

# Inspecting the macroeconomic effects of fiscal policies in the EU using a new dataset of narrative measures<sup>1</sup>

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<sup>1</sup>Preliminary and incomplete slides. Please do not circulate them without authors' permission

# This paper

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Joint estimate of the macroeconomic effects of both government and tax changes

- Cumulative spending multipliers of about 2.
- Cumulative tax multipliers of about 1 on impact and essentially 0 for longer horizons.

# The ESCB dataset

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- The Eurosystem and ECB staff conduct four **projection exercises** per year to quantify the revenue and spending impact of discretionary policy measures
- The fiscal projections rely on granular and confidential ESCB **fiscal questionnaires** (FQ) filled by NCB experts.
  - Quantifies the impact of *all* fiscal measures.
  - Over the following 10 years
  - Classification of their nature (fiscal category)
  - Focus on both **restrictive and expansionary** fiscal measures (no truncation)

# The ESCB dataset

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- Annual dataset with average starting date in 2003
- More than **14,000 datapoints** over the last decades from 27 countries
  - Around **5,000** for the 'Big-4' countries (DE, FR, IT, ES), **9,000** for the remaining 23
  - For reference: [Romer and Romer \(2010\)](#) have only about **110 tax measures** for the US

## The ESCB Dataset: distribution of tax measures

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| <b>Tax categories</b>                      | <b>Frequency</b> | <b>Percent</b> |
|--|------------------|----------------|
| Direct taxes by households                 | 2314             | 27.97          |
| Direct taxes by corporations               | 1394             | 16.85          |
| Other indirect taxes                       | 1128             | 13.64          |
| Other direct taxes                         | 783              | 9.47           |
| VAT  | 678              | 8.20           |
| Net social contributions paid by employers | 497              | 6.01           |
| Energy taxes                               | 406              | 4.91           |
| Net social contributions paid by employees | 377              | 4.56           |
| Current transfers other than interest      | 168              | 2.03           |
| Capital taxes                              | 122              | 1.47           |
| Sales                                      | 103              | 1.25           |
| Other capital revenue                      | 90               | 1.09           |
| Local business taxes                       | 87               | 1.05           |
| Other social contributions                 | 78               | 0.94           |
| Other                                      | 47               | 0.57           |
| <b>TOTAL</b>                               | <b>8272</b>      | <b>100</b>     |

# The ESCB Dataset: distribution of spending measures

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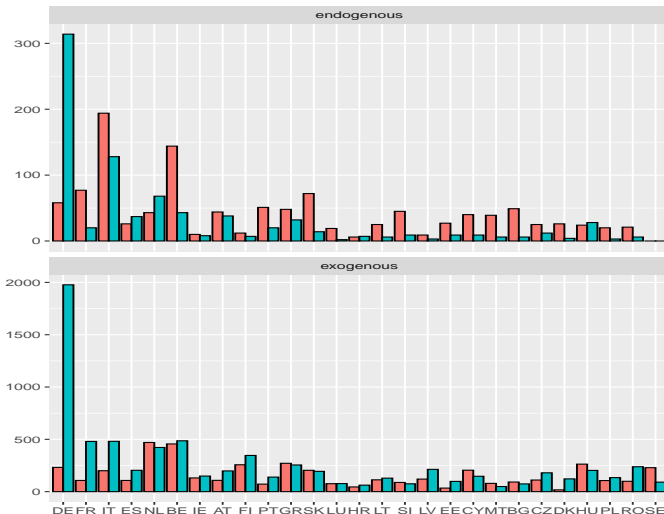
| Expenditure categories                         | Frequency | Percent |
|--|-----------|---------|
| Subsidies                                      | 1010      | 16.61   |
| Other social benefits other than in kind       | 995       | 16.37   |
| Wages and salaries                             | 690       | 11.35   |
| Intermediate consumption                       | 682       | 11.22   |
| Capital transfers                              | 593       | 9.75    |
| Other current transfers                        | 521       | 8.57    |
| Government investment                          | 478       | 7.86    |
| Old age pensions                               | 450       | 7.40    |
| Social transfers in kind                       | 320       | 5.26    |
| Unemployment benefits                          | 179       | 2.94    |
| Employers' actual social contributions         | 65        | 1.07    |
| Other net acquisitions of non-financial assets | 42        | 0.69    |
| Interest                                       | 13        | 0.21    |
| Employers' imputed social contributions        | 6         | 0.10    |
| TOTAL  | 6080      | 100     |

# Identifying endogenous vs. exogenous measures

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1. Identification strategy relying on the **motivation** behind each fiscal measure
  - **Big-4 countries:** Manually process official documentation that supports the motivation of each measure and then make a subjective assessment.
  - **Other 23 countries:** Use the manual work for the Big-4 to **train a Machine-Learning (ML) algorithm** that replicates this task for this set of countries
2. Pin down the **timing of approval** and implementation of measures

# Identifying endogenous vs. exogenous measures





# Shocks

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$u_{i,t}$ : surprise discretionary exogenous narrative change in total government spending between  $t$  and  $t + 3$  in country  $i$  (a compact measure of the entire program of discretionary spending, present and future).

$q_{i,t}$ : same for tax revenues

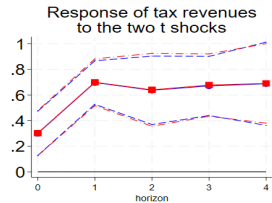
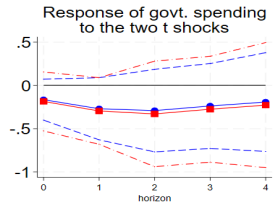
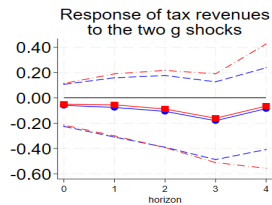
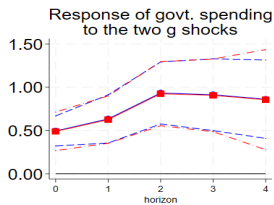
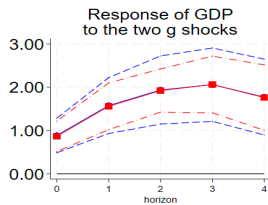
# Empirical strategy: IRF

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- Estimate a series of **local projections** as in Jordà, 2005:

$$z_{i,t+h} = \alpha_{zu}^h u_{i,t} + \alpha_{zq}^h q_{i,t} + \Theta_h' w_{i,t} + \lambda_i + \omega_{i,t+h}$$

- $z_{i,t}$ : variable of interest (output  $y_t$ , gov. expenditure  $g_t$ , revenues  $\tau_t$ ) in country  $i$ , time  $t$
- $w_{i,t}$ : controls
- **Correlation** between  $u_{i,t}$  and  $q_{i,t}$ . Orthogonalization
- All variables are expressed in log differences and then transformed into shares of GDP by multiplying by the country-specific average share of spending (taxes) in GDP.



Impulse responses to spending and tax shocks

# Unconditional multipliers

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**Spending multiplier:** ratio of the cumulative IRF of spending to the cumulative IRF of GDP

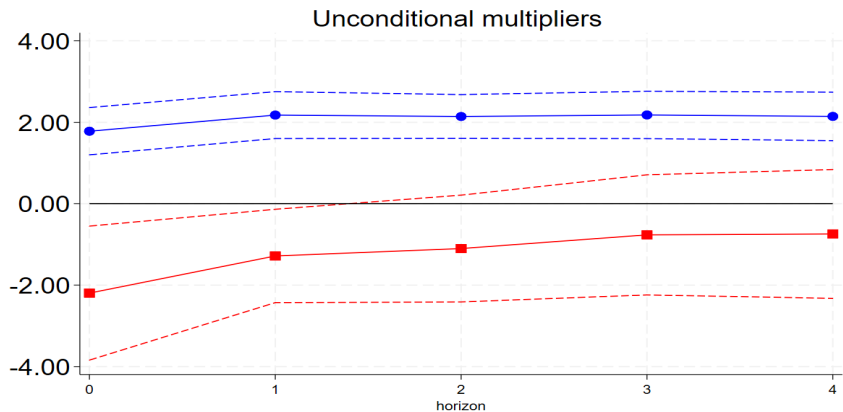
$$\hat{m}_g^H = \sum_{h=0}^H \hat{\alpha}_{yu}^h / \sum_{h=0}^H \hat{\alpha}_{gu}^h$$

It does not control for the endogenous movement of taxes

**Tax multiplier**

$$\hat{m}_\tau^H = \sum_{h=0}^H \hat{\alpha}_{yq}^h / \sum_{h=0}^H \hat{\alpha}_{\tau q}^h$$

It does not control for the endogenous movement of expenditure



Unconditional spending (blue circles) and tax multipliers (red squares)

# Conditional multipliers

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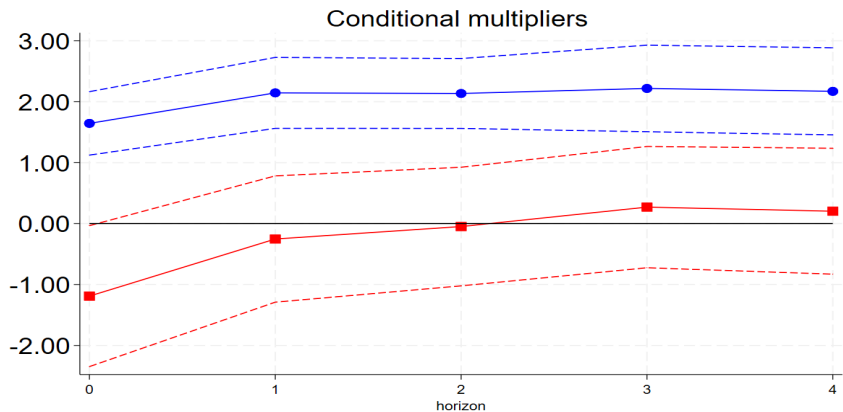
Estimate the equation:

$$\sum_{j=0}^J y_{t+j} = \beta_{yg,J} \sum_{j=0}^J g_{t+j} + \beta_{y\tau,J} \sum_{j=0}^J \tau_{t+j} + \Theta'_h w_{i,t} + \lambda_i + e_{t+j}$$

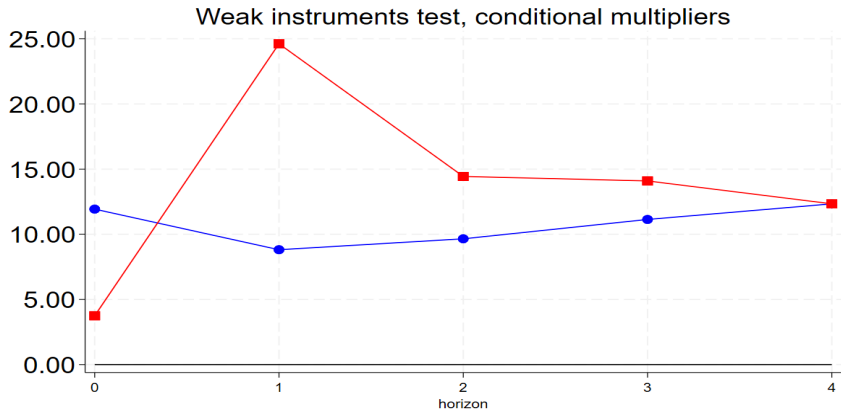
using the spending shock,  $u_{i,t}$ , and the tax shock,  $q_{i,t}$  as instruments

$\beta_{yg,J}$  and  $\beta_{y\tau,J}$  are the **conditional multipliers**.

Response of output to a change in spending, **keeping taxes constant** and viceversa

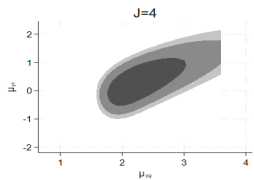
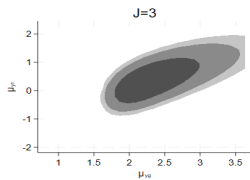
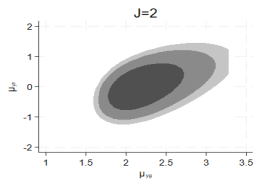
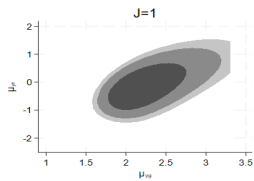
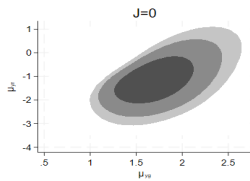


Conditional spending (blue circles) and tax multipliers (red squares)



Mertens and Lewis weak instrument tests. Blue circles: cumulative spending; red squares: cumulative taxes.





Anderson-Rubin tests

## News shocks

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So far, narrative shock to current and future (spending) taxes constrained to have the same effect.

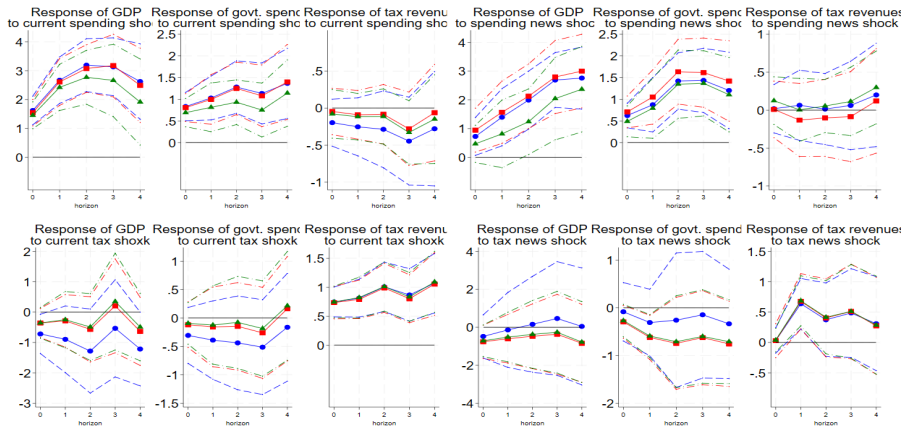
Create two tax shocks by splitting  $q_t$  into two shocks:

$$q1_t = \tau_t^0; \quad q2_t = \sum_{h=1}^3 \tau_t^h \quad (1)$$

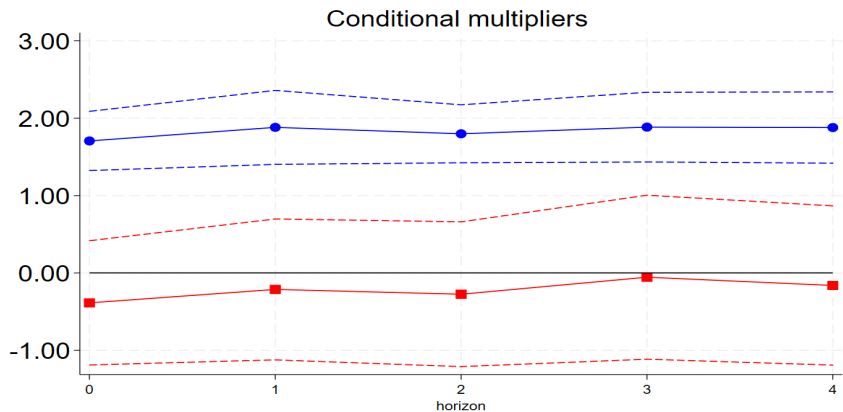
$q1_t$  “current tax shock”. Shock in  $t$  for  $t$

$q2_t$  “tax news shock”. Shocks in  $t$  for  $t + h$

Same for spending:  $u1_t$  and  $u2_t$



Responses to current shocks (columns 1 to 3) and to news shocks (columns 4 to 6).  
First row: spending. Second row: taxes.



Conditional spending multiplier (blue circles) and tax multiplier (red squares); 4 instruments.

# Conclusions

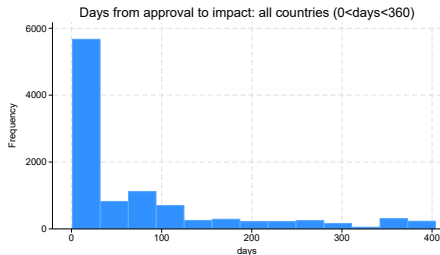
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- New evidence on the **aggregate effects of fiscal policy in the EU**, based on an extended and refined version of the ESCB dataset on discretionary fiscal measures.
- Machine-learning methodology to separate exogenous vs. endogenous surprise discretionary changes
- New method to compute **conditional** cumulative multipliers, controlling for the response of the "other" fiscal tool
- Relatively **large conditional expenditure multiplier ( $\sim 2$ )** while the **tax multiplier** is less precisely estimated and smaller ( $\sim 0$ ) in the medium run

# Appendix: days to impact

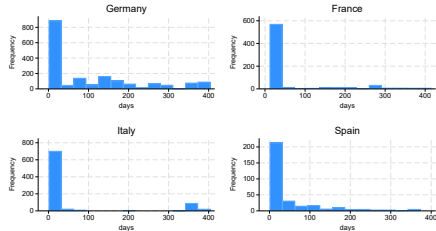
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## All countries



## 4 largest countries

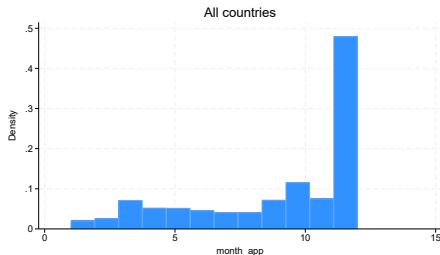
Distribution of days from approval to impact (capped:  $0 < \text{days} < 360$ )



# Appendix: month of approval

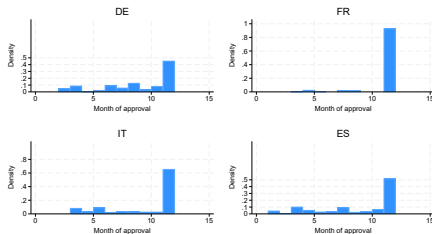
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## All countries



## 4 largest countries

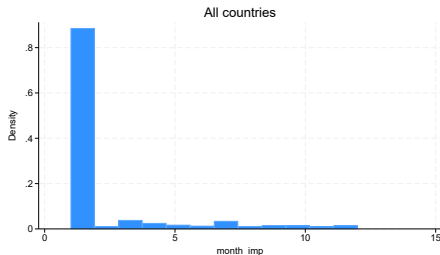
Distribution of month of approval



# Appendix: month of first impact

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## All countries



## 4 largest countries

Distribution of month of first impact

