# Credit conditions and the effects of economic shocks: amplification and asymmetries

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The views expressed in this presentation are those of the author and do not necessarily reflect the views of the European Central Bank and the Eurosystem.

# Outline



- The type of time-variation: exploring the prior for  $\gamma$
- Dynamic heterogeneity
- Finance or Macro?

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# Main questions

- Are macro-financial relationships characterized by time-variation?
- Which type of time-variation (smooth/abrupt)?
- What are the relevant "state variables" to describe the time-variation in macro-finance?

# Model

Time-varying dynamic factor model

$$Y_t = A_{1,t}F_{t-1} + \dots + A_{p,t}F_{t-p} + \epsilon_t$$
  
$$\epsilon_t = N(0, \Sigma_t)$$

**Time-Variation** 

• 
$$A_{u,t} = \alpha + \pi(\gamma, f_{t-1}^r, ...)\beta$$
 and  $\Sigma_t = [1 - \pi(...)]\Sigma_1 + \pi(...)\Sigma_2$ 

▶  $\gamma$  "smoothness" of the time variation (large implies abruptness) ▶  $f_{t-1}^r$  state variable that "governs" the time variation

#### **Factor Estimation**

- $F_t = BY_t$ , MAI model
- *Y<sub>t</sub>*, 20 US variables capturing real activity (8), inflation (4), monetary policy (2) and credit conditions (6, spreads).

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# Results

- Time-variation in US macro-financial relationships
- The relevant state variable to describe time-variation is the credit condition factor
  - Lesson for structural macro models?
  - Monetary and macro-prudential policy interaction?
- Time-variation well characterized by being abrupt (regime switching)
- In stress times, amplification and asymmetries in the effects of demand and supply shocks
- $\Rightarrow$  Nice and relevant paper!

# Outline





#### Comments

- $\bullet$  The type of time-variation: exploring the prior for  $\gamma$
- Dynamic heterogeneity
- Finance or Macro?

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# The type of time-variation: exploring the prior for $\gamma$



- Estimates of  $\gamma$  large  $\Rightarrow$  Abrupt changes in regimes
- Is that really so strong in the data? Prior sensitivity analysis.

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• The prior mass is mostly on high values

• How much ground for smooth or time-invariant behaviour?

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- Gamma distribution is a great choice
  - Very popular now in the literature on time-variation for his ability to accommodate different types of behaviour
  - Explore more diffuse priors
- Another possible aspect to be considered: nature of persistence
  - In this paper, only coming from common sources (no lags of individual variables)
  - Jarocinski and Lenza (2018): ratio of MSE, inflation forecasts with and without idiosyncratic persistence
    - HorizonOne quarterTwo quartersFour quartersMSE ratio0.930.920.85
  - It can be very important to account for idiosyncratic persistence

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# Dynamic heterogeneity

- The assumption of the linearity of the factor in the variables is extremely convenient
  - The factor are estimated by means of a linear regression
- It also makes a lot of sense!
  - Smart way to use the lessons from the empirical success of estimated dynamic factor models
  - Although, why is that relationship assumed to be time-invariant?
- However, the relationship is assumed to be only contemporaneous
  - We know that economic data are characterized by "dynamic" relationships
  - Comovement may be higher at leads and lags: it should be accounted for in the estimation
  - It could easily be done in this framework, where factor estimation boils down to a regression problem

An example of the relevance of dynamic heterogeneity, D'Agostino et al. (2014)



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# Finance or Macro?

- The factors are freely estimated (up to some normalization assumption) and then ex post labelled
- The strong dynamic comovement among variables complicates the identification of the sources of time-variation
- Table 2 shows that the factors are correlated
  - For example, finance and activity factors correlation is -0.49
- Are we really sure about the financial nature of the drivers of time-variation?
  - Is there an issue of identification?

# Activity and finance factors



- Maybe the relevant drivers of the economy are financial shocks
- Alternative explanation: drivers are macro and financial variables just react earlier
  - ▶ An idea for the next paper? See also Leiva-Leon and Uzeda (2019)

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- Very nice paper!
- Less dogmatic on time-variation?
- The authors could also continue to develop the technique in several directions
  - Taking more sophisticated dynamics into account
  - More ambitious identification of the drivers of time-variation