## **EXAM QUESTIONS for Advanced Economics Extension Course at the Central Reserve Bank of Peru:**

"A Bayesian Approach to Identification of Structural VAR Models"

Students should prepare answers to the exam questions in teams of 6 students. Please include the Matlab code together with the written solutions. Students have until Saturday, February 15 (midnight) to complete the exam.

## **PART I: Univariate Model**

Consider the following **AR(2) model**:

$$y_t = c + b_1 y_{t-1} + b_2 y_{t-2} + \epsilon_t$$

where the residuals are serially correlated according to:

$$\epsilon_t = \rho \epsilon_{t-1} + v_t$$
 with  $v_t \sim N(0, \tau^2)$ 

- a. Write down the **Gibbs sampler** for this extended model (on paper). Describe each step, the prior specification, and the conditional posterior distributions including the formulas for their moments.
- b. Write Matlab code to estimate this model for the **annual growth rate of real GDP** for the US (FRED code: GDPC1) over the period 1948Q1 to 2019Q4 using the Gibbs sampler described in (a). Provide the following graphs:
  - i. Plot the annual growth rate of real GDP (in percent).
  - ii. Plot the histogram of the (marginal) posterior distribution for  $\rho$  and report its posterior median.

NOTE: Chapter 7 of Kim and Nelson (1999) is a very useful reference for this task.

## **PART II: Multivariate Models**

Collect from FRED the following variables for the US economy at quarterly frequency for the period 1985Q1-2006Q4: real GDP, the consumer price index (CPI), the effective federal funds rate, and the M2 money stock.

- 1. Transform the data to **quarter-on-quarter growth rates** where appropriate so that they have a useful economic interpretation. Plot the transformed data with appropriate labels.
- 2. Consider a bivariate VAR model for real GDP growth and CPI inflation.

- a. Write Matlab code to estimate a reduced-form VAR(4) model with a constant term using OLS. Report the (point) estimates of the reduced-form covariance matrix (omega) and the  $(k \times n)$  matrix of reduced-form coefficients where n is the number of endogenous variables.
- b. Assume that there is a supply-demand model that determines the fluctuations in output and inflation but that you do not know the values of the contemporaneous structural parameters that characterize that model. Plot the **identified set** for all possible values that are compatible with the observed data.
- 3. Now add the federal funds rate to your bivariate model.
  - a. Fit a VAR(4) to those data ordered as follows: output, inflation, interest rate. Check whether the model is stable. How can you tell? Show the output you use to determine stability of the system.
  - b. Apply the Choleski decomposition for identification. Plot the impulse responses of the three variables after a monetary policy shock (just the point estimates, without error bands). What do you find? Briefly comment on your results.
  - c. Compute and report the coefficients on output and inflation in the Taylor rule implied by the estimated model.
- 4. Now add money to your set of variables. Write down the **structural** equations that describe these 4 variables. Provide an economic interpretation for each equation and the corresponding contemporaneous structural parameters (**A** matrix).
- 5. Estimate this model using the Baumeister-Hamilton algorithm implementing the Choleski identification in that framework and uninformative priors for **B** and **D**.
  - a. Write down (on paper) the prior for each element in A as well as the joint prior for A.
  - b. Plot the impulse responses to the one-standard-deviation structural shocks (median together with 16<sup>th</sup> and 84<sup>th</sup> percentiles of the posterior distribution) for a horizon of 5 years.
  - c. Plot the posterior distributions for the contemporaneous structural coefficients. Are the estimates (magnitudes and signs) consistent with the economic interpretation that you provided under (4)?
- 6. Suppose you wanted to identify the shocks underlying this 4-variable model using the traditional sign-restriction algorithm but **without** imposing any signs.
  - a. Provide a plot for the impact effect of a one-standard deviation shock using the <u>analytical</u> expression for the implicit prior distribution.
  - b. Verify <u>empirically</u> what the impact effect for each variable looks like. Report plots of the impact effects and provide the numerical values for the cut-off points.