**

# Application: LCBGs credit portfolio losses

- **Data inputs: loan exposures, recovery rates, expected default rates and PD volatilities**
- **Use publicly available exposure data from 15 large EU banks, and Moody's KMV Expected Default Frequencies (EDF), shocked by the GVAR**
- **Losses estimated using the CreditRisk+ (CR+) model. This calculates the losses over a fixed one-year horizon for a given confidence interval and for a portfolio of individual exposures of which each has a low probability of defaulting**

# Results: a single shock scenario

- Distribution of changes in banks' credit portfolio Value at Risk as a percentage of Tier 1, following various macro shocks
- An useful estimate for banks' economic capital, and the distribution of losses in the banking system



A satellite with gold-colored panels and solar arrays is shown in orbit above the Earth. The Earth's surface is covered in white clouds and blue oceans. The text "Thank you" is written in large, bold, red letters across the center of the image.

**Thank you**