Authors:

GOODNESS C. AYE

Department of Economics, University of Pretoria, Pretoria, South Africa

SHORT AND LONG RUN ASYMMETRIC EFFECTS OF MONETARY AND FISCAL POLICY UNCERTAINTY ON ECONOMIC ACTIVITY IN THE U.S.

ABSTRACT

This paper extends the ongoing literature on the macroeconomic effects of monetary and fiscal

policy uncertainty. It examined the asymmetric effects of monetary and fiscal policy uncertainty

on economic activity in the short and long run using U.S. monthly data from 1985M1 to 2017M2.

The industrial production index is used as a measure of economic activity while the Baker et al.

(2016) news based monetary and fiscal policy uncertainty were used as measures of uncertainty.

To analyse asymmetry, the paper employed the nonlinear autoregressive distributed lag

(NARDL) model which allows one not only to capture the effects of positive and negative

uncertainty but to do so in both short and long run. Hence this paper provides new evidence of

possible existence of a nonlinear and asymmetric relationship between policy uncertainty and

economic activity in the short and long run. The results show that monetary and fiscal policy

uncertainty share long run relationship with economic activity. Further, the effect of monetary

and fiscal policy uncertainties in the long run is asymmetric. Asymmetric effect in the short run

was supported only for monetary policy uncertainty. These findings have important practical

and policy implications.

Keywords: Monetary Policy, Fiscal Policy, Uncertainty, Asymmetry, Nonlinearity, Short Run, Long Run

JEL Classification: C32, E52, E62, F62

RIASSUNTO

Gli effetti asimmetrici sul breve e lungo periodo dell'incertezza della politica monetaria e fiscale

sull'attività economica negli USA

Questo articolo rappresenta un ampliamento della letteratura esistente sugli effetti

macroeconomici dell'incertezza nella politica monetaria e fiscale. Vengono esaminati gli effetti

di tale incertezza sull'attività economica degli Stati Uniti tramite l'utilizzo di dati mensili relativi

al periodo 1985-2017. L'indice della produzione industriale è stato usato come misura dell'attività economica, mentre per misurare l'incertezza è stato fatto riferimento al lavoro di Baker *et al.* (2016). Per misurare l'asimmetria è stato applicato il modello NARDL (Nonlinear Autoregressive Distributed Lag) che consente di catturare gli effetti positivi e negativi dell'incertezza sia nel breve che nel lungo periodo. Quindi in questo articolo vi è una nuova evidenza di una possibile relazione nonlineare e asimmetrica tra l'incertezza politica e l'attività economica nel breve e lungo periodo. I risultati evidenziano che l'incertezza nella politica monetaria e fiscale condivide una relazione di lungo periodo con l'attività economica. Inoltre, gli effetti dell'incertezza nella politica monetaria e fiscale nel lungo periodo sono asimmetrici. Nel breve periodo invece, effetti asimmetrici si verificano quando vi è incertezza solo nella politica monetaria. Questi risultati hanno importanti implicazioni pratiche e politiche.

### 1. Introduction

The 2007-2009 global economic and financial crisis that started from the United States has been termed the worst economic downturn since the Great Depression. Given the slow recovery from the crisis in the U.S., there has been unprecedented fiscal and monetary policy actions. Moreover, there has been no consensus about the timing and mix of fiscal and monetary policies (Fernández-Villaverde *et al.*, 2011, 2015). There have been strong political partisan divisions, with some arguing for more economic stimulus or more economic assistance for those in need, and others arguing for contraction in government spending and transfers (Murray, 2017). Given that the slow economic recovery has been attributed to uncertainty about economic policies, one foreseeable and effective way to recovery and boosting consumer and business confidence in the U.S. as suggested by Ben Bernanke, the Federal Reserve chairman in July 2012 monetary policy report to the U.S. Congress, is to design long-run policy that removes uncertainty concerning the fiscal stance of the Federal Government.

The slow recovery and consequent economic and political hardship have raised renewed interest among policy makers, researchers and other stakeholders on the effect of uncertainty on the macroeconomy. Uncertainty may rise because of negative news, which lowers expectations of future economic activity. Sources of uncertainty may be changes in rules and regulations governing taxes and investment, change in political system, government's decision to settle its budget, and terrorist activities among others. Theoretically, rising uncertainty causes firms to

wait before investing and hiring, and causes consumers to wait before purchasing certain consumption goods (Bernanke, 1983; Pindyck, 1991). In other words, uncertainty could delay both investment and consumption plans as there is a real option effect to waiting (Aye *et al.*, 2019). These consequently could slow down economic growth (Bloom 2009; 2014). Another theoretically view of uncertainty is that high uncertainty increases borrowing costs for firms (Christiano *et al.*, 2014).

Before proceeding further, it is important that a distinction is made between economic uncertainty and policy uncertainty. Policy uncertainty relates to uncertainty regarding policy decisions from monetary or fiscal authorities while economic uncertainty incorporates both policy uncertainty and economic uncertainty such as equity market uncertainty, housing price uncertainty among others (Balcilar *et al.*, 2017). This study focuses specifically on monetary and fiscal policy uncertainty. For instance, agents can be uncertain about monetary policy for a variety of reasons: informational asymmetries, central banks' possible lack of credibility or commitment, unknown central bank preferences, among others. Uncertainty about future policy affects agents' expectations such that perceived changes have real and nominal effects (Mumtaz and Zanetti, 2013).

When uncertainty decreases, economic activity may rebound, but not necessarily immediately (Foerster, 2014). This suggests that uncertainty could have asymmetric effects on economic activity since the macroeconomic effects of a positive volatility may not necessarily be offset by the decline in uncertainty. This paper extends previous research on the macroeconomic impact of monetary and fiscal policy uncertainty (Bloom, 2009; Mumtaz and Zanetti, 2013; Born and Pfeifer, 2014; Johannsen, 2014; Hollmayr and Matthes, 2015; Fernández-Villaverde et al, 2015; Creal and Wu, 2017; Murray, 2017; Kotzé, 2017) which have assumed symmetric effects. To the best of my knowledge there has been no previous paper that examined whether positive (increases) and negative (decreases) in monetary and fiscal policy uncertainty has differential impact on economic activity. Moreover, this paper distinguishes the asymmetric effects of fiscal and monetary policy uncertainty in the short and long run. To this end, this study employs the nonlinear autoregressive distributed lag (NARDL) model of Shin *et al.* (2014) which allows not only asymmetric analysis but also short and long run analysis of the relationship between monetary and fiscal policy and economic activity.

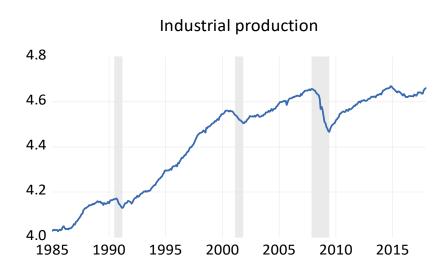
The rest of the paper is organised as follows: the next section presents the data and empirical model. Section 3 discusses the results while section 4 concludes.

### 2. Data and empirical model

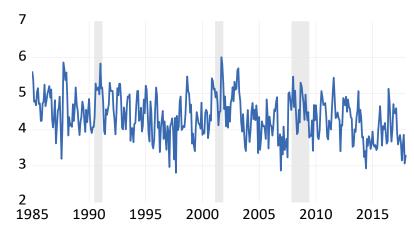
The paper used monthly U.S. time series data from 1985M1 to 2017M2. Economic activity is proxied by the industrial production index (INDPRO). These are sourced from the FRED database of the Federal Reserve Bank of St. Louis. Data on monetary policy uncertainty (MPU) and fiscal policy uncertainty (FPU) were the categorical measure of uncertainty for the US economy as developed by Baker et al. (2016). The Categorical Data include a range of subindexes based solely on news data. These are derived using results from the Access World News database of several US newspapers. Each sub-index requires the terms: economic, uncertainty, and policy as well as a set of categorical policy terms. Although there are several measures of economic uncertainty (Jurado et al., 2015; Strobel, 2015), the measures of policy uncertainty used in this study which are based on a news-based approach are not driven by the variables included in the econometric framework as in the measures from structural models. All variables are transformed to their natural logarithm. The plots of these series alongside the US recession bars are presented in Figure 1. Industrial production has in general being on an increasing trend. However, there is a noticeable decline between 2007 and 2009, a period which corresponds to the recent global economic and financial crisis. Looking at the monetary and fiscal policy uncertainty data, one can observe large fluctuations which are typical of uncertainty series. The uncertainty variables indicate heightened uncertainty during the recent global financial crisis and this coincides with a fall in economic activity as shown by the recession bars.

The econometric method is based on the nonlinear autoregressive distributed lag (NARDL) model developed by Shin *et al.* (2014). This method allows one to examine the effect of positive and negative policy uncertainty on economic activity. It also allows this to be done in the short and long run. Moreover, it has the advantage of permitting both I(0) and I(1) variables for analysis.

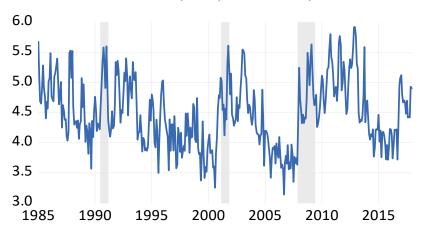
FIGURE 1 - Log Plot of Monetary Policy Uncertainty, Fiscal Policy Uncertainty and Industrial Production with Recession Bars



## Monetary policy uncertainty



# Fiscal policy uncertainty



The NARDL model is an extension of the linear autoregressive distributed lag (ARDL) cointegration model developed by Pesaran *et al.* (2001). Therefore starting with the linear ARDL, the short and long run relationship between for example monetary policy uncertainty (MPU) and industrial production (INDPRO) may be specified as an error correction model:

$$\Delta LnINDPRO_{t} = \alpha_{0} + \sum_{i=1}^{p-1} \alpha_{1i} \Delta LnINDPRO_{t-i} + \sum_{j=0}^{q-1} \alpha_{2j} \Delta LnMPU_{t-j} + \theta_{1}LnINDPRO_{t-1} + \theta_{2}LnMPU_{t-1} + \varepsilon_{t}$$

$$(1)$$

Similar equations may be obtained for fiscal policy uncertainty (FPU). The short run effects are captured by the estimates of coefficients assigned to first-differenced variables,  $\alpha_{1i}$  and  $\alpha_{2j}$ , and the long run effects by the estimates of  $\theta_2$  normalized by  $\theta_1$ . p and q are respectively the lag orders for the dependent variable and the exogenous variables in the distributed lag component. However, these long run effects are only valid if cointegration exists. Pesaran  $et\ al.\ (2001)$  suggest using the F-test to establish joint significance of lagged level variables as a sign of cointegration. Since this F-test accounts for integrating properties of variables in producing the critical values, there is no need for pre-unit root testing under this method (Bahmani-Oskooee and Aftab, 2017) and variables could be a combination of I(0) and I(1).

Equation (1) assumes that the effect of policy uncertainty on economic activity is symmetric. To capture the asymmetric effect of policy uncertainty both in the short and long run, changes in the uncertainty measures are decomposed into their positive and negative changes<sup>1</sup>. This is done by first forming  $\Delta LnMPU$  which includes positive changes,  $\Delta LnMPU^+$ , and negative changes  $\Delta LnMPU^-$ . Following Shin *et al.* (2014), two new time series variables are created namely, POS, representing only increased policy uncertainty as a partial sum of positive changes and NEG, representing decreased policy uncertainty as a partial sum of negative changes:

$$POS_t = \sum_{i=1}^t \Delta LnMPU_j^+ = \sum_{i=1}^t \max(\Delta LnMPU_j, 0)$$
 and

-

<sup>&</sup>lt;sup>1</sup> It is noted that this method can also be used to analyse the effect of small versus large fluctuations in the uncertainty measure by changing the threshold from zero to a certain value such as the mean of the volatility measure or its value as certain quantiles or deciles (Pal and Mitra, 2016; Bahmani-Oskooee, 2017).

$$NEG_{t} = \sum_{j=1}^{t} \Delta LnMPU_{j}^{-} = \sum_{j=1}^{t} \min(\Delta LnMPU_{j}, 0)$$
(2)

Replacing  $LnMPU_t$  in equation (1) with  $POS_t$  and  $NEG_t$  variables, we get the NARDL model:

$$\Delta LnINDPRO_{t} = \beta_{0} + \sum_{i=1}^{p-1} \beta_{1i} \Delta LnINDPRO_{t-i} + \sum_{j=0}^{q-1} (\beta_{2j} \Delta POS_{t-j} + \beta_{3j} \Delta NEG_{t-j}) +$$

$$\phi_{1}LnINDPRO_{t-1} + \phi_{2}POS_{t-1} + \phi_{3}NEG_{t-1} + u_{t}$$
(3)

where  $\phi_l$  is the autoregressive or persistence parameter,  $u_t$  is i.i.d. zero mean random variable with finite variance,  $\sigma_u^2$ . Nonlinearity is introduced by the way of constructing POS and NEG variables using partial sum concept. The bounds test is also applicable to equation (3). In this case the POS and NEG variables are treated as one variable and the same critical value for the F-test in the linear ARDL applies even though the NARDL has one additional variable. According to Shin  $et\ al.\ (2014)$ , this treatment is due to the dependency between the positive and the negative variables.

Short run asymmetry adjustment could be established if the number of lags on  $\Delta POS$  variable is different from the number of lags on  $\Delta NEG$  variable. Also the short run asymmetric effects could be established if the size or sign of the coefficients on  $\Delta POS$  and  $\Delta NEG$  is different at each lag j (Bahmani-Oskooee and Aftab, 2017). However, to formally test for the short run cumulative or asymmetric effects, the Wald test is used to determine if  $\sum \beta_{2j} \neq \sum \beta_{3j}$  in equation (3).

The symmetric long-run parameter is given by  $\phi_1$  while the asymmetric long run parameters are given by  $\phi_2$  and  $\phi_3$ <sup>2</sup>. To test for the long run asymmetric effect of policy uncertainty on economic activity, the Wald test is used to determine if the normalized coefficients on POS and NEG are significantly different. This is equivalent to testing that  $\frac{\phi_2}{-\phi_1} \neq \frac{\phi_3}{-\phi_1}$  in equation (3).

\_

 $<sup>^2</sup>$  The parameter  $\phi_{\!_1}$  is assumed to be negative and significant to have a cointegration relationship among the variables.

## 3. RESULTS

Preliminary analysis as shown by the unit root tests results presented in Table 1 shows that industrial production is an I(1) series while fiscal and monetary policy uncertainty variables are I(0). This justifies the use of ARDL framework. The results of the NARDL model on the asymmetric effect of monetary and fiscal policy uncertainty on economic activity are presented in Table 2. The lag orders of the models were selected using the Akaike and Schwartz information criteria. Columns 2 and 3 report the result with monetary policy uncertainty as the explanatory variable. Columns 4 and 5 report the results with fiscal policy uncertainty as the explanatory variable. Panel A of Table 2 reports the estimated short run coefficients of the model alongside the persistent parameter, INDPRO (-1), and the non-normalized long run coefficients. The results show that the persistent parameter, INDPRO (-1), is negative and significant in both cases. This indicates that the specified NARDL models are stable. Past variations in industrial production significantly determine their own current variations and this is robust to cases where monetary and fiscal policy uncertainty are included. Specifically, increases in previous variations in industrial production lead to increases in the current variation in industrial production and vice versa. These are particularly significant from the second lag. In the short run, the effect of positive and negative monetary policy uncertainty is significant on economic activity. Whether the difference in the positive and negative coefficients of the monetary policy uncertainty is significantly different in the short run will be determined by the Wald symmetric test. For the fiscal policy uncertainty these short run positive and negative effects are not significant.

Turning to Panel B which presents the results on the normalized long-run estimates, it is observed that positive monetary and fiscal policy uncertainty reduces economic activity. That is, increased or heightened monetary and fiscal policy uncertainty reduces economic activity. On the other hand, negative monetary and fiscal policy uncertainty increases economic activity. This implies that when there is a declining monetary and fiscal policy uncertainty, economic activity will tend to rebound. Thus economic activity increases. The Wald test will be used to determine whether the differences in terms of magnitude are significant.

One of the key assumptions of the NARDL model aside stability is that there should be no serial correlation. In Panel C, the LM chi-square P-values are presented and the results indicate that none of the models suffer from serial correlation. Further, the results based on either Bounds F-

or T- tests provide evidence of long run relationship between monetary and fiscal policy uncertainty and economic activity, thus guaranteeing the validity of the long run estimates. In addition, the symmetric test results based on Wald are presented in Panel C. For the model involving monetary policy uncertainty the null hypothesis is rejected at 5% level in the short run and at 10% in the long run. This implies that monetary policy uncertainty has both long and short run asymmetric effect on economic activity in the U.S. In other words, an increase in monetary policy uncertainty has a significant different effect on economic activity than a decrease in monetary policy uncertainty. Similar result is found for the fiscal policy uncertainty variable but only in the long run where the null hypothesis is rejected at 1% level. In the short run, the effect of fiscal policy uncertainty is symmetric. Thus, it is concluded that monetary policy uncertainty has asymmetric effects on economic activity in the short and long run while fiscal policy uncertainty has asymmetric effects in the long run only.

Table 1 - Unit Root Tests

|        | ADF       |            | PP        |            | Ng-Perron |             |
|--------|-----------|------------|-----------|------------|-----------|-------------|
|        | Level     | First      | Level     | First      | Level     | First       |
|        |           | difference |           | difference |           | difference  |
| INDPRO | -1.564    | -5.366***  | -1.676    | -18.562*** | 0.702     | -31.704***  |
| MPU    | -9.859*** | -          | -9.817*** | -          | -0.969    | -194.161*** |
| FPU    | -6.746*** | -          | -6.619*** | -          | -9.807**  | -           |

<sup>\*\*\*</sup> and \*\* Indicate rejection of the null hypothesis at 1% and 5% level respectively. Not applicable is represented by a hyphen (-).

TABLE 2 - NARDL Estimates of the Asymmetric Effect of Monetary and Fiscal Policy Uncertainty on Economic Activity

|                                   | N                  | FPU                  |                   |        |
|-----------------------------------|--------------------|----------------------|-------------------|--------|
| Panel A: Short Run<br>Estimates   | Coef.              | T-stat               | Coef.             | T-stat |
| INDPRO(-1)                        | -0.008**           | -2.061               | -0.014***         | -2.967 |
| POS(-1)                           | -0.002***          | -3.083               | -0.002**          | -2.416 |
| NEG(-1)                           | 0.002***           | 3.162                | 0.002**           | 2.543  |
| ∆INDPRO(-1)                       | 0.039              | 0.783                | 0.058             | 1.161  |
| ∆INDPRO(-2)                       | 0.122**            | 2.476                | 0.142***          | 2.884  |
| ∆INDPRO(-3)                       | 0.214***           | 4.386                | 0.231***          | 4.677  |
| ∆INDPRO(-4)                       | 0.171***           | 3.408                | 0.171***          | 3.355  |
| $\triangle POS$                   | -0.000             | -0.126               | -0.001            | -0.828 |
| △POS(-1)                          | 0.002*             | 1.826                | 0.000             | 0.186  |
| △NEG                              | 0.003***           | 2.874                | 0.001             | 0.760  |
| △NEG(-1)                          | 0.001              | 0.754                | 0.000             | 0.134  |
| Constant                          | 0.030*             | 1.946                | 0.056***          | 2.992  |
| Panel B: Long Run<br>Estimates    |                    |                      |                   |        |
| POS                               | -0.266*            | -1.686               | -0.114**          | -2.496 |
| NEG                               | 0.270*             | 1.735                | 0.124***          | 2.748  |
| Panel C: Diagnostic<br>Statistics |                    |                      |                   |        |
| Adjusted R <sup>2</sup>           | 0.200              |                      | 0.178             |        |
| LM p-value                        | 0.482              |                      | 0.465             |        |
| CUSUM                             | Stable             |                      | Stable            |        |
| F-Bounds test                     | 5.004*             |                      | 3.726             |        |
| T-Bounds test                     | -2.061             |                      | -2.967*           |        |
| Wald-SR                           | 5.347**<br>[0.021] |                      | 0.0004<br>[0.985] |        |
| Wald-LR 3.396* [0.066]            |                    | 55.700***<br>[0.000] |                   |        |

*Note*: Values in square brackets are p-values for the Wald test for symmetry. Critical upper values for the F-Bounds test for k=1 at 5% and 10% are respectively 5.73 and 4.78 for case III. Corresponding values for T-Bounds test are -3.22 and -2.91. SR and LR denote short run and long run respectively. \*\*\*, \*\* and \* Indicate rejection of the null hypothesis at 1%, 5% and 10% level respectively.

### 4. CONCLUSION

This study examined the asymmetric effects of monetary and fiscal policy on economic activity in the United States. To this end monthly data on industrial production and the policy uncertainty variables were used. The analysis was conducted using the nonlinear autoregressive distributed lag (NARDL) model allows both long and short run asymmetric effects. The findings show that there exists a long run relationship between monetary and fiscal policy uncertainty and economic activity. Monetary and fiscal policy uncertainty has adverse effects on economic activity in the short and long run. The effect of both monetary and fiscal policy uncertainty is asymmetric in the long run. However, in the short run the effect of monetary policy uncertainty is asymmetric while that of fiscal policy uncertainty is symmetric. In general one can infer that the effect of positive (increases in) policy uncertainty is quantitatively different from the effect of negative (decreases in) policy uncertainty. It implies that economic agents do not react in similar manner when policy uncertainty is heightened compared to when uncertainty decreases. This has implications on the recovery of the economy. The results have important policy implications. As the two effects are dissimilar, then short-lived spikes in monetary and fiscal policy uncertainty may persistently lower economic activity. Therefore, the monetary and fiscal authorities need to constantly seek for ways of reducing uncertainty to the barest minimum if not zero level. The results also have implications for econometric analysis, investment decisions and forecasting as it suggests that ignoring the nonlinearity and asymmetry in the nexus between monetary policy uncertainty and economic activity and also between fiscal policy uncertainty and economic activity may produce misleading conclusions.

## REFERENCES

Aye, G.C., M.W. Clance and R. Gupta (2019), "The Effectiveness of Monetary and Fiscal Policy Shocks on U.S. Inequality: The Role of Uncertainty", *Quality and Quantity*, 53(1), 283-295, <a href="https://doi.org/10.1007/s11135-018-0752-3">https://doi.org/10.1007/s11135-018-0752-3</a>>.

Bahmani-Oskooee, M. and M. Aftab (2017), "On the Asymmetric Effects of Exchange Rate Volatility on Trade Flows: New Evidence from US-Malaysia Trade at the Industry Level", *Economic Modelling*, 63, 86-103.

- Baker, S., N. Bloom and S. Davis (2016), "Measuring Economic Policy Uncertainty", *Quarterly Journal of Economics*, 131(4), 1593-1636.
- Balcilar, M., R. Gupta and C. Jooste (2017), "South Africa's Economic Response to Monetary Policy Uncertainty", *Journal of Economic Studies*, 44(2), 282-293.
- Bernanke, B. (1983), "Irreversibility, Uncertainty, and Cyclical Investment", *The Quarterly Journal of Economics*, 98(1), 85-106.
- Bloom, N. (2009), "The Impact of Uncertainty Shocks", Econometrica, 77 (3), 623-685.
- Bloom, N. (2014), "Fluctuations in Uncertainty", *Journal of Economic Perspectives*, 28(2), 153-176.
- Born, B. and J. Pfeifer (2014), "Policy Risk and the Business Cycle", *Journal of Monetary Economics*, 68, 68-85.
- Christiano, L.J., R. Motto and M. Rostagno (2014), "Risk Shocks", *American Economic Review*, 104(1), 27-65.
- Creal, D.D. and J.C. Wu (2017), "Monetary Policy Uncertainty and Economic Fluctuations", International Economic Review, 58(4), 1317-1354.
- Fernández-Villaverde, J., P. Guerron-Quintana, K. Kuester and J. Rubio-Ramirez (2015), "Fiscal Volatility Shocks and Economic Activity", *American Economic Review*, 105(11), 3352-3384.
- Fernández-Villaverde, J., P. Guerrón-Quintana, J.F. Rubio-Ramírez and M. Uribe, (2011), "Risk Matters: The Real Effects of Volatility Shocks", *American Economic Review*, 101(6), 2530-2561.
- Foerster, A. (2014), "The Asymmetric Effects of Uncertainty", Federal Reserve Bank of Kansas, Economic Review, Third Quarter, 5-26.
- Hollmayr, J. and C. Matthes, (2015), "Learning about Fiscal Policy and the Effects of Policy Uncertainty", *Journal of Economic Dynamics and Control*, 59,142-162.
- Johannsen, B.K. (2014), "When are the Effects of Fiscal Policy Uncertainty Large?", Finance and Economics Discussion Series, 2014-40, Board of Governors of the Federal Reserve System (U.S.).
- Jurado, K., S.C. Ludvigson and S. Ng (2015), "Measuring Uncertainty", *American Economic Review*, 105 (3), 1177-1216.
- Kotzé, K. (2017), "Fiscal Policy Uncertainty and Real Economic Activity in South Africa", Contributed paper at the biennial conference of the Economic Society of South Africa, 30 August 1 September 2017.

- Mumtaz, H. and F. Zanetti (2013), "The Impact of the Volatility Monetary Policy Shocks", Journal of Money, Credit and Banking, 45(4), 535-558.
- Murray, J. (2017), "Fiscal Policy Uncertainty and Its Macroeconomic Consequences",

  Department of Economics, University of Wisconsin La Crosse.

  <a href="http://www.murraylax.org/research/fiscaluncertainty.pdf">http://www.murraylax.org/research/fiscaluncertainty.pdf</a>>.
- Pal, D. and S.K. Mitra (2016), "Asymmetric Oil Product Pricing in India: Evidence from a Multiple Threshold Nonlinear ARDL Model", *Economic Modelling*, 59, 314-328.
- Pesaran, M.H., Y. Shin and R.J. Smith (2001), "Bounds Testing Approaches to the Analysis of Level Relationships", *Journal of Applied Econometrics*, 16 (3), 289-326.
- Pindyck, R. (1991), "Irreversibility, Uncertainty, and Investment", *Journal of Economic Literature*, 29(3), 1110-1148.
- Shin, Y., B. Yu and M. Greenwood-Nimmo (2014), *Modelling Asymmetric Cointegration and Dynamic Multipliers in an ARDL Framework*. in: R.C. Sickles, W.C. Horrace (Eds), "Festschrift in Honor of Peter Schmidt", Springer Science and Business Media: New York.
- Strobel, J. (2015), "On the Different Approaches of Measuring Uncertainty Shocks", *Economics Letters*, 134, 69-72.