

# A Study on the Foreign Exchange Market

Chonkit Pun  
Tianchi Chen

# Outline

- Intro to foreign exchange
- Time series analysis
  - Exchange rate and correlation of return
  - Arbitrage of return and bid-ask spread

# Introduction: Foreign Exchange(Forex)

- Decentralized (as oppose to stock exchange)
- Trade 24 hours a day, 5 days a week
- High liquidity
- Spot market
- Future/forward market

# Mechanism

- USD/EUR: how much EUR does 1 USD buy
- Ask: price to buy the base currency
- Bid: Selling price of the base currency
- Bid-ask spread: difference between bid and ask

**USD/CAD = 1.2000/05**

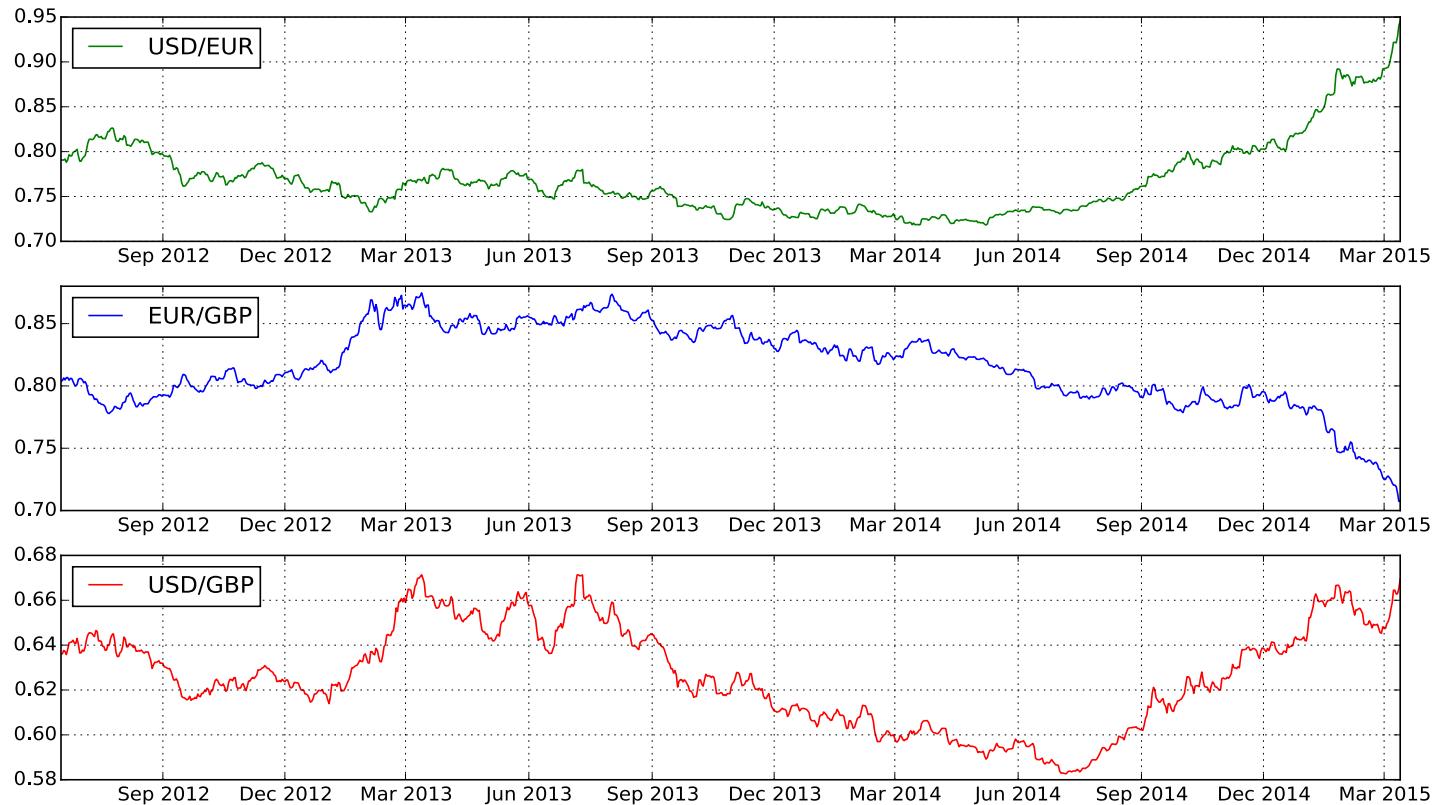
**Bid = 1.2000**

**Ask= 1.2005**

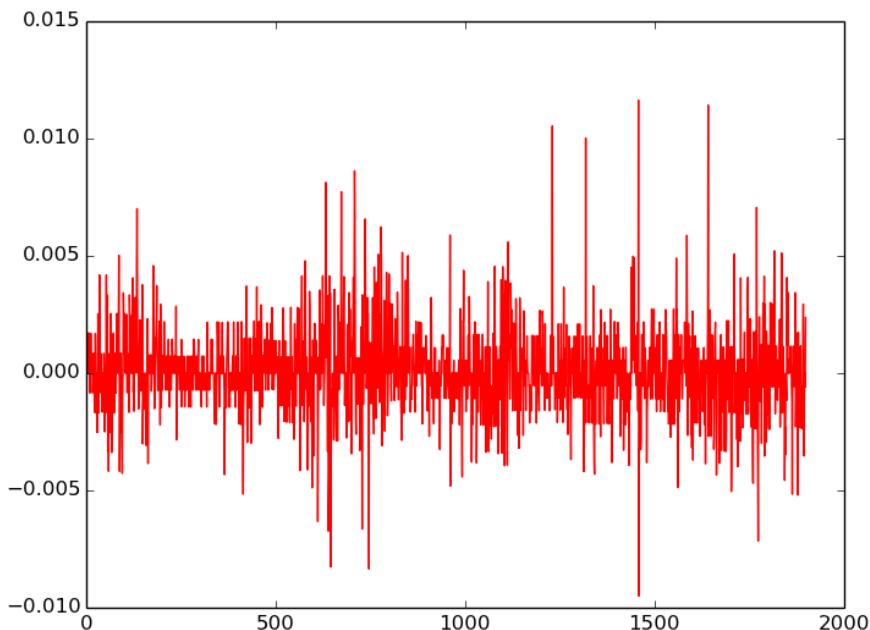
# Spot market

- Exchange rate depends on supply and demand
- Factors:
  - Inflation rate: high inflation=>lower money value
  - Interest rate: high interest rate=>higher money value
  - Terms of trade: import > export => lower money value

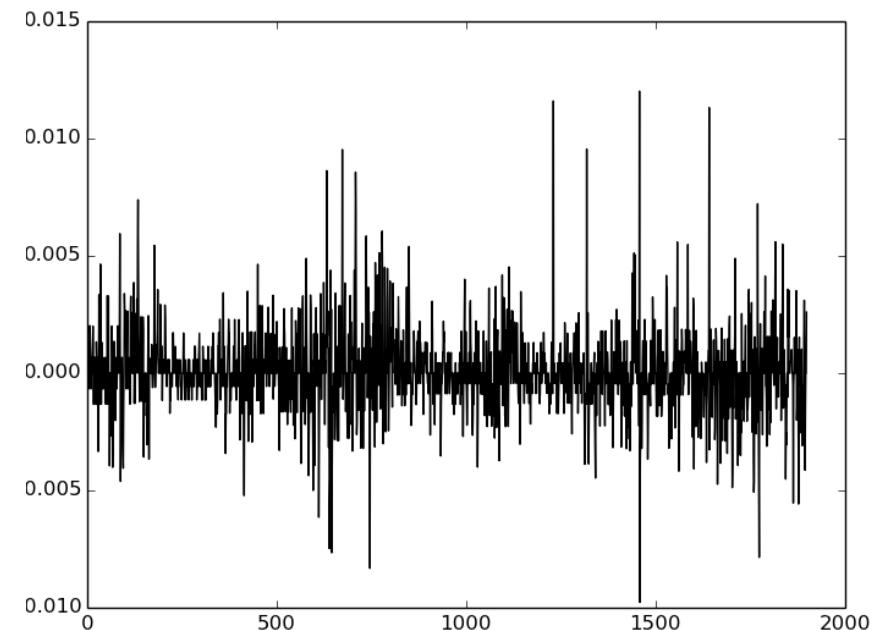
# Time series analysis I: return of exchange rate and correlation



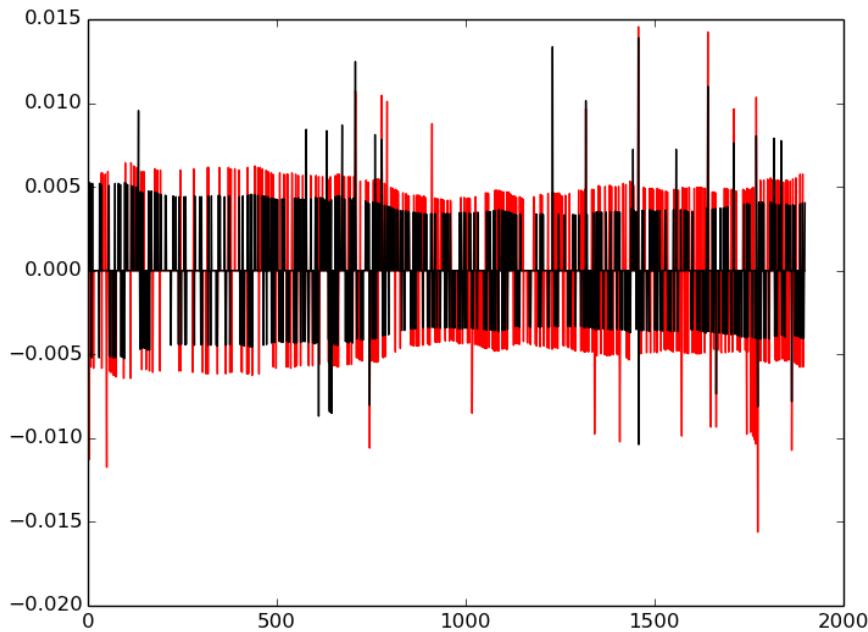
# Return of exchange rate



JPY/CNY

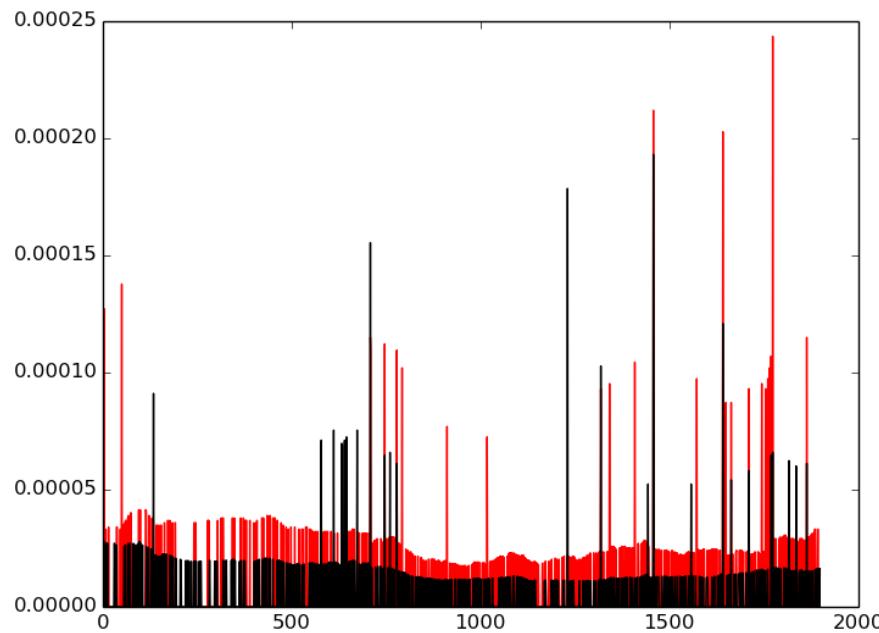


JPY/HKD



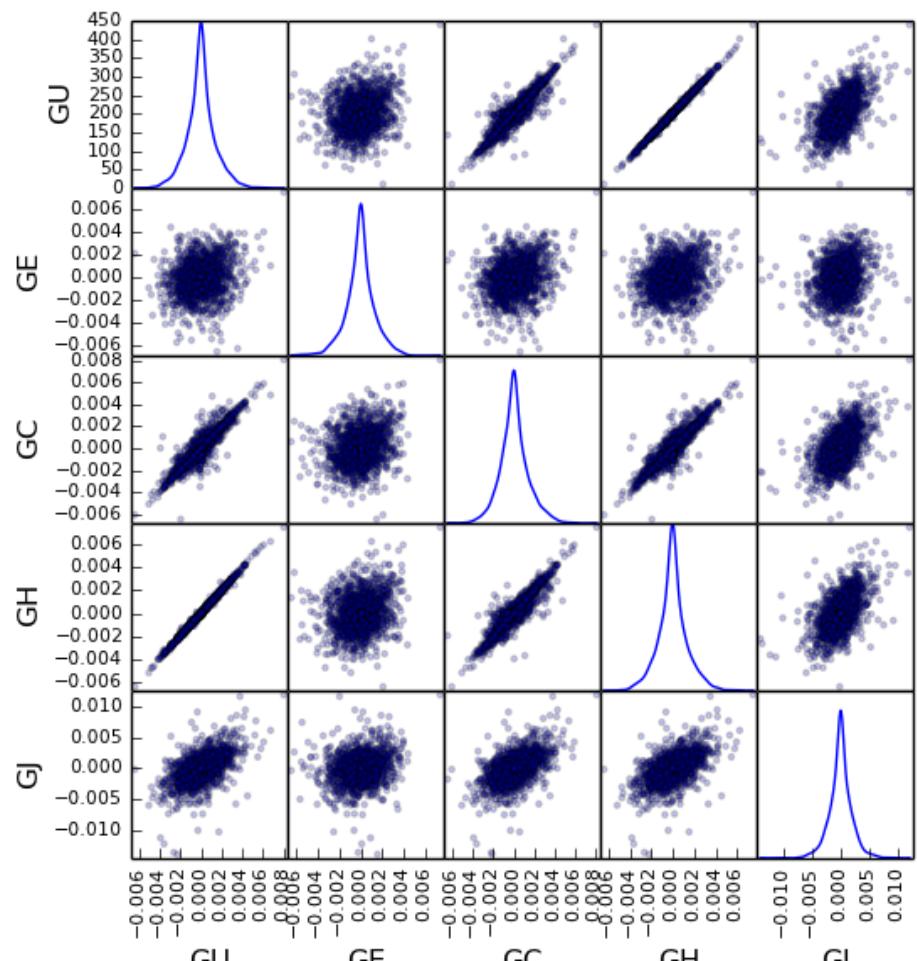
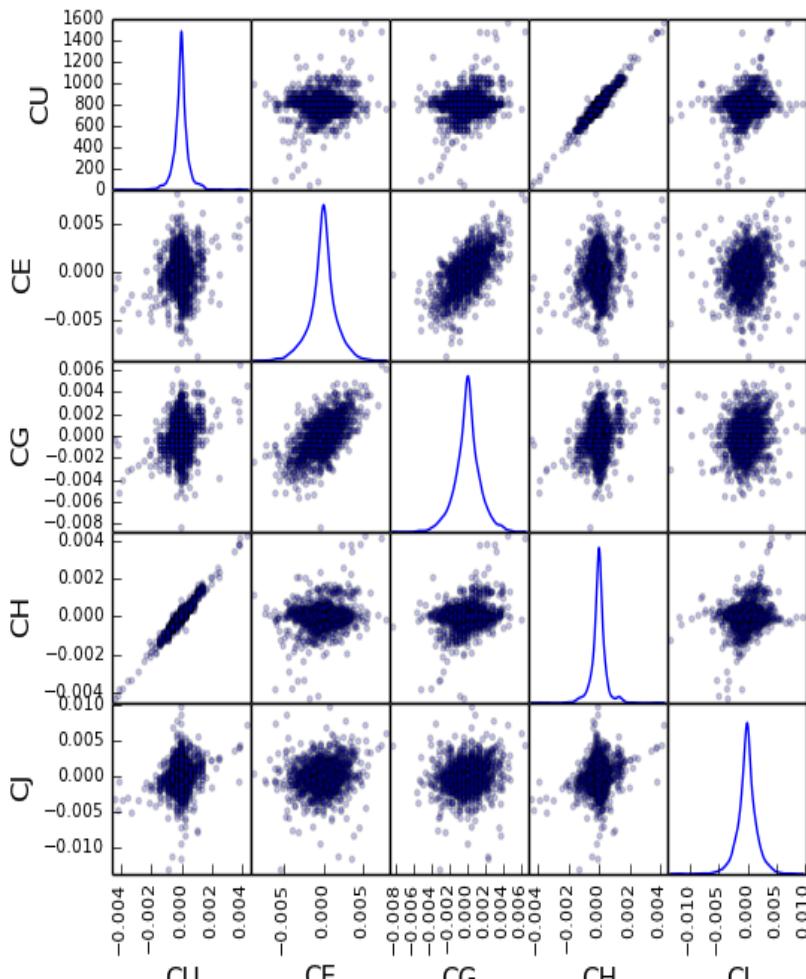
Time series of log return of  
JPY/EUR (black)  
and JPY/USD (red)

R=Log return plot



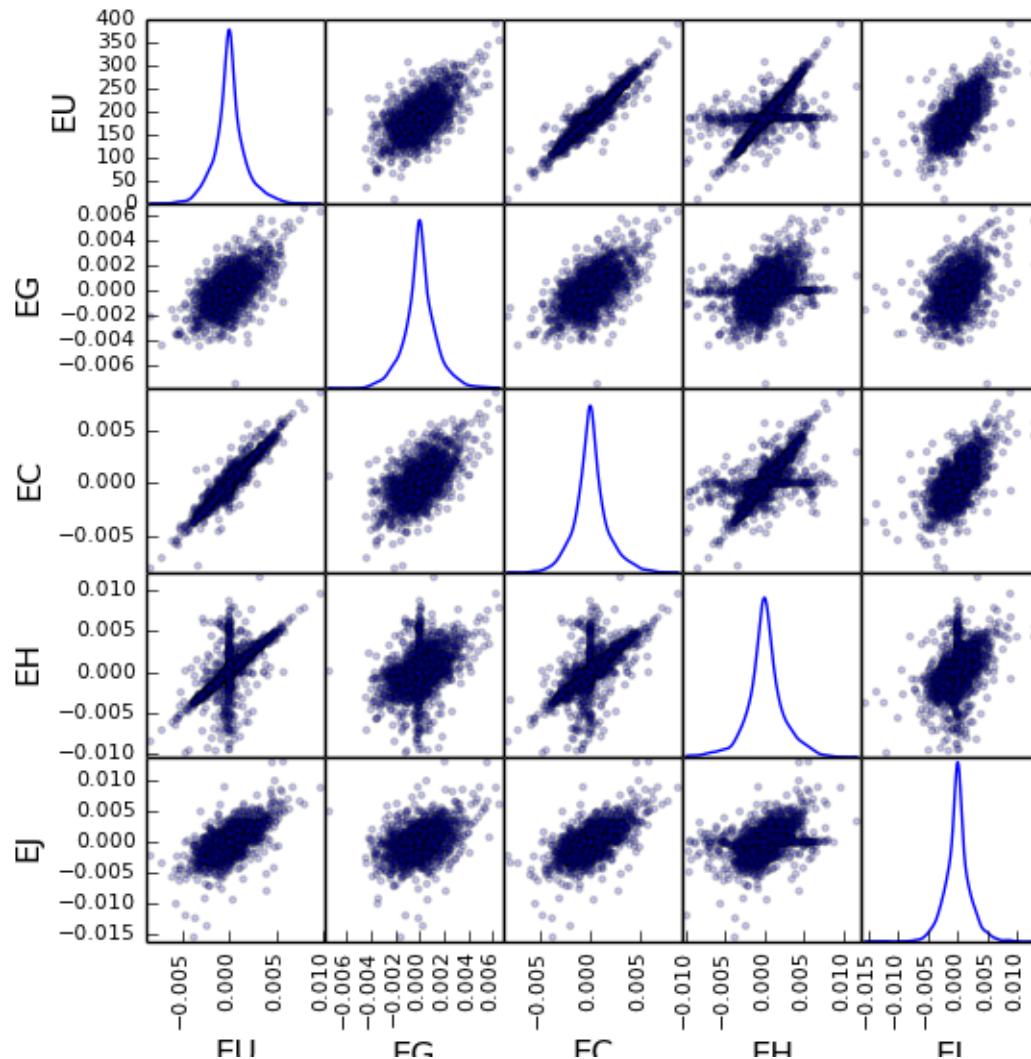
Volatility= $R^2$

2-d scatter plot could give us more information of how two currency correlate  
Four categories



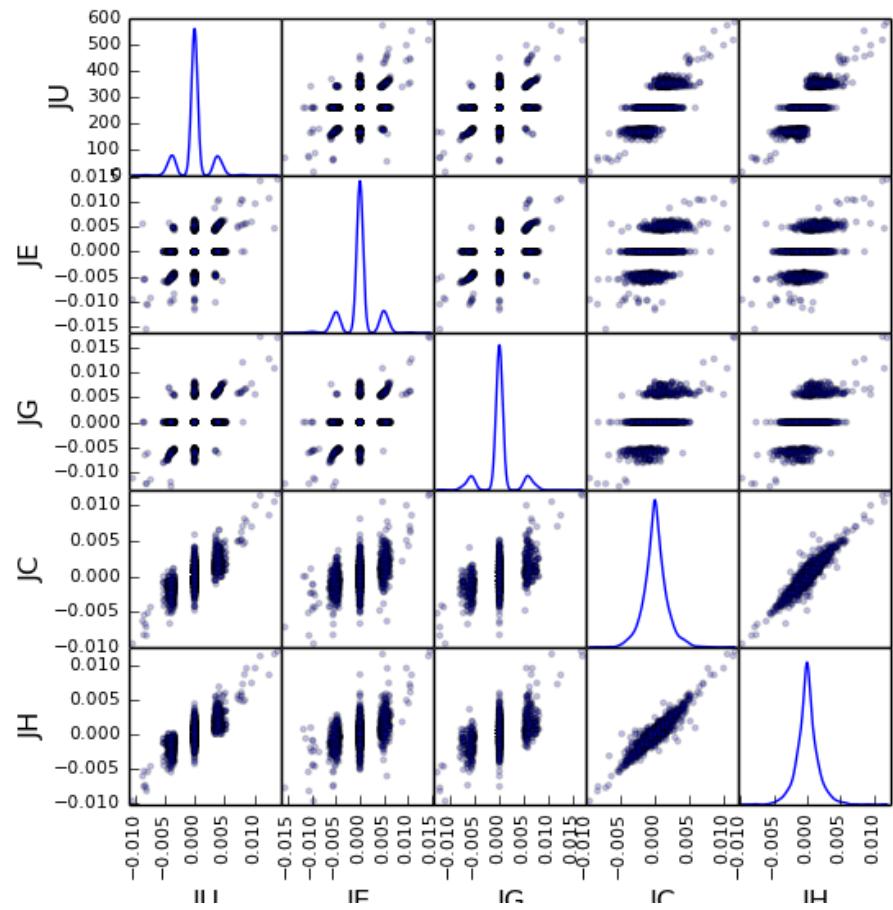
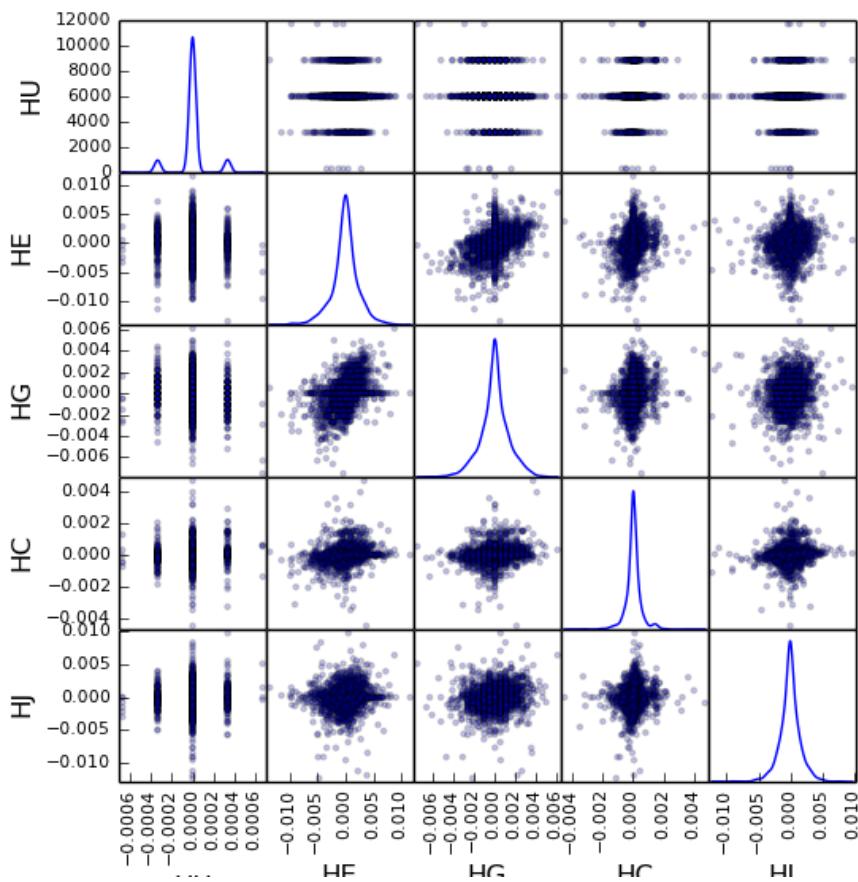
C and G shows more fuzziness

## EUR shows some uncertain correlation

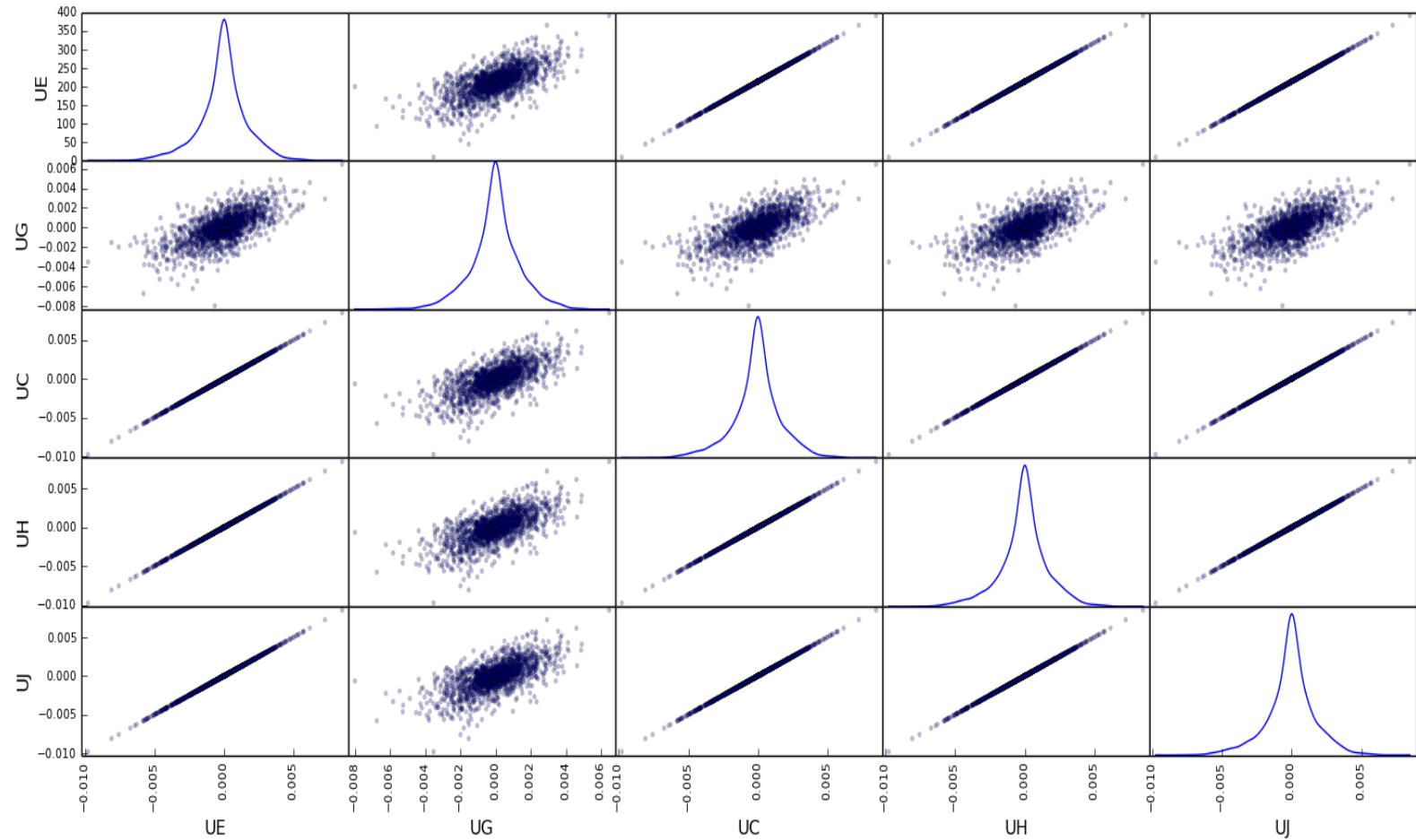


H and J shows “Discreteness “ along with correlation

2-d scatter plot can tell us more about how two currency correlate via a third currency



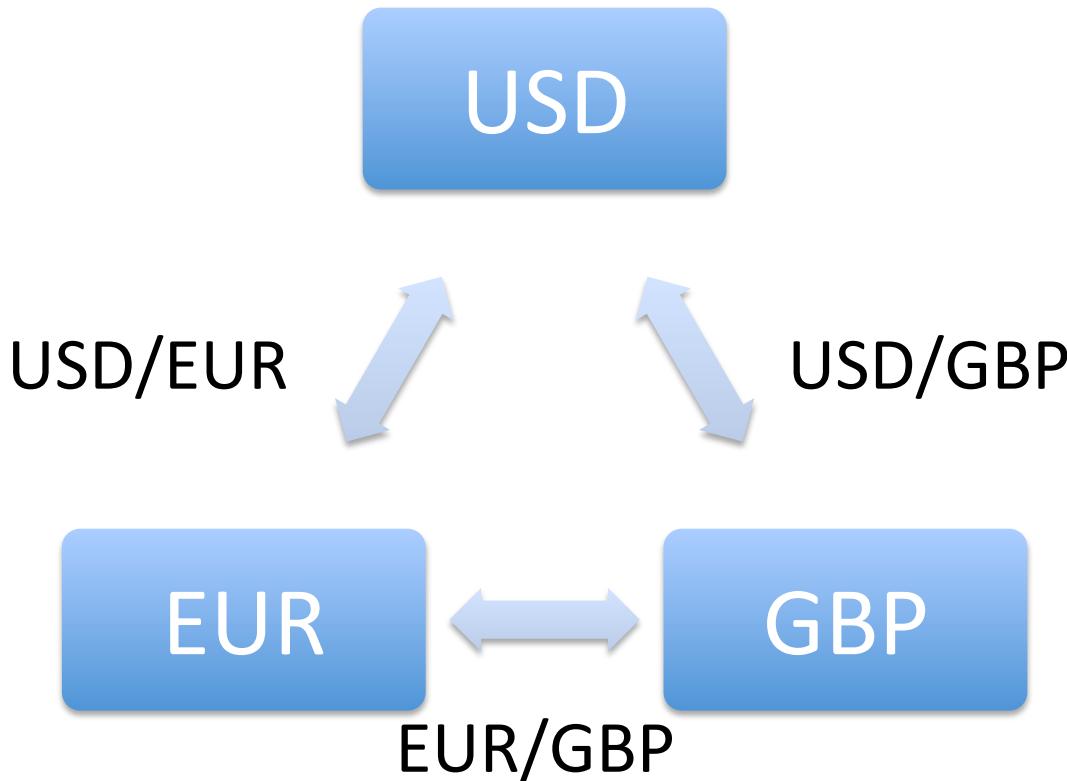
## Most stable one if USD



# Time series analysis II: arbitrage of return and bid ask spread



# The triangle arbitrage



At particular moment, if  $(USD/EUR) * (EUR/GBP) * (GBP/USD) = \neq 1$ , an arbitrage opportunity exist

# The triangle arbitrage

- Our data: daily average exchange rate
- Not high frequency data (of order ms → s)
- Arbitrage does exist, but dissipates very quickly , of order of 10s (Danial Fenn, University of Oxford)
- Look at ‘arbitrage’ of return instead:

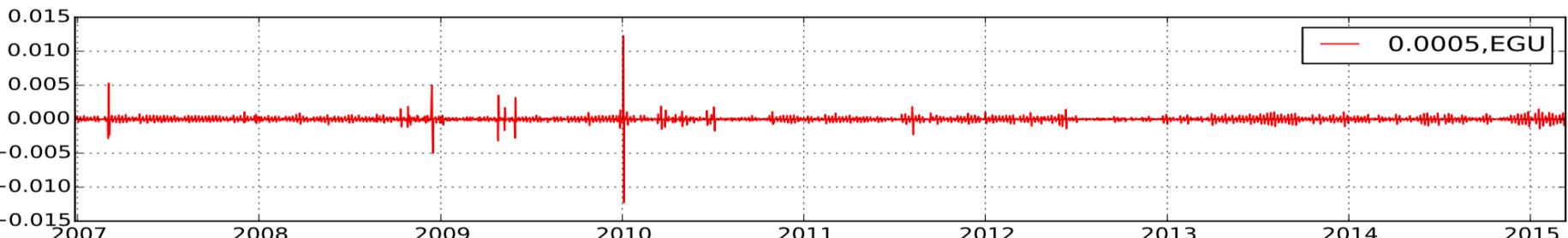
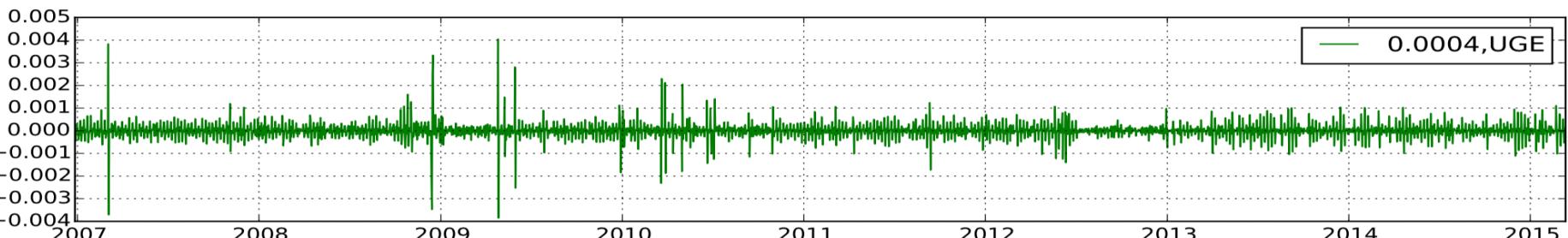
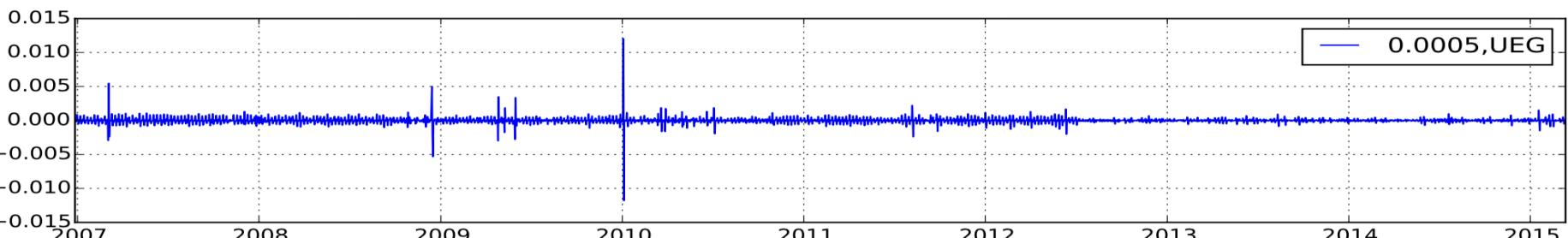
$$\text{Arbitrage} = R(\text{USD/EUR})_t * R(\text{EUR/GBP})_t - R(\text{USD/GBP})_t$$

Where  $R(x)_t = \ln(x(t+1)) - \ln(x(t))$

# Time series of (return) arbitrage

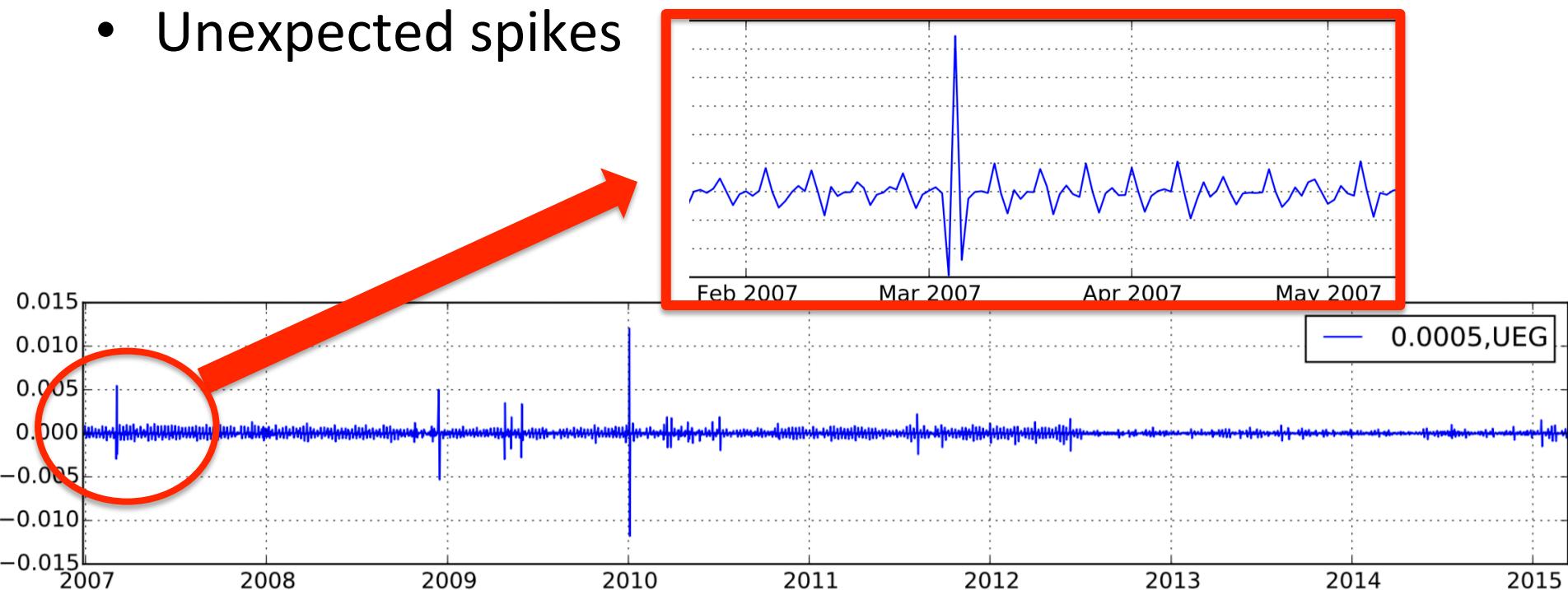
- notation: USD=U, EUR=E, GBP=G

$$UEG = R(\text{USD/EUR})_t * R(\text{EUR/GBP})_t - R(\text{USD/GBP})_t$$



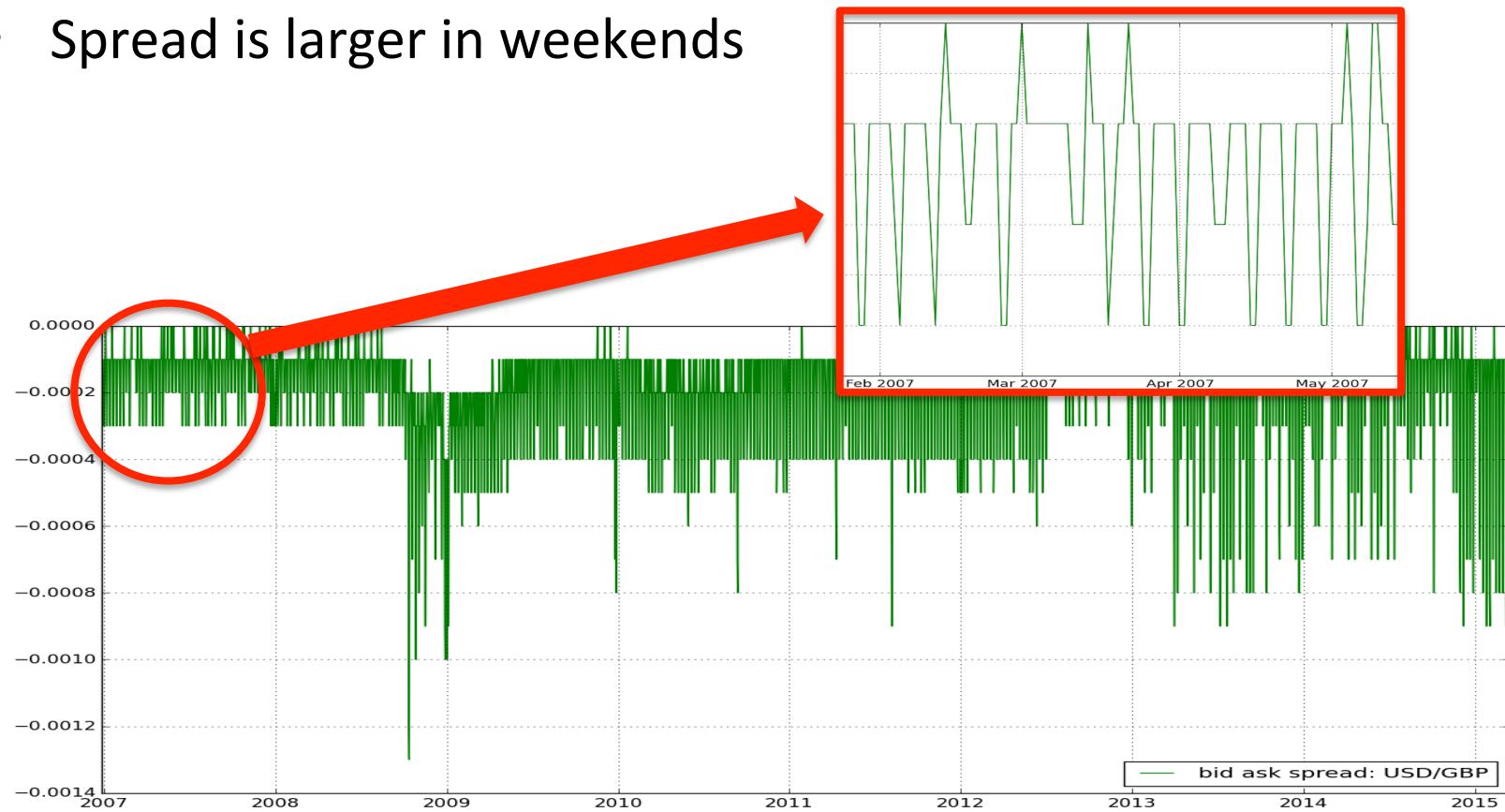
# Time series of (return) arbitrage

- Periodic feature (period = 7 days/1week)
- Mean of arbitrage  $\sim 10^{-8} \rightarrow 10^{-7} \sim 0$
- Unexpected spikes



# Time series of bid ask spread(BAS)

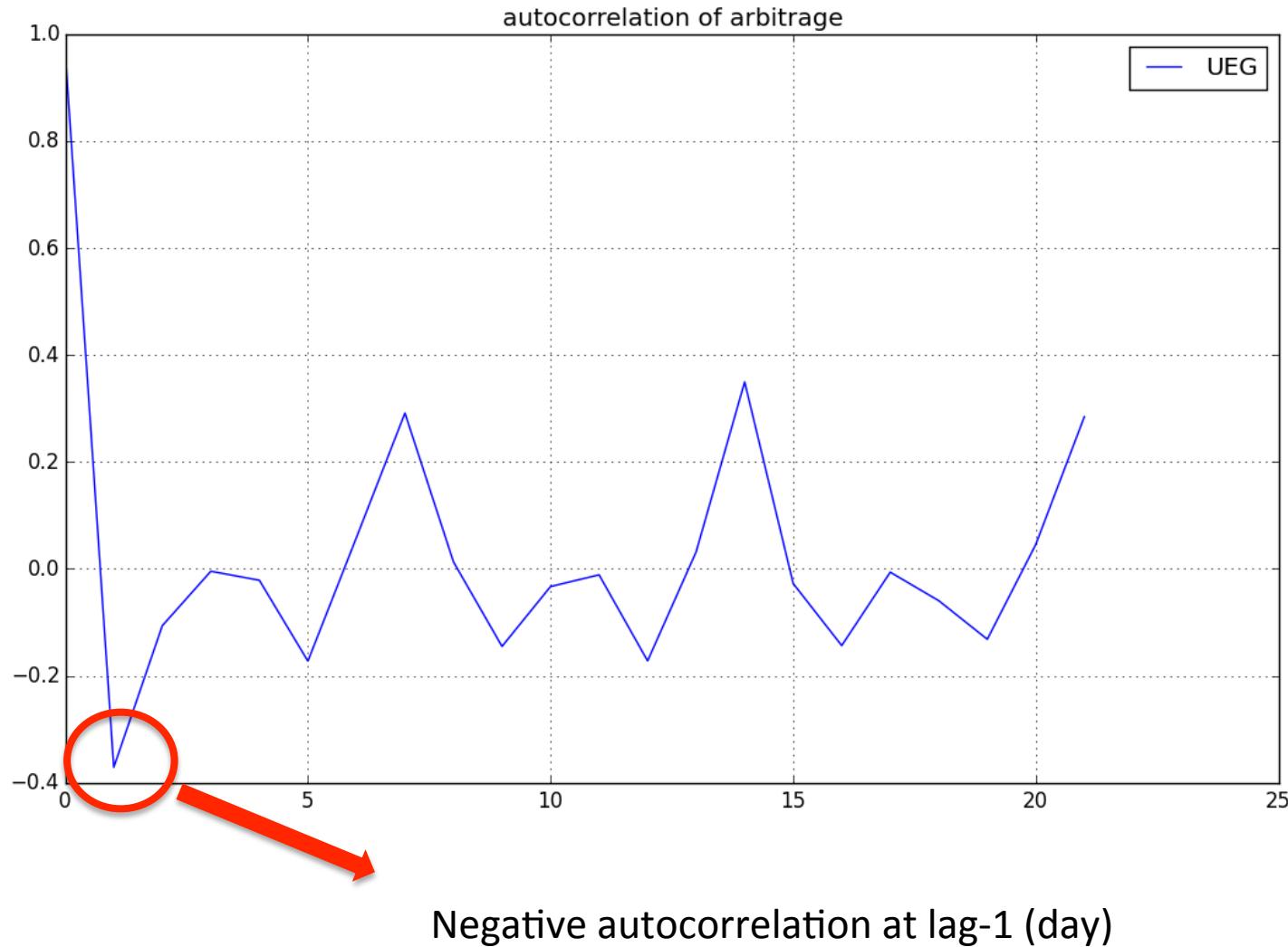
- Bid price – ask price  $\leq 0$  (always)
- Also exhibit period behavior (period = 7 days)
- Spread is larger in weekends



# Arbitrage and BAS

- Comparing the time series of BAS (of UE, EG, UG) and arbitrage of UEG
- Similar pattern: periodic, some spikes in the BAS time series coincide with those in the arbitrage time series

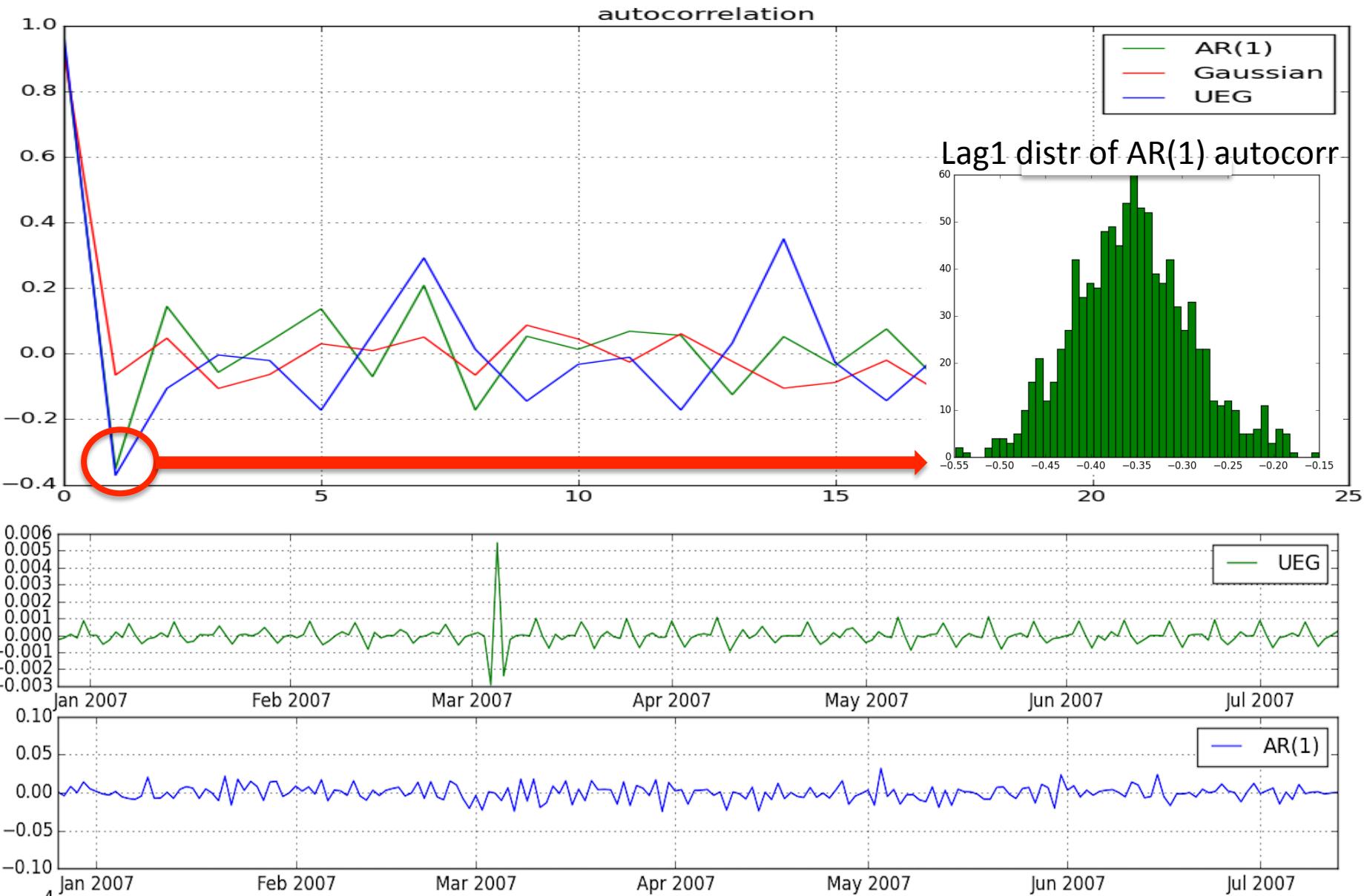
# Autocorrelation of arbitrage



# Autoregressive (AR) model

- Negative lag-1 autocorrelation of arbitrage:  
→ Arbitrage change is negatively related to today's arbitrage
- $R(t+1) - R(t) = -\alpha R(t) + \beta \varepsilon(t)$  ← noise term
- $R(t+1) = (1-\alpha)R(t) + \beta \varepsilon(t)$  ← AR(1)
- Can explain the dynamics of the arbitrage time series only in a short observation window (several days)

# AR(1) model

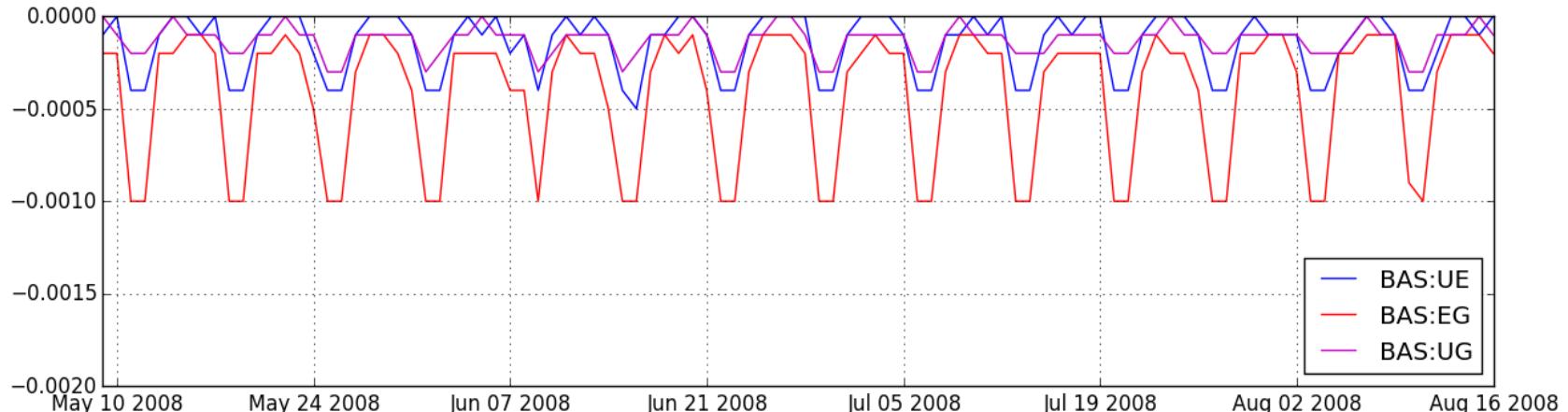
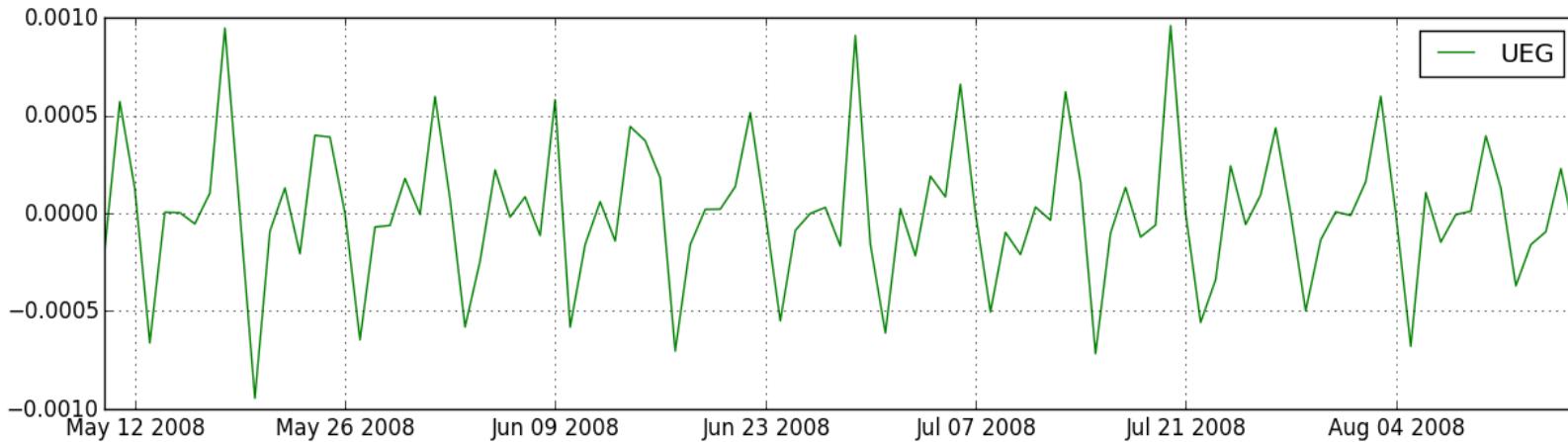


# AR(1) model

- Can only explain data up to lag 1
- Still cannot explain the periodic behavior of the arbitrage time series and the existence of sudden spikes
- Due to the similarities between the BAS time series and the arbitrage time series, we attempt to model these other features using the BAS time series

# BAS vs arbitrage

- Both are periodic with period of 1 week
- Both deviate from zero significantly around weekends



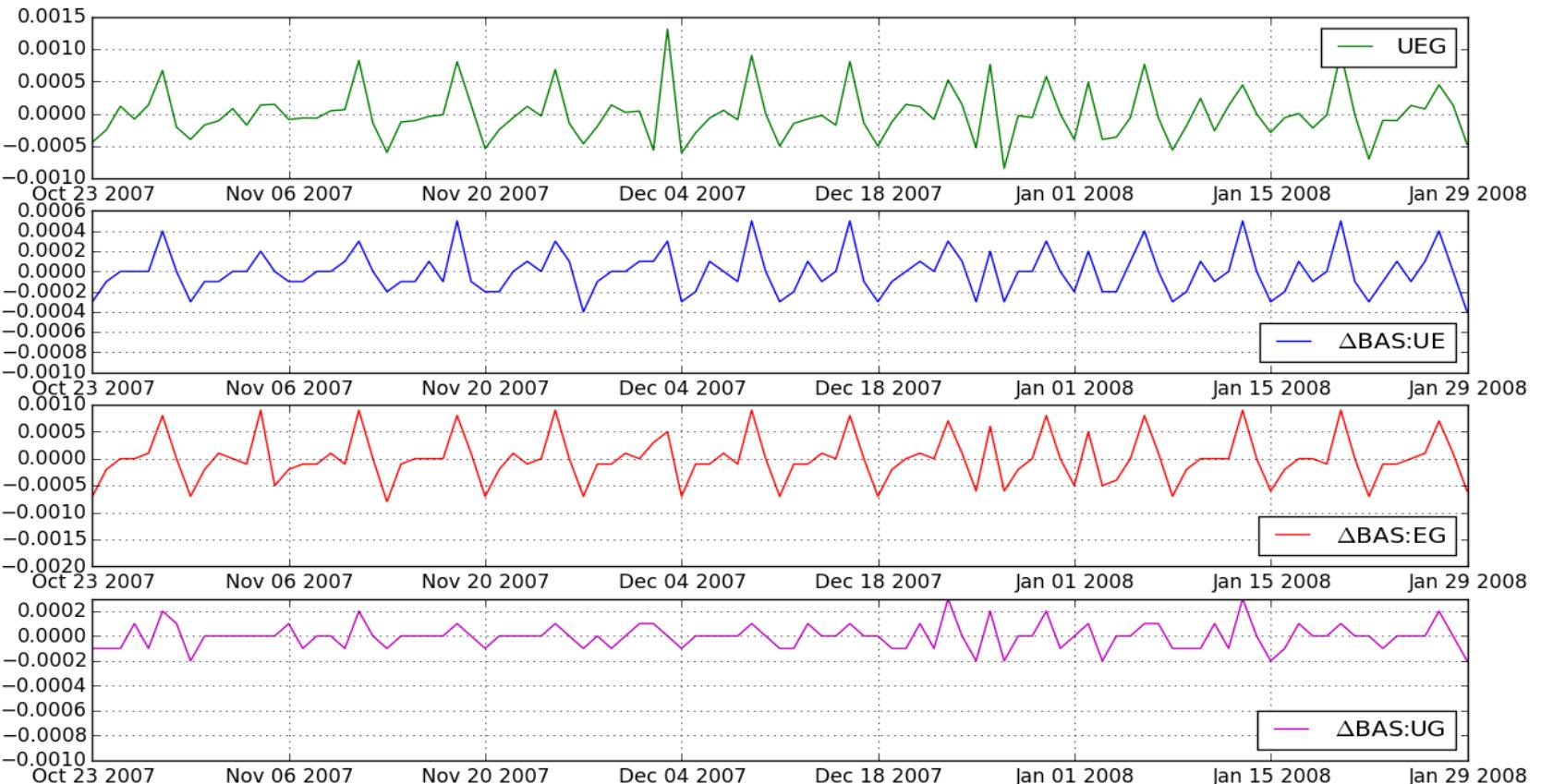
# BAS vs arbitrage

- some huge spikes ( $>0.005$ ) in the arbitrage coincide with those in BAS. The reverse are seen not to be necessarily true



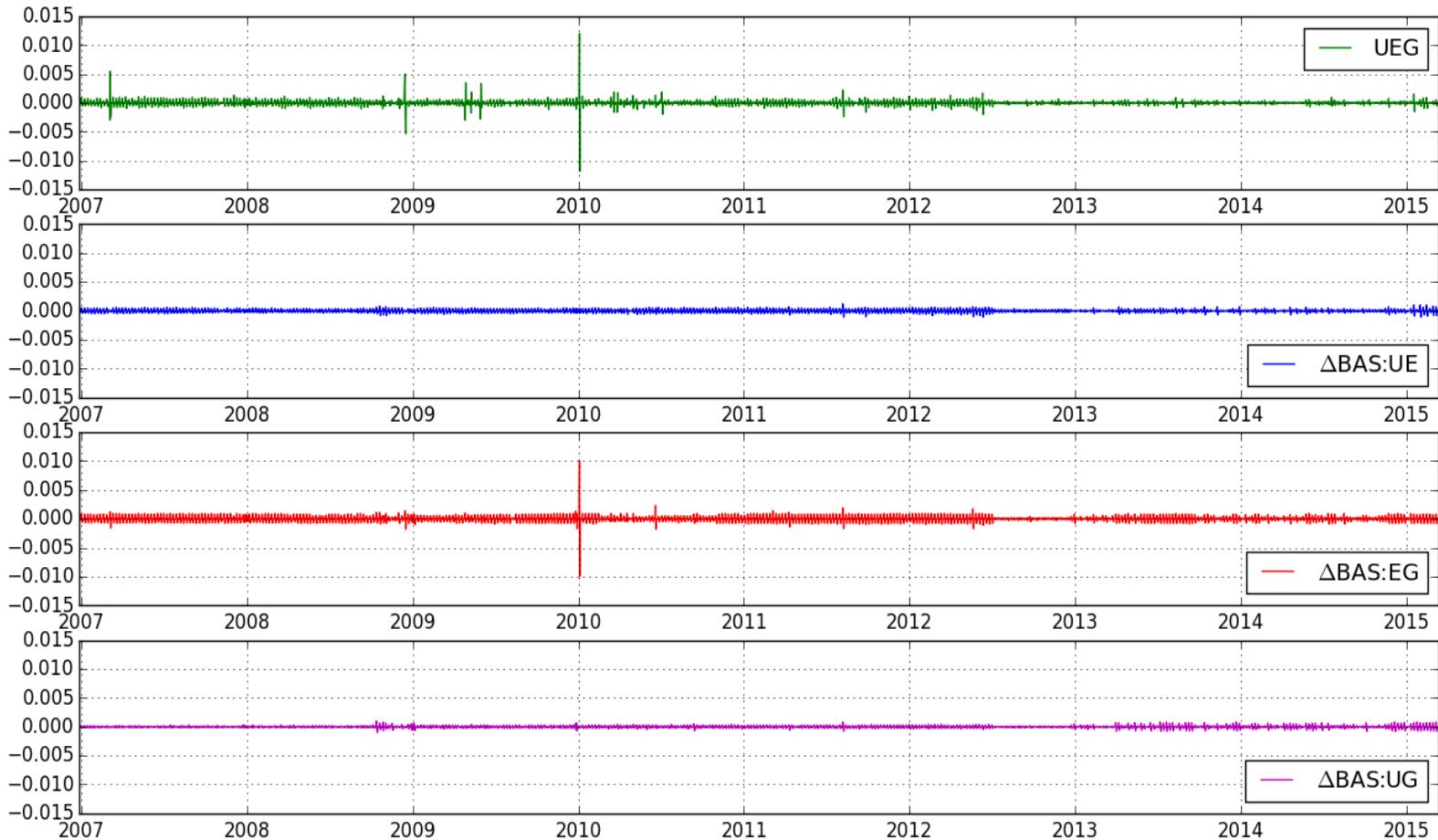
# ‘return’/change of BAS vs arbitrage(UEG)

- We now look at the change (return) of BAS
- Both has a periodic behavior
- Micro-profile (weekend oscillations) are also quite similar



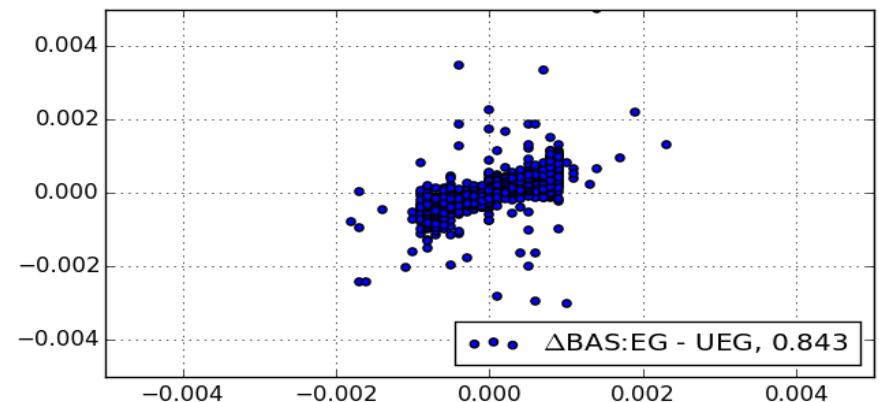
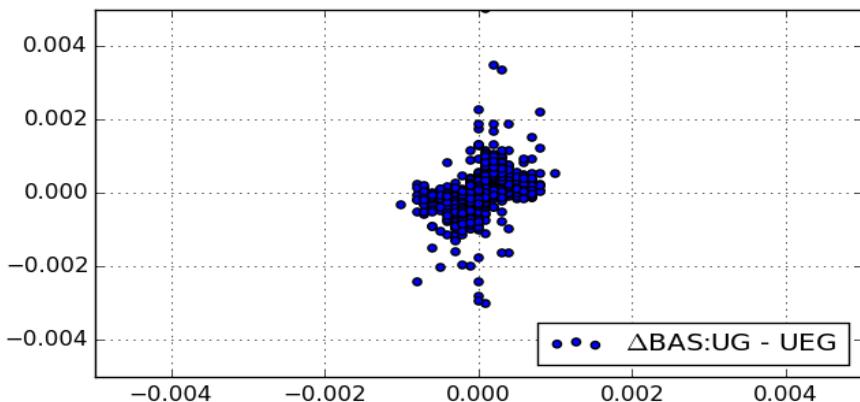
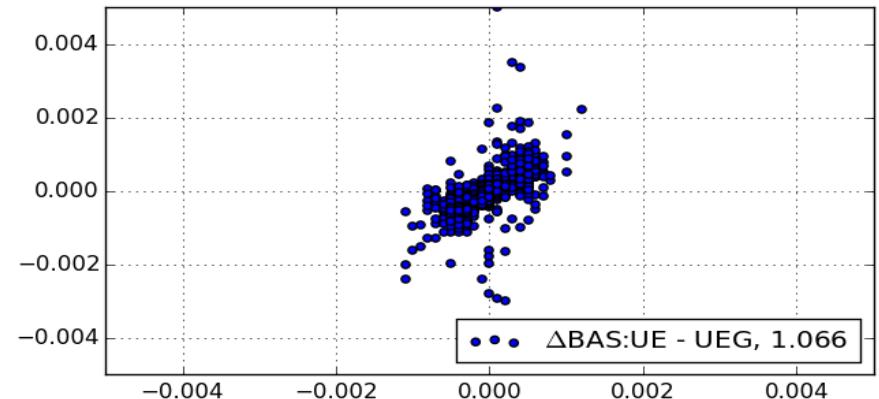
# ‘return’/change of BAS vs arbitrage(UEG)

- The macro-profile (spikes) are also similar, but magnitude does not have a right scale



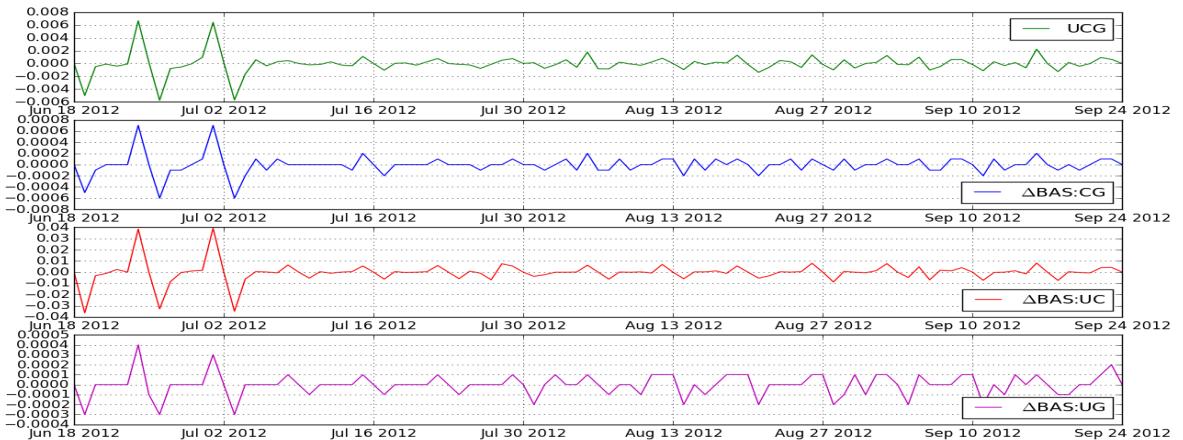
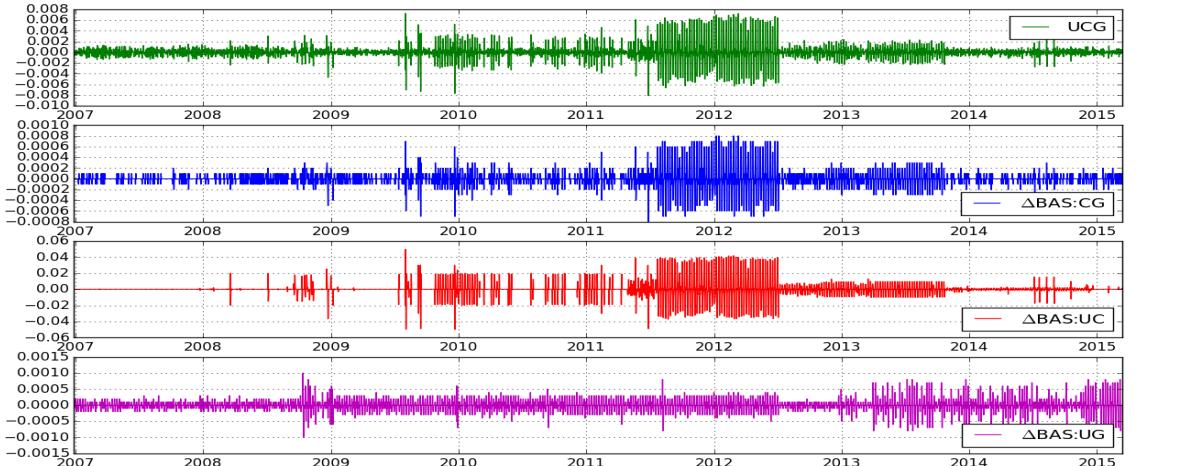
# Correlation of $\Delta$ BAS and arbitrage (UEG)

- Correlation are strong for UE and EG, not so for UG (2007-2015)



# $\Delta$ BAS vs arbitrage (UCG)

- $R(\text{USD/CNY}) * R(\text{CNY/GBP}) - R(\text{USD/GBP})$
- $\Delta\text{BAS(UC)}$
- $\Delta\text{BAS(CG)}$
- $\Delta\text{BAS(UG)}$



# Discussion

- Possible that both  $\Delta$ BAS and arbitrage are driven by the same underlying factor(s) (e.g. trading volume) which might affect both time series in similar fashion
- Underlying factors that affect the arbitrage might affect the BAS with a different magnitude
- The resolution of our data (daily average) covers up features which might otherwise be visible in high frequency data

# Conclusion

- Both arbitrage and BAS deviate from zero largely during weekends
- Macro-profile (huge spikes) are seen to be related in both arbitrage and BAS time series
- Micro-profile (weekly oscillation) are also seen to be related in the two time series
- Other factors are also needed to be consider to understand the arbitrage time series

# Reference

- Investopedia
- *Network communities and the Foreign exchange market*- Daniel Fenn, University of Oxford