

# How do Business Cycles Become Global? Common Shocks or Spillovers?

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## Global Business Cycles

- Many papers have shown a substantial amount of comovement in macro variables across countries (Kose, Otrok, Whiteman 2003)
  - ▶ We also can decompose this comovement into global, regional or country or even sectoral factors
- Less is known about **why** countries comove
  - ▶ Are there cross-country spillovers of country specific shocks?
  - ▶ Or, are countries subject to common shocks?
- This paper decomposes business cycle comovement into part due to common shocks, and part due to country shocks that spillover

## Whats new here?

- Other studies have attempted to measure the importance of spillovers
- VAR: Shock country output, and see how shock transmits to other countries
- We develop a framework that first isolates the country specific shock and then allows that shock to spillover to other countries
  - ▶ US output is driven by both Global shocks and country-specific shocks
  - ▶ A shock to US output combines both the global and country shocks
  - ▶ We define a spillover as the US specific shock affecting other countries

## Multiple Channels for Potential Spillovers

- We model propagation of country-specific shocks through different channels
- Direct versus indirect spillovers
  - ▶  $US \Rightarrow Canada$
  - ▶  $US \Rightarrow World \Rightarrow Canada$
- Our model is general enough that we can allow for many types of channels
  - ▶  $US \Rightarrow UK \Rightarrow Canada$
  - ▶  $US \Rightarrow RegionalFactor \Rightarrow Canada$

# Spillover Literature

- Typical approaches to measuring cross-country spillovers:
  - ▶ VAR: trace impact of US output shock on other countries
  - ▶ GVAR: trace impact of shock to index of US economic activity on other countries
- Limitations:
  - ▶ Does not separate out global and country components
  - ▶ Factors are averages of data with assumed weights

## What is a Spillover?

- Event A originates in country 1, which then in turns affects country 2
  - ▶ Often with a time lag
- A Structural view of global and country shocks
  - ▶ Multi-country New Keynesian model of Lubik and Schorfheide (2005)

$$Y_{H,t} = A_{W,t} A_{H,t} N_{H,t}$$

$$Y_{F,t} = A_{W,t} A_{F,t} N_{F,t}$$

- A spillover is a shock to  $A_{H,t}$  that transmits to the Foreign country
- $A_{W,t}$  is a common shock
- Movements in  $Y_{H,t}$  are driven by both  $A_{W,t}$  and  $A_{H,t}$
- More generally a country will have many sectors and sources of shocks

## Spillover Literature

- Use a parametric dynamic factor model to separate global and country components in country data
- Parametric model allows us to simultaneously measure the spillover
- We then study how country-specific movements are transmitted to other countries
- Benefits
  - ▶ Allows us to distinguish between common global shocks and spillovers
  - ▶ Identifies the channels of transmission of spillovers

## Dynamic Factor Model

- Vector of data ( $Y_t$ ) linked to vector of unobserved factors ( $F_t$ ) via factor loadings ( $B$ )

$$Y_t = BF_t + \Gamma_t \quad (1)$$

- where  $\Gamma_t$  is a vector of idiosyncratic shocks that follow independent AR(P) processes
- The latent factors evolve as an autoregressive process

$$F_t = \Psi(L)F_{t-1} + V_t \quad (2)$$

- $V_t$  are iid and uncorrelated
- We study output, consumption and invest in the G7 in this paper



## Identifying Factors

- Group factors are identified by placing 0 restrictions on the factor loading coefficients
- World factor: all variables have unrestricted coefficients
- Country factor: variables not in country impose 0 factor loading
  - ▶ Many factors can be identified this way: regional, sectoral, financial
- Interpretation of country factor
  - ▶ Comovement within country **not** accounted for by the world factor
  - ▶ Think of the country factor as being estimated on data 'purged' of the world factor
  - ▶ In large datasets would want regional factors as well
  - ▶ This is the approach in Kose, Otrok and Whiteman (2003)

## Identifying Factors

$$Y_t = BF_t + \Gamma_t$$

$$\begin{bmatrix} b_{US,Y}^W & 0 & 0 & b_{US,Y}^{US} & 0 & 0 & 0 & 0 & \dots & 0 \\ b_{US,C}^W & 0 & 0 & b_{US,C}^{US} & 0 & 0 & 0 & 0 & \dots & 0 \\ b_{US,I}^W & 0 & 0 & b_{US,I}^{US} & 0 & 0 & 0 & 0 & \dots & 0 \\ b_{Fr,Y}^W & 0 & 0 & 0 & 0 & 0 & b_{Fr,Y}^{Fr} & 0 & \dots & 0 \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\ b_{UK,Y}^W & 0 & 0 & 0 & 0 & 0 & 0 & 0 & \dots & b_{UK,Y}^{UK} \\ b_{UK,C}^W & 0 & 0 & 0 & 0 & 0 & 0 & 0 & \dots & b_{UK,C}^{UK} \\ b_{UK,I}^W & 0 & 0 & 0 & 0 & 0 & 0 & 0 & \dots & b_{UK,I}^{UK} \end{bmatrix} \begin{bmatrix} F_t^W \\ F_{t-1}^W \\ F_{t-2}^W \\ F_t^{US} \\ F_{t-1}^{US} \\ F_{t-2}^{US} \\ F_t^{FR} \\ \vdots \\ F_{t-1}^{UK} \\ F_{t-2}^{UK} \end{bmatrix}$$

## Identifying Spillovers

- Traditional factor model has  $\Psi(L)$  block diagonal

$$F_t = \Psi(L)F_{t-1} + V_t$$

- By allowing off diagonal elements to be non-zero we can allow spillovers across factors
  - ▶ We can allow the factor evolution equation for country  $i$  to depend on country  $j$
  - ▶ We can allow the world factor evolution to depend on country  $j$
- We differentiate between common shocks and spillovers using a timing assumption

## Measuring Spillovers

- Country shocks spillover to the world common cycle
  - Country shock has proportional impact on all other countries
  - Scale of response depends on countries factor loading on world
- Country shocks spillover directly to other countries

$$\begin{bmatrix}
 \phi_1^{w,w} & \phi_2^{w,w} & \phi_3^{w,w} & \phi_1^{w,us} & \phi_1^{w,us} & \phi_1^{w,us} & 0 & \dots & \dots & 0 \\
 1 & 0 & 0 & 0 & 0 & 0 & 0 & \dots & \dots & 0 \\
 0 & 1 & 0 & 0 & 0 & 0 & 0 & \dots & \dots & 0 \\
 0 & 0 & 0 & \phi_1^{us,us} & \phi_2^{us,us} & \phi_3^{us,us} & 0 & \dots & \dots & 0 \\
 \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \dots & \vdots \\
 0 & 0 & 0 & \phi_1^{ca,us} & \phi_2^{ca,us} & \phi_3^{ca,us} & \dots & \vdots & \vdots & \vdots \\
 \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \dots & \vdots \\
 0 & 0 & 0 & \phi_1^{uk,us} & \phi_2^{uk,us} & \phi_3^{uk,us} & \dots & \phi_1^{uk,uk} & \phi_2^{uk,uk} & \phi_3^{uk,uk} \\
 0 & 0 & 0 & 0 & 0 & 0 & \dots & 1 & 0 & 0 \\
 0 & 0 & 0 & 0 & 0 & 0 & \dots & 0 & 1 & 0
 \end{bmatrix}$$

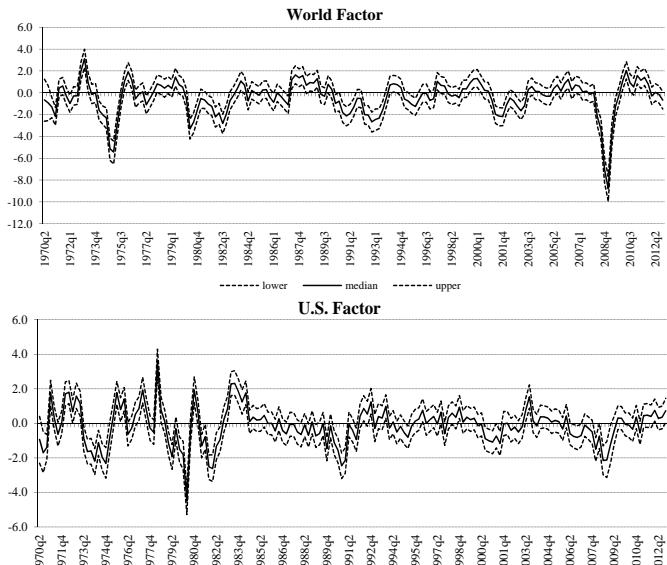
## Data

- Real output, consumption and investment growth in G7 countries
- 1970-2012
- Quarterly data

## Spillover Model Summary for this application

- US factor spills over to World factor
  - ▶ Innovations to US have symmetric impacts on all countries
- US factor spills over directly to other countries
  - ▶ Innovations to US have asymmetric impact to each country
- German factor has same spillovers
  - ▶ Any country can be a source of spillovers, we focus on those that mattered empirically
- We will first look at total comovement in 3 models
  - ▶ No Spillovers, only world channel, both channels for US and GE

## US and World Factors

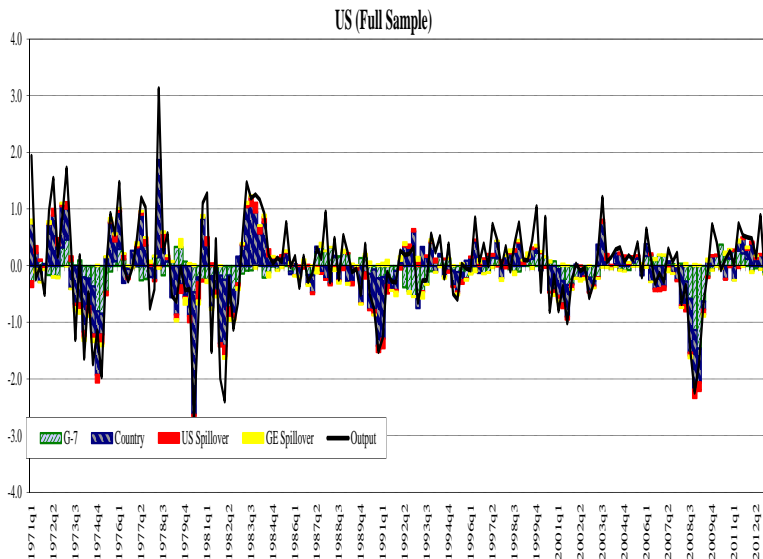


## Interpretation of Crisis

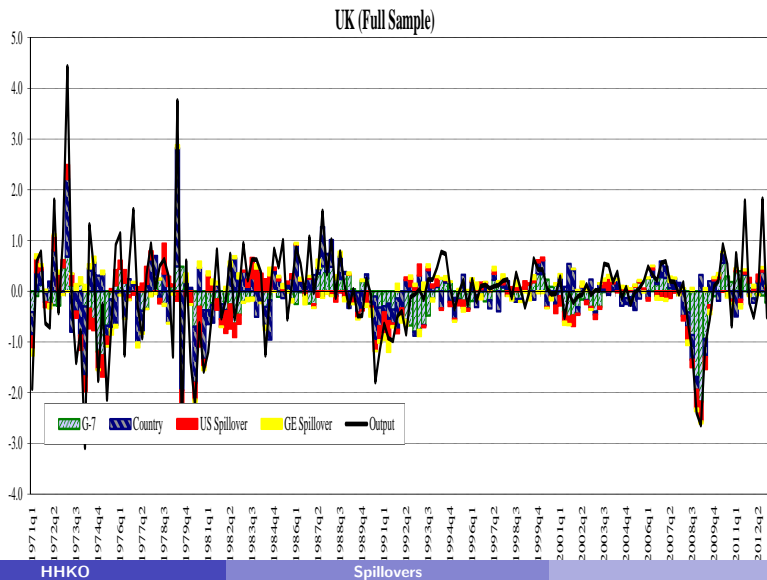
- The US factor does not fall much in the recent crisis
  - ▶ Did the US experience a crisis? Yes, but it is largely accounted for by the global factor
  - ▶ A factor model estimated on only US data would show a larger drop
  - ▶ Not accounting for the world component overstates the country specific decline in the US
    - ★ This will overstate the US role in generating spillovers
- We will see later that the US lead the crisis



# US Full Sample Time Series Decomposition



## UK Full Sample Time Series Decomposition



## Variance Decomposition: Common Shocks Dominate Spillovers

	idio	W	C	US-W	US-C	US-T	Ge-W	Ge-C	Ge-T
<b>US</b>	29.1	12.2	51.5	3.7	0.0	3.7	0.2	1.1	1.5
<b>Ca</b>	29.0	22.7	34.5	7.3	3.2	11.4	0.5	0.5	1.2
<b>Fr</b>	15.9	35.4	32.7	11.6	0.5	12.2	0.7	1.0	2.0
<b>Ge</b>	38.6	30.9	17.7	9.9	0.3	10.4	0.6	0.0	0.6
<b>It</b>	42.7	27.5	17.0	8.9	0.4	9.4	0.6	0.2	0.9
<b>Jp</b>	14.2	12.2	65.6	3.9	1.2	5.5	0.2	1.2	1.6
<b>UK</b>	38.7	18.6	31.8	6.0	1.3	7.7	0.4	1.5	2.1
<b>G7</b>	29.7	22.8	35.8	7.3	1.0	8.6	0.5	0.8	1.4

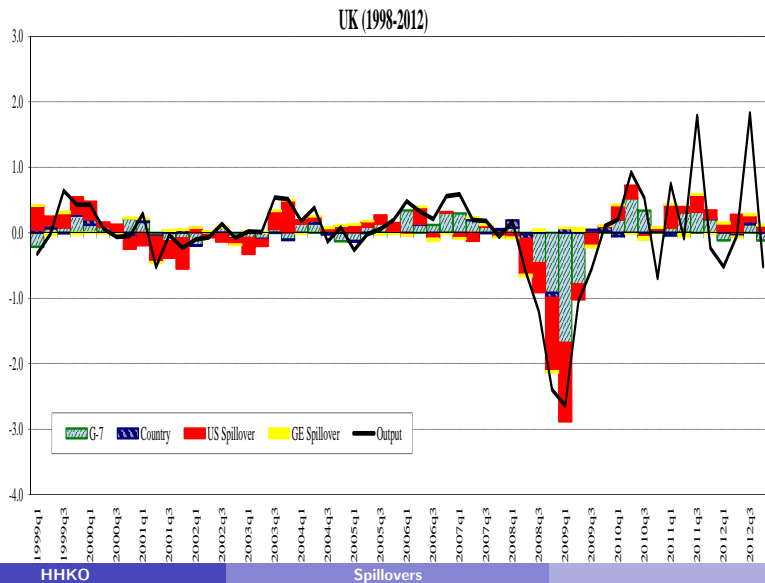
## Variance Decomposition: Spillover and No Spillover Models

	idio	W	C	US-Tot	Ge-Tot	No idio	Spillover W	Model C
<b>US</b>	29.1	12.2	51.5	3.7	1.5	28.6	23.0	48.1
<b>Ca</b>	29.0	22.7	34.5	11.4	1.2	28.5	29.5	41.2
<b>Fr</b>	15.9	35.4	32.7	12.2	2.0	17.7	48.2	33.6
<b>Ge</b>	38.6	30.9	17.7	10.4	0.6	40.6	39.1	19.5
<b>It</b>	42.7	27.5	17.0	9.4	0.9	43.9	39.5	15.6
<b>Jp</b>	14.2	12.2	65.6	5.5	1.6	15.2	16.2	68.0
<b>UK</b>	38.7	18.6	31.8	7.7	2.1	41.2	23.6	34.2
<b>G7</b>	29.7	22.8	35.8	8.6	1.4	30.8	31.3	37.2

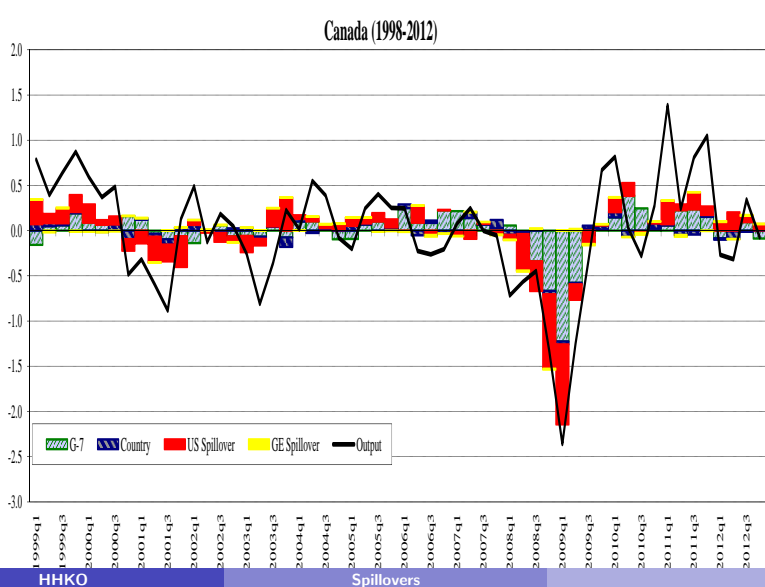
## Subsample Analysis

- We have seen that Global comovement is driven by common shocks, not spillovers
- Has the global economy changed, increasing spillovers?
  - ▶ Kose, Prasad and Otrok (IER, 2012): movement away from common global shocks towards group specific business cycles
  - ▶ Hideaki, Kose and Otrok (2013): Rise of regionalization
    - ★ Rising trade linkages driving comovement post 1985?
  - ▶ Great Recession highlighted increased financial linkages
- We estimate the model over 14 year rolling subsamples

## UK Crisis Period Time Series Decomposition

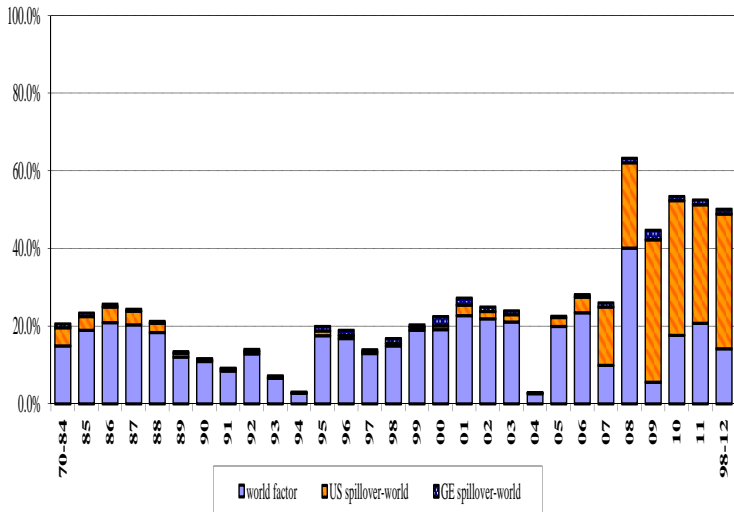


# Canada Crisis Period Time Series Decomposition



# Variance Decomposition: Global Shocks and Country⇒World Spillovers

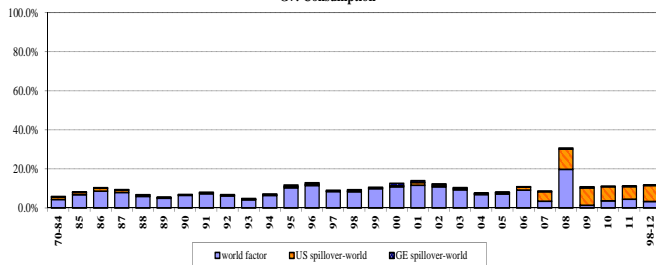
G7: Output



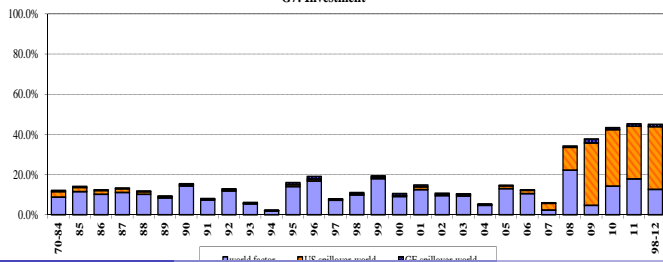


# Variance Decomposition: Global Shocks and Country⇒World Spillovers

G7: Consumption

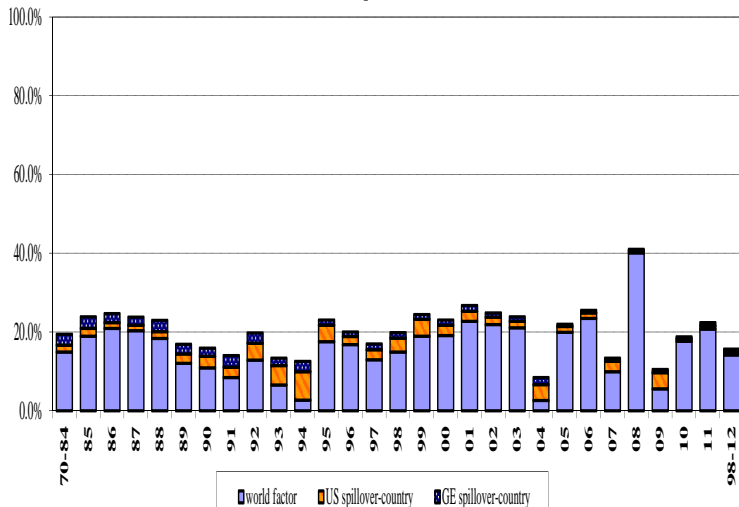


G7: Investment

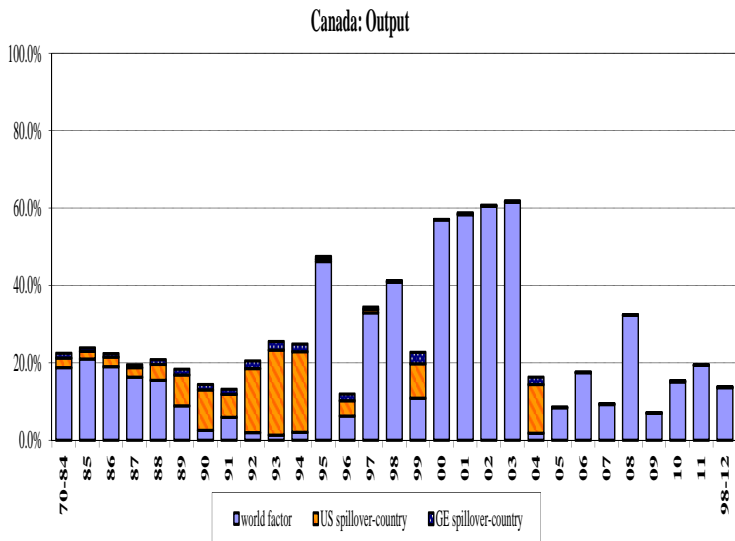


# Variance Decomposition: Global Shocks and Country⇒Country Spillovers

G7: Output



# Variance Decomposition: Canada Output



## What did we learn from this?

- Spillovers are small even in the post 1985 globalization period
- Time periods that include the crisis find large spillovers
- The channel of spillovers is  $US \Rightarrow World \Rightarrow Country$
- $Country \Rightarrow Country$  spillovers are small, except for a brief period in  $US \Rightarrow Canada$

## How do Shocks Propagate?

- Shock US country factor, trace impact onto other countries

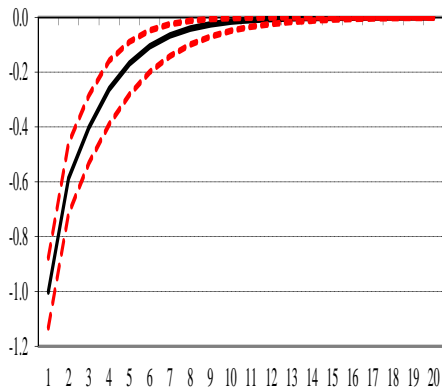
$$Y_t = BF_t + \Gamma_t$$

$$F_t = \Psi(L)F_{t-1} + V_t$$

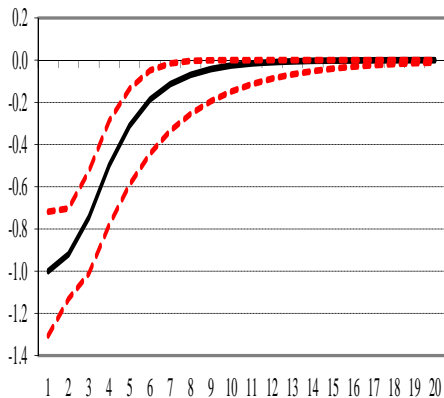
- Size of country shock is that it lower US output one percent
- Exercise emphasizes statistical significance of spillovers
- Exercise highlights channels of transmission

## IRF US to US

US: Output (Full Sample)

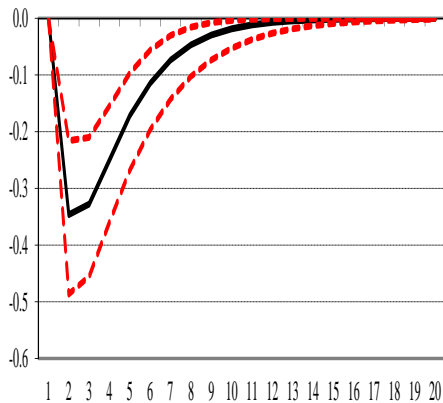


US: Output (1998-2012)

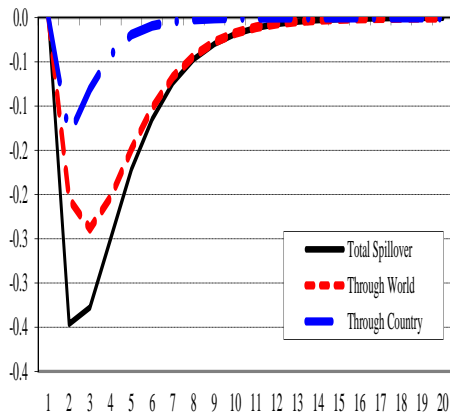


## IRF US to Canada: Full Sample

Canada: Output (Full Sample)

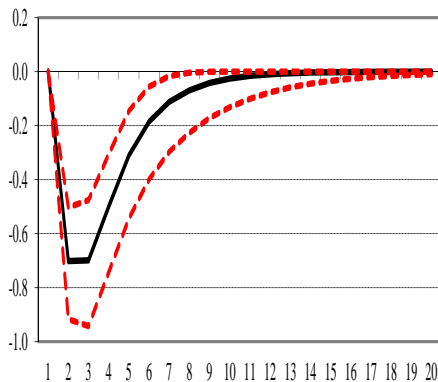


Canada: Output (Full Sample)

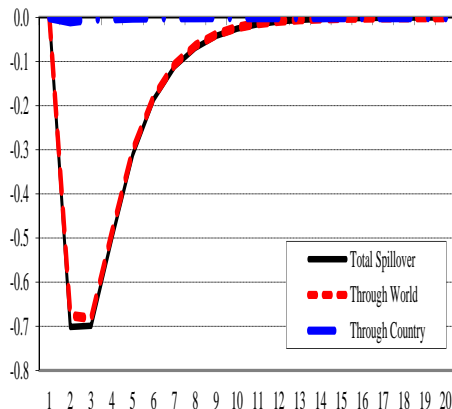


## IRF US to Canada: Crisis

Canada: Output (1998-2012)



Canada: Output (1998-2012)





## Contribution of this paper

- New empirical model
- Spillover needs to be carefully defined
- Parametric approach allows for analysis of the channels of spillovers and changes in those channels
- For G7 business cycles we find common shocks generally explain comovement
- Spillovers are prevalent only in the great recession
- Channel is via world, not bilateral