

# UNCERTAINTY AND BUSINESS CYCLES: EXOGENOUS IMPULSE OR ENDOGENOUS RESPONSE?

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# THREE BIG QUESTIONS ABOUT UNCERTAINTY

## **Q1: Measurement**

How do we construct an empirical proxy for uncertainty?

## **Q2: Causality**

Does uncertainty drive activity? Does activity drive uncertainty? Are they causally linked at all?

## **Q3: Origins**

What is the fundamental source of uncertainty fluctuations?  
Real economy? Financial system?

## **This Paper's Contribution**

LMN move on from Q1 to Q2 and Q3, in a well motivated and exciting continuation of their agenda.

# A CLASSIC IDENTIFICATION PROBLEM

Estimate Reduced Form, Desire Structural IRFs

$$\text{VAR in } X_t = (Y_t, U_t)', \quad \eta_t = B e_t, \quad B = \begin{bmatrix} b_{YY} & b_{YU} \\ b_{UY} & b_{UU} \end{bmatrix}, \quad e_t \sim N(0, I_{2 \times 2})$$

4 Parameters, Only 3 Equations

$$\Omega = \text{Var}(\eta) = \begin{bmatrix} b_{YY}^2 + b_{YU}^2 & b_{YY}b_{UY} + b_{YU}b_{UU} \\ b_{YY}b_{UY} + b_{YU}b_{UU} & b_{UY}^2 + b_{UU}^2 \end{bmatrix}$$

**LMN Approach Is to Use External Moments for Identification**

Imagine a series  $Z$  with  $\mathbb{E}(Ze_U) \neq 0$  but  $\mathbb{E}(Ze_Y) = 0$

$$\left. \begin{array}{l} \mathbb{E}(\eta_Y Z) = b_{YU} \mathbb{E}(Ze_U) \\ \mathbb{E}(\eta_U Z) = b_{UU} \mathbb{E}(Ze_U) \end{array} \right\} \rightarrow b_{UU} \mathbb{E}(\eta_Y Z) = b_{YU} \mathbb{E}(\eta_U Z)$$

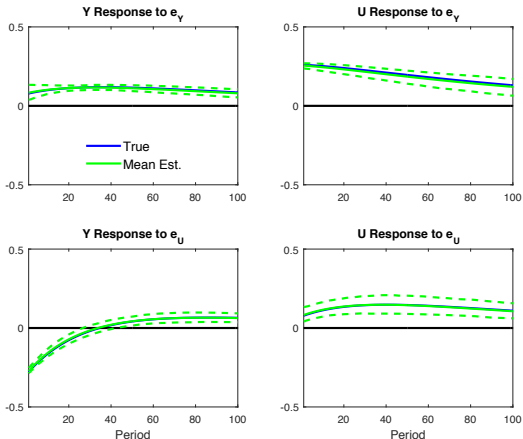
**Iteratively Construct the “Instrument”  $Z$**

Start with external, *endogenous* series  $S$ , e.g.

$$S = b_{SY}e_Y + b_{SU}e_U + b_{SS}e_S$$

- 1) Guess  $e^{(i)} = \{(e_Y, e_U)\}^{(i)}$
- 2) Cleanse  $S$  of  $e_Y^{(i)}$  to get  $Z^{(i)}$  via projection
- 3)  $B^{(i)}$  identified up to sign normalization
- 4) Set  $e^{(i+1)} = B^{(i)-1} \eta$  until convergence

# WORKS WELL IN PRACTICE



Estimates are mean and 90% intervals of 250 Monte Carlo repetitions. Results in this discussion are based on independent implementation and code, entirely consistent with LMN results. [Thanks to LMN for providing their data, code, and advice!](#)

# IDENTIFICATION ISN'T FREE

## An Exclusion Restriction

- External  $S$  used to construct  $Z$  must not belong in the VAR.
- Shock  $e_S$  must not affect activity or uncertainty, so  $\mathbb{E}(\eta e_S) = 0$ .
- LMN summarize this issue nicely on p10.

## What Can Go Wrong?

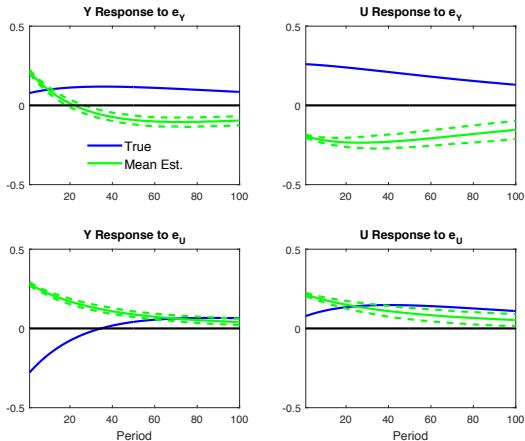
- If  $\mathbb{E}(\eta e_S) \neq 0$ , then  $b_{UU}\mathbb{E}(\eta_Y Z) = b_{YU}\mathbb{E}(\eta_U Z)$  fails.
- Back to standard unidentified SVAR case.
- Approach may fail to recover IRFs.
- Identified shocks may be contaminated by endogeneity from  $e_S$ .

## An Inherently Economic – Not Econometric – Assumption

- $S$  equal to stock returns in LMN.

No other shocks reflected in stock returns, other than “activity” or “uncertainty” shocks, may also affect activity or uncertainty.

# EXCLUSION RESTRICTION VIOLATION



Estimates are mean and 90% intervals of 250 Monte Carlo repetitions. Allowed shock to  $S$  to enter positively in contemporaneous  $Y$  and  $U$  equations of the VAR.

# BASU & BUNDICK (2015)

## DEMAND & UNCERTAINTY

New Keynesian DSGE model

### Two Shocks

Demand: level shock to discount rate

Uncertainty: shock to volatility of demand shocks

### Household-Side Demand Mechanism

Uncertainty  $\rightarrow$   $\left( \begin{array}{c} \text{Precautionary savings,} \\ \text{labor supply} \end{array} \right) \rightarrow$  Recession

### Measurement

$Y$ : aggregate output

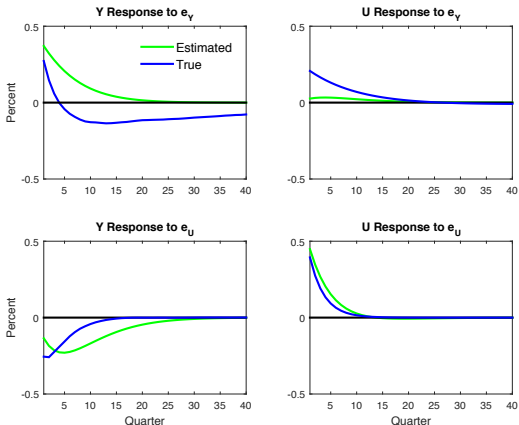
$U$ : expected variance of stock returns

$S$ : mean stock returns

Thanks to authors for code and simulated data.

# BASU & BUNDICK (2015)

## LMN APPROACH WORKS WELL

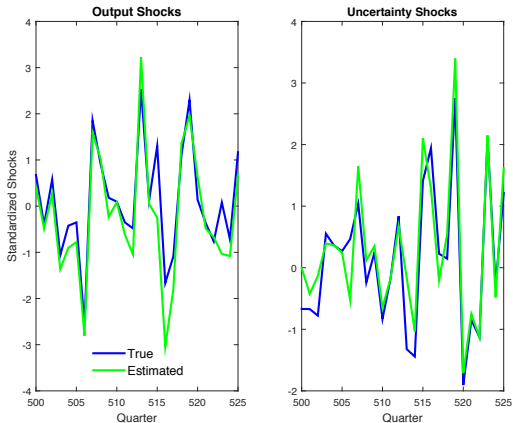


Results from application of the LMN approach to 10,000 quarters of simulated data from the Basu & Bundick model.



# BASU & BUNDICK (2015)

## LMN APPROACH WORKS WELL



$$\text{Corr}(e_{Yt}, \hat{e}_{Yt}) \approx 0.8, \text{Corr}(e_{Ut}, \hat{e}_{Ut}) \approx 0.9$$

# GILCHRIST, SIM, & ZAKRAJSEK (2014)

## ADDING FINANCIAL SHOCKS

Neoclassical model with micro TFP shocks, nonconvex capital adj. costs, financial frictions via equity dilution at issuance

### Three Macro Shocks

Macro TFP: level shock to macro productivity

Uncertainty: shock to volatility of micro TFP shocks

Financial: shock to liquidation value of capital

### Firm-Side Real Options Mechanism

Uncertainty  $\rightarrow$   $\left( \begin{array}{c} \text{“wait and see” behavior,} \\ \text{investment freeze} \end{array} \right) \rightarrow$  Recession

### Measurement

$Y$ : aggregate output

$U$ : cross-sectional standard deviation of returns

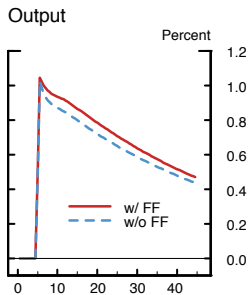
$S$ : mean returns

Thanks to authors for simulated data.

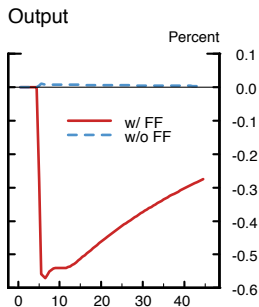
# GILCHRIST, SIM, & ZAKRAJSEK (2014)

## THREE SEPARATE SHOCKS

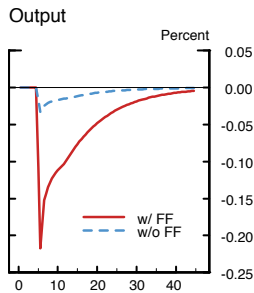
### TFP Shock



### Negative Fin. Shock

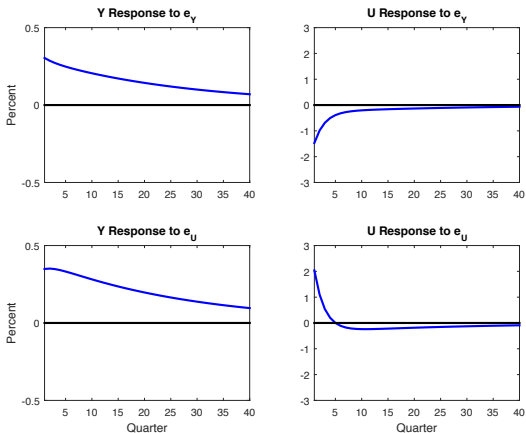


### Uncertainty Shock



# GILCHRIST, SIM, & ZAKRAJSEK (2014)

## APPLYING THE LMN APPROACH



Results from application of the LMN approach to 900 quarters of simulated data from the Gilchrist, Sim, and Zakrajsek model.

# GILCHRIST, SIM, & ZAKRAJSEK (2014)

## WHY DIDN'T LMN WORK?

### **LMN Exclusion Restriction Violated**

With nontrivial – and independent – financial shocks, stock returns should have been in the VAR all along.

### **Resulting Identified Shocks are an Amalgam of True Shocks**

“Activity Shocks” = TFP (+), financial (-), uncertainty (-)

“Uncertainty Shocks” = TFP (+), financial (+), and uncertainty (+)

### **Spurious Conclusions**

- Uncertainty appears to be endogenously countercyclical.
- Uncertainty appears to cause booms.
- Neither is true in underlying model.

# MY CONCLUSIONS

## **A New and Useful Econometric Tool from LMN**

SVAR identification using an external endogenous series to construct an instrument.

## **An Exclusion Restriction with Economic Content**

- External series must not belong in the VAR.
- “Other shocks reflected in stock returns must not affect activity or uncertainty.”

## **Should We Worry about this Assumption?**

- Seems ok in some state of the art uncertainty models.
- Fails with independent financial shocks, spurious conclusions of endogenous uncertainty, wrong sign of uncertainty impact.

**I'm not yet convinced that uncertainty is endogenous or that uncertainty causes booms.**