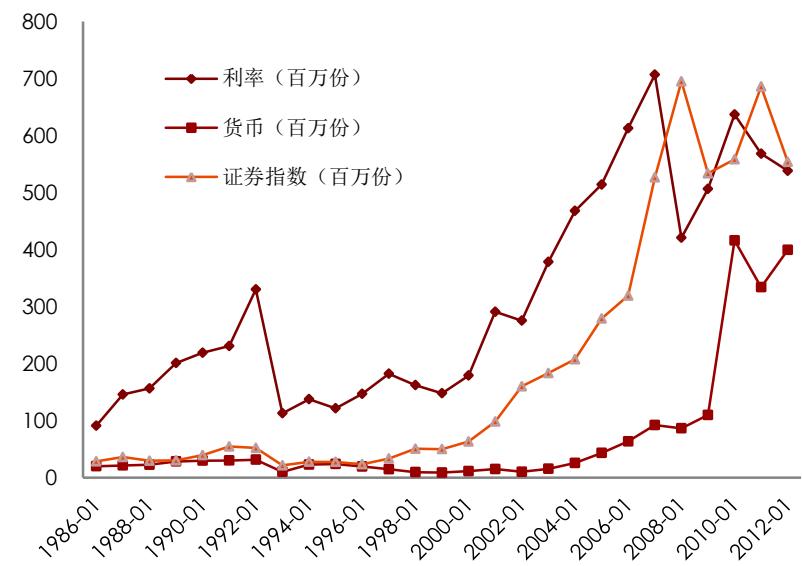
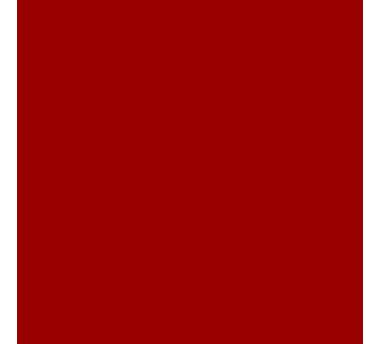




# **Intraday Volatility Spillovers between Index Futures and Spot Market: Evidence from China**

Zhou Zhou, Huiyan Dong, Shouyang Wang

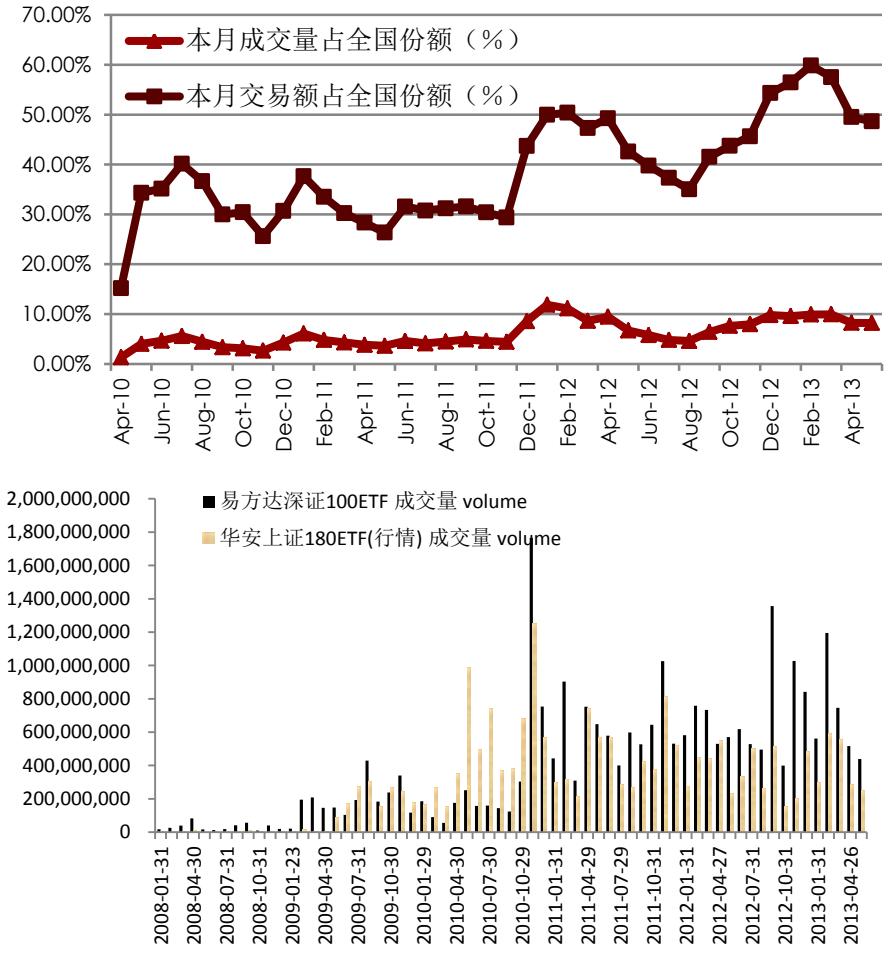
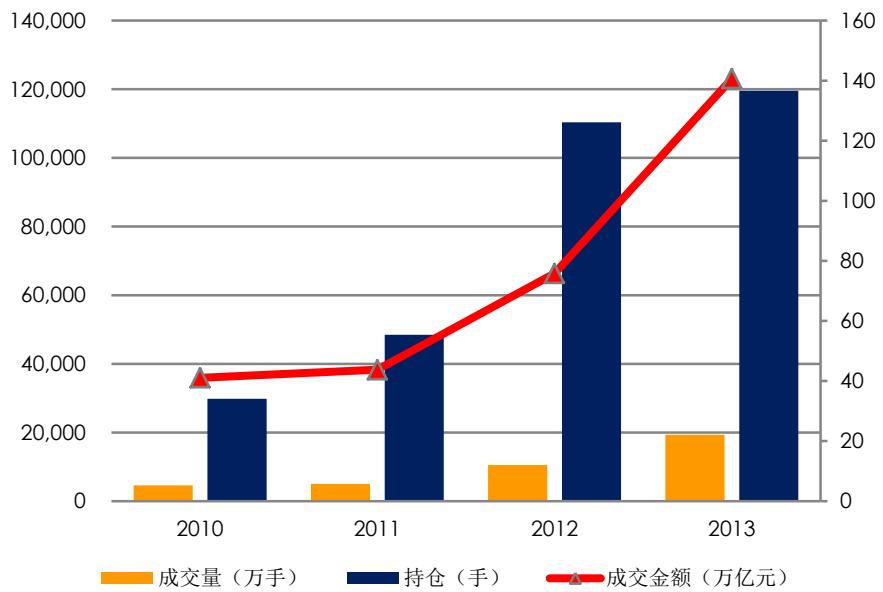
# Introduction



The Crash of October 1987 in the US stock market and its impact on other stock markets overall have motivated the growth of academic researches on the transmission of volatility across different markets.

# Introduction

The first index future in china  
was listed in April 16<sup>th</sup>



# Introduction

- Efficient market hypothesis:
    - efficient market should response simultaneously to any new information
  - In reality
    - different market microstructures
      - Produce lead-lag relationship
      - Understanding volatility spillover is important for **predicting future volatilities** in both markets
- 
- ```
graph LR; A["microstructures"] --> B["Short restrictions"]; A --> C["T+0 or T+1"]; A --> D["transaction costs"];
```

# Introduction



| Researches                                                                                                                                                                                                      |                                                                                                                                |
|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------------|
| <ul style="list-style-type: none"><li>Futures markets play a more important role on volatility spillover<ul style="list-style-type: none"><li>lower transaction costs</li><li>lower margins</li></ul></li></ul> | Zhong et al. (2004)<br>Chatrath et al. (1999)<br>Lien and Tse (2002)<br>Darrat and Rahman (2005)<br>Pericli and Koutmos (2007) |
| <ul style="list-style-type: none"><li>Bi-directional volatility spillover</li></ul>                                                                                                                             | Liu et al. (2008)<br>Chan and Karolyi (2001)<br>Min and Najand (2009)<br>Lin et al. (2002)<br>So and Tse (2004)                |
| <ul style="list-style-type: none"><li>No volatility spillover</li></ul>                                                                                                                                         | Kawaller et al. (2000)<br>Arshanapalli and Doukas(2004)                                                                        |

# Introduction

- Realized volatility
  - better proxy for volatility under the high frequency circumstances
- TVP-VAR model
  - provide time varying relationship among different markets
- Factors that influence the volatility spillover
  - News announcements

# Data and statistics

- One-minute data
  - August 23, 2010 to June 21, 2013, 681 trading days
  - trading time: 9:30-11:29 am and 13:00-14:59 pm,  
163,440 minutes
- The 240 minutes on each trading day were divided into four sub-intervals
- Calculated the realized volatility within each sub-interval

$$r(t, \Delta) = p(t + \Delta) - p(t)$$

$$\sigma_{t,\Delta}^2 = \sum_{j=1}^{1/\Delta} r_{t-1+j\Delta, \Delta}^2$$

# Data and statistics

|                                            | Futures     |             | Spot        |             |
|--------------------------------------------|-------------|-------------|-------------|-------------|
|                                            | RV          | $\Delta$ RV | RV          | $\Delta$ RV |
| <b>Panel A: Descriptive statistics</b>     |             |             |             |             |
| Observation                                | 2724        | 2723        | 2724        | 2723        |
| Mean                                       | 3.90E-05    | -7.75E-09   | 2.44E-05    | 1.64E-09    |
| Max                                        | 0.000835    | 0.000782    | 0.000939    | 0.000918    |
| Min                                        | 5.36E-07    | -0.000738   | 1.56E-06    | -0.000920   |
| Skewness                                   | 7.102130    | 0.628486    | 9.948980    | 0.165785    |
| Kurtosis                                   | 75.41066    | 49.02570    | 140.6173    | 74.71264    |
| Jarque-B                                   | 618014.8**  | 240525.4**  | 2194459**   | 583494.9**  |
| <b>Panel B: Results of unit root tests</b> |             |             |             |             |
| ADF                                        | -6.920091** | -18.40772** | -10.10731** | -18.30215** |
| PP                                         | -56.57999** | -246.7157** | -56.71559** | -338.3654** |

\*\* indicates the rejection of the null hypothesis at the 1% level of significance

# Data and statistics

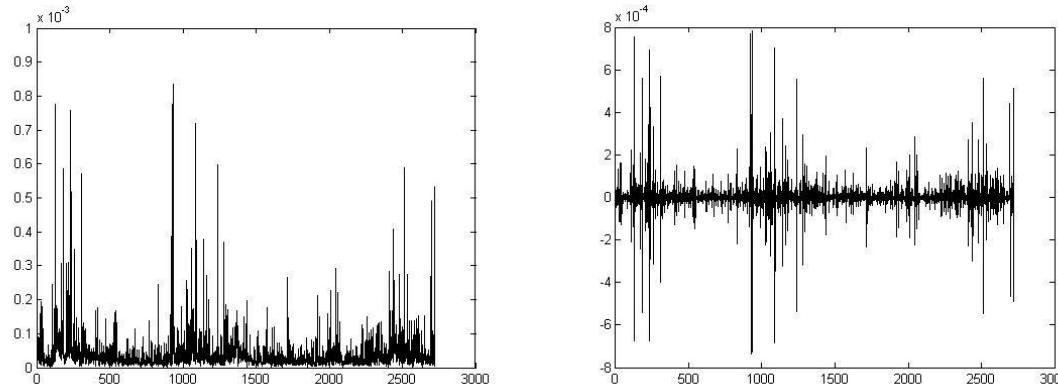
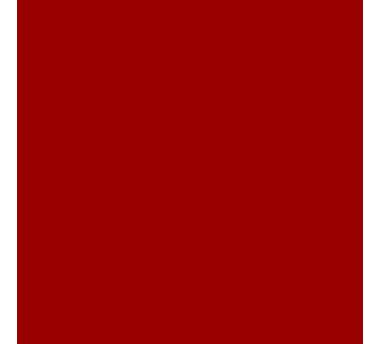


Fig. 1. (a) realized volatility of index future; (b) change of realized volatility of index future

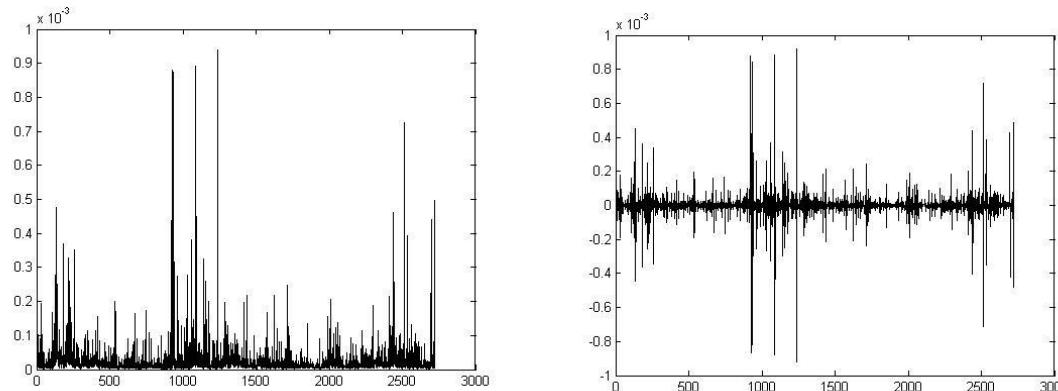


Fig. 2. (a) realized volatility of spot; (b) change of realized volatility of spot

# Data and statistics

## ■ Scheduled news released:

- Growth: 6 (GDP/profit/invest/power consumption/consumption)
- Monetary policy: 2 (M2/loan)
- Price: 2 (CPI/PPT)
- Investigation index: (PMI/HSBC PMI)

## ■ Unscheduled news released

- Reserve rate
- Interest rate

| 发布日期       | 时间       | 内容                       |
|------------|----------|--------------------------|
| 2012/7/5   | 19:00:00 | 下调金融机构人民币存贷款基准利率0.25个百分点 |
| 2012/6/7   | 19:00:00 | 下调金融机构人民币存贷款基准利率0.25个百分点 |
| 2011/7/6   | 18:32:12 | 上调金融机构人民币存贷款基准利率0.25个百分点 |
| 2011/4/5   | 18:00:14 | 上调金融机构人民币存贷款基准利率0.25个百分点 |
| 2011/2/8   | 18:30:30 | 上调金融机构人民币存贷款基准利率0.25个百分点 |
| 2010/12/25 | 17:35:21 | 上调金融机构人民币存贷款基准利率0.25个百分点 |
| 2010/10/19 | 18:59:36 | 上调金融机构人民币存贷款基准利率0.25个百分点 |

| 公布日期       | 公布时间     | 执行日期       | 内容                        |
|------------|----------|------------|---------------------------|
| 2012/5/12  | 19:00:00 | 2012/5/18  | 下调金融机构人民币存款准备金率0.5个百分点    |
| 2012/2/18  | 20:00:00 | 2012/2/24  | 下调金融机构人民币存款准备金率0.5个百分点    |
| 2011/11/30 | 19:03:42 | 2011/12/5  | 下调金融机构人民币存款准备金率0.5个百分点    |
| 2011/6/14  | 15:18:25 | 2011/6/20  | 上调存款类金融机构人民币存款准备金率0.5个百分点 |
| 2011/5/12  | 18:30:02 | 2011/5/18  | 上调金融机构人民币存款准备金率0.5个百分点    |
| 2011/4/17  | 17:02:15 | 2011/4/21  | 上调存款类金融机构人民币存款准备金率0.5个百分点 |
| 2011/3/18  | 18:20:56 | 2011/3/25  | 上调存款类金融机构人民币存款准备金率0.5个百分点 |
| 2011/2/18  | 18:02:18 | 2011/2/24  | 上调存款类金融机构人民币存款准备金率0.5个百分点 |
| 2011/1/14  | 17:55:26 | 2011/1/20  | 上调存款类金融机构人民币存款准备金率0.5个百分点 |
| 2010/12/10 | 18:00:01 | 2010/12/20 | 上调存款类金融机构人民币存款准备金率0.5个百分点 |
| 2010/11/19 | 17:59:46 | 2010/11/29 | 上调存款类金融机构人民币存款准备金率0.5个百分点 |
| 2010/11/10 | 18:45:00 | 2010/11/16 | 上调存款类金融机构人民币存款准备金率0.5个百分点 |

# Data and statistics

| 指标名称              | 8:32 | 9:00 | 9:30 | 9:45 | 10:00 | 10:23 | 10:30 | 11:00 | 11:30 | 13:00 | 13:30 | 15:00 | 15:05 | 15:30 | 16:00 | 16:02 | 16:05 | 17:00 | 总计  |
|-------------------|------|------|------|------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-----|
| CPI: 同比 (%)       |      | 23   |      | 10   |       |       |       |       |       | 1     |       |       |       |       |       |       |       |       | 34  |
| GDP: 当季同比 (%)     |      |      |      |      | 11    |       |       |       |       |       |       |       |       |       |       |       |       |       | 11  |
| M2: 同比 (%)        | 1    | 1    |      |      | 13    |       |       |       |       | 1     |       | 2     | 4     |       | 8     | 1     | 1     | 2     | 34  |
| PMI               |      | 34   |      |      |       |       |       |       |       |       |       |       |       |       |       |       |       |       | 34  |
| PPI: 同比 (%)       |      | 23   |      | 10   |       |       |       |       |       | 1     |       |       |       |       |       |       |       |       | 34  |
| 工业企业利润: 累计同比 (%)  |      | 14   |      | 13   |       |       |       |       |       |       |       |       |       |       |       |       |       |       | 27  |
| 工业增加值: 同比 (%)     |      |      | 18   |      |       |       |       |       |       | 11    |       | 1     |       |       |       |       |       |       | 30  |
| 固定资产投资: 累计同比 (%)  |      |      |      | 18   |       |       |       |       |       | 12    |       | 1     |       |       |       |       |       |       | 31  |
| 汇丰PMI             |      |      | 8    |      | 26    |       |       |       |       |       |       |       |       |       |       |       |       |       | 34  |
| 汇丰PMI (预览)        |      |      | 9    |      | 20    |       |       |       |       |       |       |       |       |       |       |       |       |       | 29  |
| 贸易顺差 (亿美元)        |      |      | 8    | 1    | 1     | 2     | 22    |       |       |       |       |       |       |       |       |       |       |       | 34  |
| 全社会用电量: 累计同比 (%)  | 1    |      |      |      | 30    |       |       |       |       |       |       |       |       |       |       |       |       |       | 31  |
| 社会消费品零售总额: 同比 (%) |      |      | 18   |      |       |       |       |       |       | 11    |       | 1     |       |       |       |       |       |       | 30  |
| 新增人民币贷款 (亿元)      | 1    | 1    | 16   |      |       |       |       | 1     |       | 1     | 4     | 1     | 6     |       | 1     | 2     | 1     | 2     | 34  |
| 总计                | 2    | 37   | 60   | 17   | 135   | 1     | 47    | 32    | 22    | 2     | 36    | 3     | 8     | 4     | 14    | 1     | 2     | 4     | 427 |

# Methodology

- TVP-VAR Model
  - time varying coefficients: capture nonlinearities relationship
  - time varying covariance matrix of the additive innovations: capture possible heteroscedastic of the shocks
- SVAR:

$$Ay_t = F_1y_{t-1} + \dots + F_sy_{t-s} + u_t \quad \rightarrow \quad y_t = B_1y_{t-1} + \dots + B_sy_{t-s} + A^{-1}\Sigma\epsilon_t, \quad \epsilon_t \sim N(0, I_k)$$

$$u_t \sim N(0, \Sigma\Sigma) \quad \Sigma = \begin{pmatrix} \sigma_1 & 0 & \cdots & 0 \\ 0 & \sigma_2 & \ddots & \vdots \\ \vdots & \ddots & \ddots & 0 \\ 0 & \cdots & 0 & \sigma_n \end{pmatrix}$$

$$A_t = \begin{pmatrix} 1 & 0 & \cdots & 0 \\ a_{21} & 1 & \ddots & \vdots \\ \vdots & \ddots & \ddots & 0 \\ a_{k1} & \cdots & a_{k,k-1} & 1 \end{pmatrix}$$

# Methodology

$$y_t = X_t \beta_t + A_t^{-1} \Sigma_t \varepsilon_t, \quad t = s+1, \dots, n,$$

$$\beta_{t+1} = \beta_t + \mu_{\beta t}$$

$$\alpha_{t+1} = \alpha_t + \mu_{\alpha t}$$

$$h_{t+1} = h_t + \mu_{ht}$$

$$\begin{pmatrix} \varepsilon_t \\ \mu_{\beta t} \\ \mu_{\alpha t} \\ \mu_{ht} \end{pmatrix} \sim N \left( 0, \begin{pmatrix} I_n & 0 & 0 & 0 \\ 0 & \Sigma_\beta & 0 & 0 \\ 0 & 0 & \Sigma_\alpha & 0 \\ 0 & 0 & 0 & \Sigma_h \end{pmatrix} \right)$$

- Estimation:
  - Bayesian methods
  - MCMC

# Empirical results

## ■ VAR (2) 模型

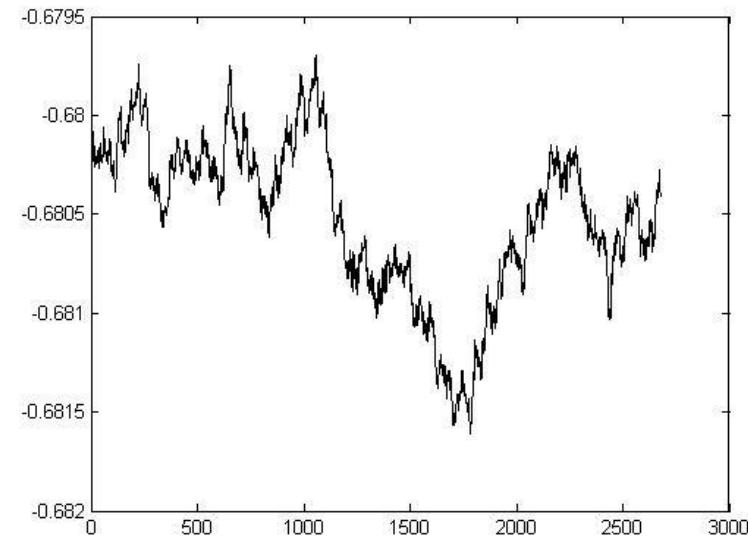
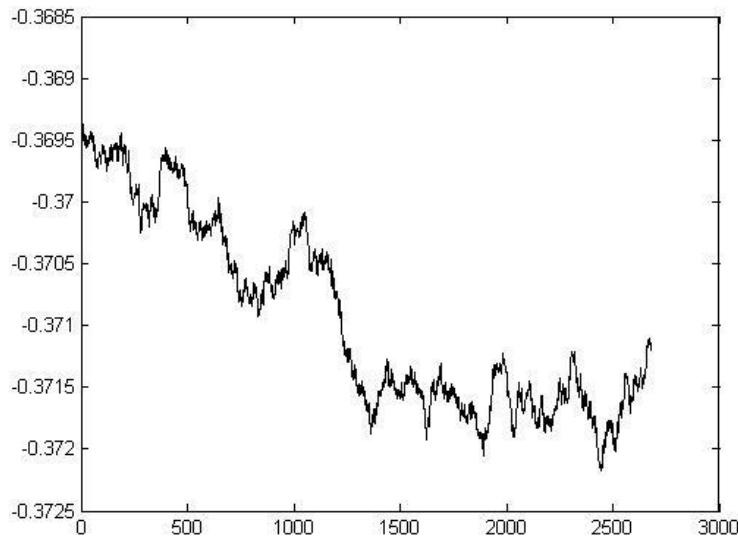
$$\Delta RV_t = C + \Omega \Delta RV_{t-1} + \Phi \Delta RV_{t-2} + + \varepsilon_t$$

|                       | D (CSI_RV_HOUR)           | D (IF_RV_HOUR)            |
|-----------------------|---------------------------|---------------------------|
| D (CSI_RV_HOUR (-1) ) | -0.633755<br>[-19.4829]** | 0.050969<br>[ 1.52933]    |
| D (IF_RV_HOUR (-1) )  | -0.017043<br>[-0.53634]   | -0.643225<br>[-19.7568]** |
| D (CSI_RV_HOUR (-2) ) | -0.259111<br>[-7.98020]** | 0.068602<br>[ 2.06220]**  |
| D (IF_RV_HOUR (-2) )  | -0.103319<br>[-3.26563]** | -0.402775<br>[-12.4254]** |
| C                     | 4.70E-09<br>[ 0.00407]    | -4.42E-09<br>[-0.00374]   |
| Adj. R-squared        | 0.325296                  | 0.2958                    |
| F-statistic           | 328.8492                  | 286.6348                  |
| Log likelihood        | 22582.71                  | 22516.69                  |
| Log likelihood        | 46682.9                   |                           |

- Bidirectional volatility spillover
- The volatility of the stock index futures market brings down the volatility of the stock market

# Empirical results

- Primiceri (2005) MATLAB code
  - draw 10000 samples after the initial 5000 samples are discarded



- Since Sept, 2011, the effect enlarged——More institutional investors

# Empirical results

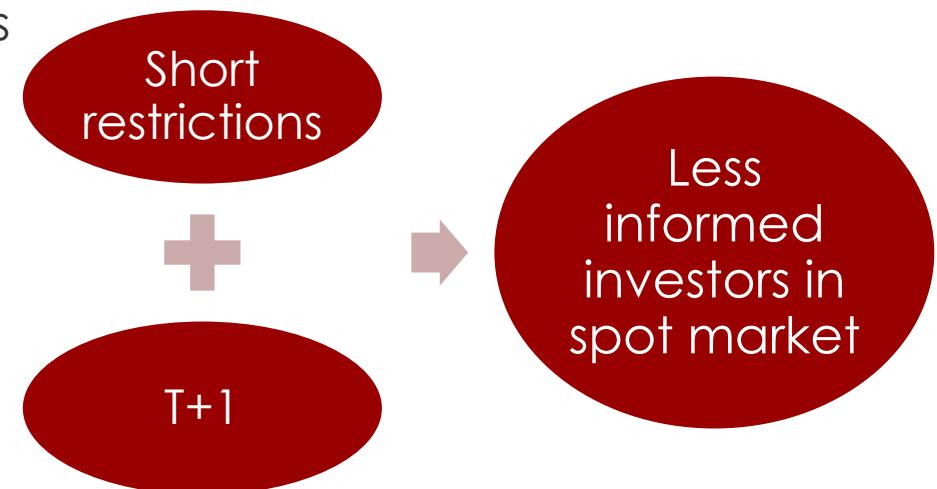
$$\Delta RV_t = C + \Omega \Delta RV_{t-1} + (\Phi + \alpha A_1 + \beta A_2) \Delta RV_{t-2} + \varepsilon_t$$

|                                  | D (CSI_RV_HOUR)                          | D (IF_RV_HOUR)                           |
|----------------------------------|------------------------------------------|------------------------------------------|
| <b>D (CSI_RV_HOUR (-1) )</b>     | -0.648863<br>[-20.7997]                  | 0.037108<br>[ 1.15427]                   |
| <b>D (IF_RV_HOUR (-1) )</b>      | -0.000388<br>[-0.01273]                  | -0.628162<br>[-20.0198]                  |
| <b>D (CSI_RV_HOUR (-2) )</b>     | -0.284531<br>[-9.09864]                  | 0.044359<br>[ 1.37647]                   |
| <b>D (IF_RV_HOUR (-2) )</b>      | -0.056052<br>[-1.83044]                  | -0.360648<br>[-11.4284]                  |
| <b>D (CSI_RV_HOUR (-2) ) *A1</b> | 0.0485<br>[ 0.24389]                     | 0.082129<br>[ 0.40077]                   |
| <b>D (IF_RV_HOUR (-2) ) *A1</b>  | <b>-1.190095</b><br><b>[-6.72564]**</b>  | <b>-1.00045</b><br><b>[-5.48632]**</b>   |
| <b>D (CSI_RV_HOUR (-2) ) *A2</b> | 9.896009<br>[ 5.67553] **                | 12.27748<br>[ 6.83266] **                |
| <b>D (IF_RV_HOUR (-2) ) *A2</b>  | <b>-9.965644</b><br><b>[-10.9563] **</b> | <b>-10.84732</b><br><b>[-11.5722] **</b> |

- The news released affect the size of the volatility spillover, both the scheduled and nonscheduled information.
- The volatility spillover between this two market are mostly taken by the news released

# Conclusions and Discussions

- C1: bi-directional volatility spillovers
  - New information is almost reflected in spot and futures markets simultaneously
- C2: futures' volatility decrease the change of spot market's volatility
  - risk management function
  - In theory: more informed investors



# Conclusions and Discussions

- C3: the influence of futures market on spot market enlarged as time passed, especially at the third quarter of 2011
  - In reality: more informed investors

## Mutual Fund

- Time lag: Nanfang Xiaokang ETF was listed in the first quarter in 2012

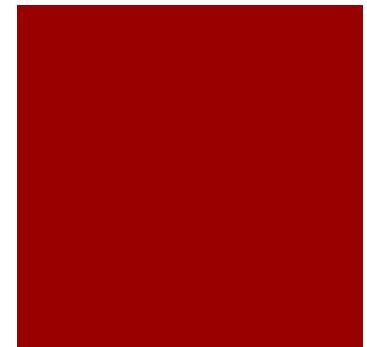
## QDII

- 2011年5月 《合格境外机构投资者参与股指期货交易指引》

## Trust Company

- 2011年7月 《信托公司参与股指期货交易业务指引》出台

- C4: The volatility spillover between this two market are mostly taken by the news released



# Thanks!