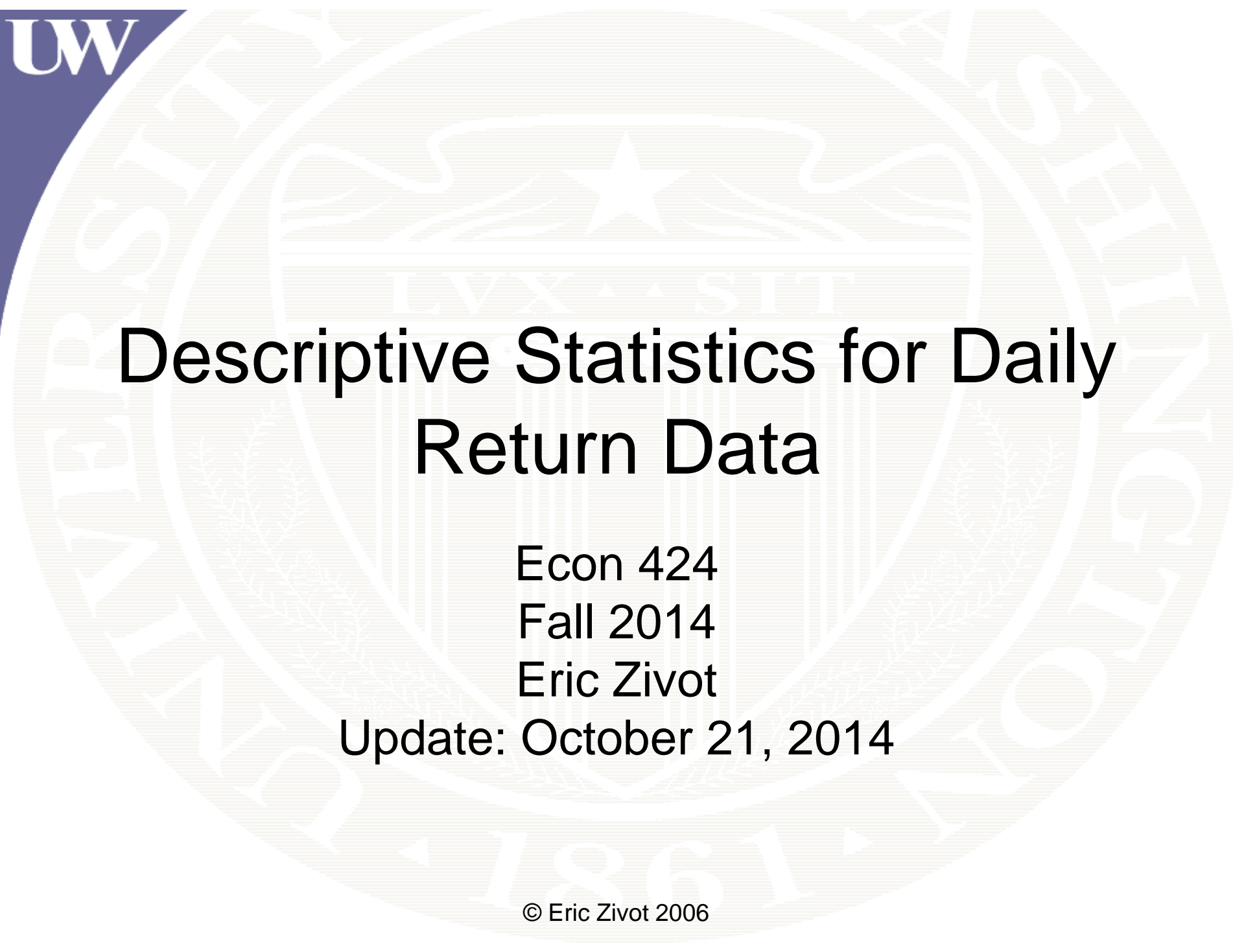


The logo consists of the letters 'UW' in a white, serif font, set against a dark blue, triangular background that points towards the top-left corner of the slide.A large, faint, circular seal of the University of Wisconsin is centered in the background. The seal features a five-pointed star at the top, a banner with the Latin motto 'LVX SIT' below it, and the year '1861' at the bottom. The outer ring of the seal contains the text 'UNIVERSITY OF WISCONSIN' and '1861'.

Descriptive Statistics for Daily Return Data

Econ 424

Fall 2014

Eric Zivot

Update: October 21, 2014

Daily Prices on Microsoft and the S&P 500 Index: January 1998 – May 2012, $n = 3,627$

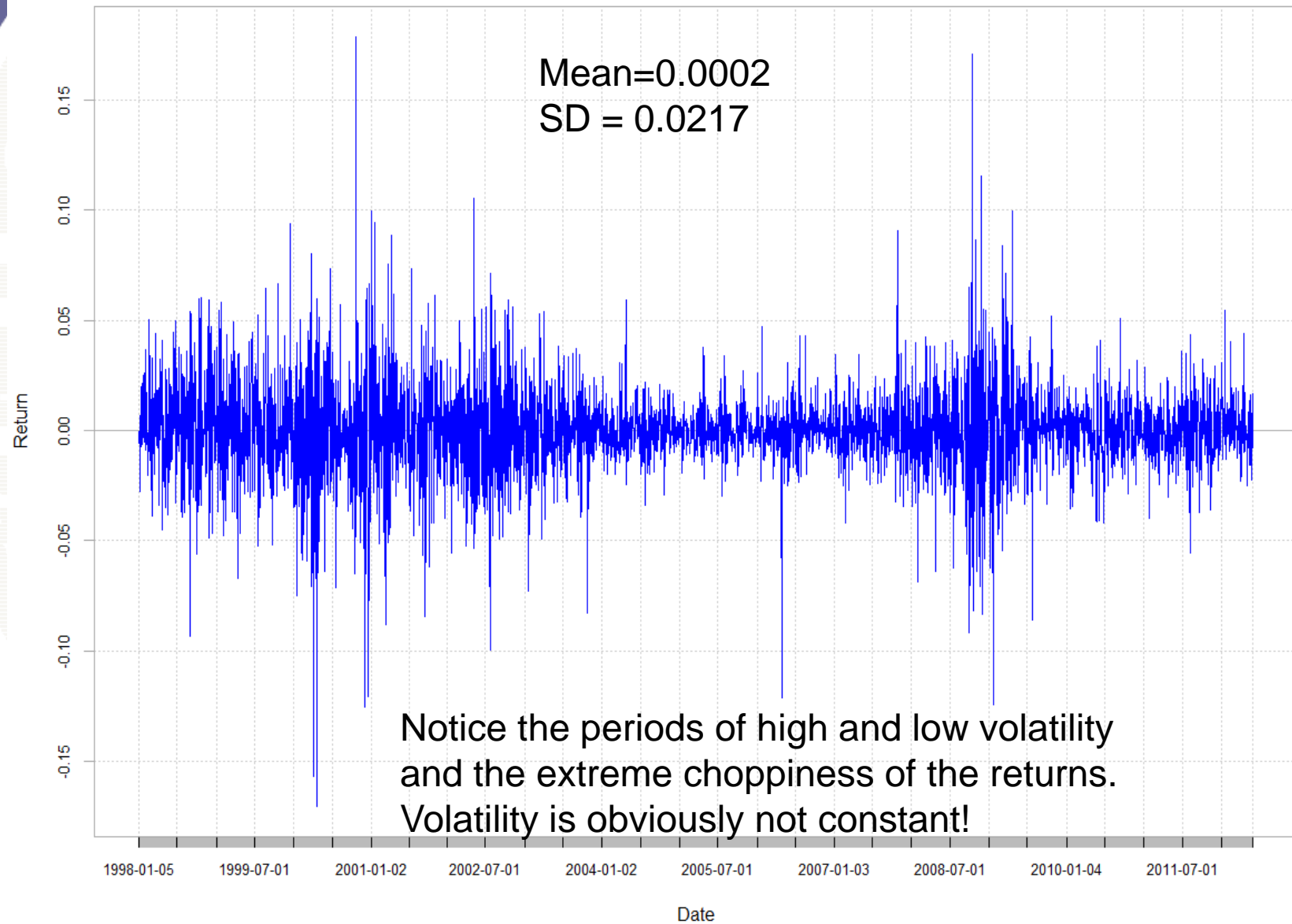
MSFT daily closing price



SP500 daily closing price

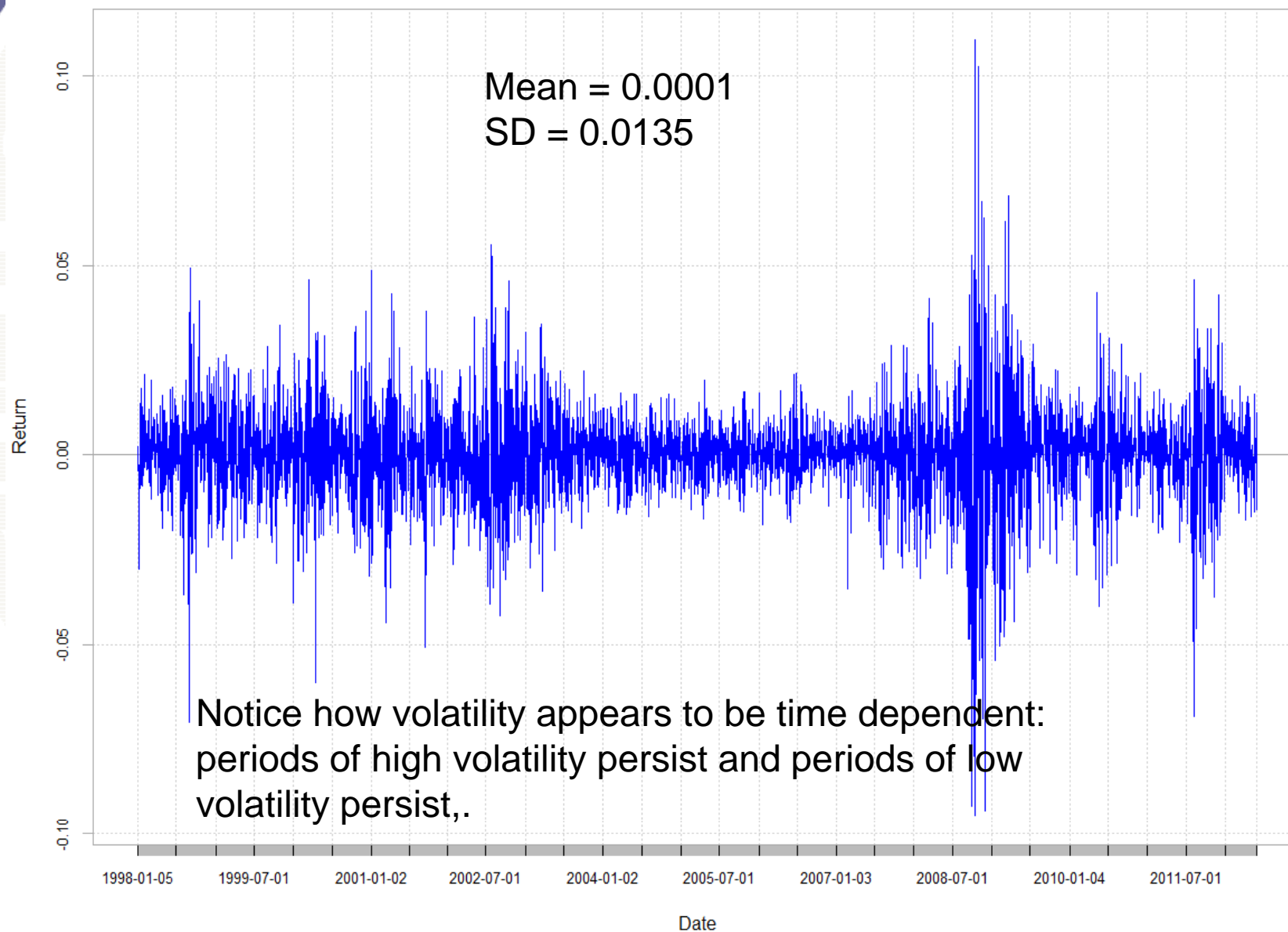


Daily cc returns on MSFT

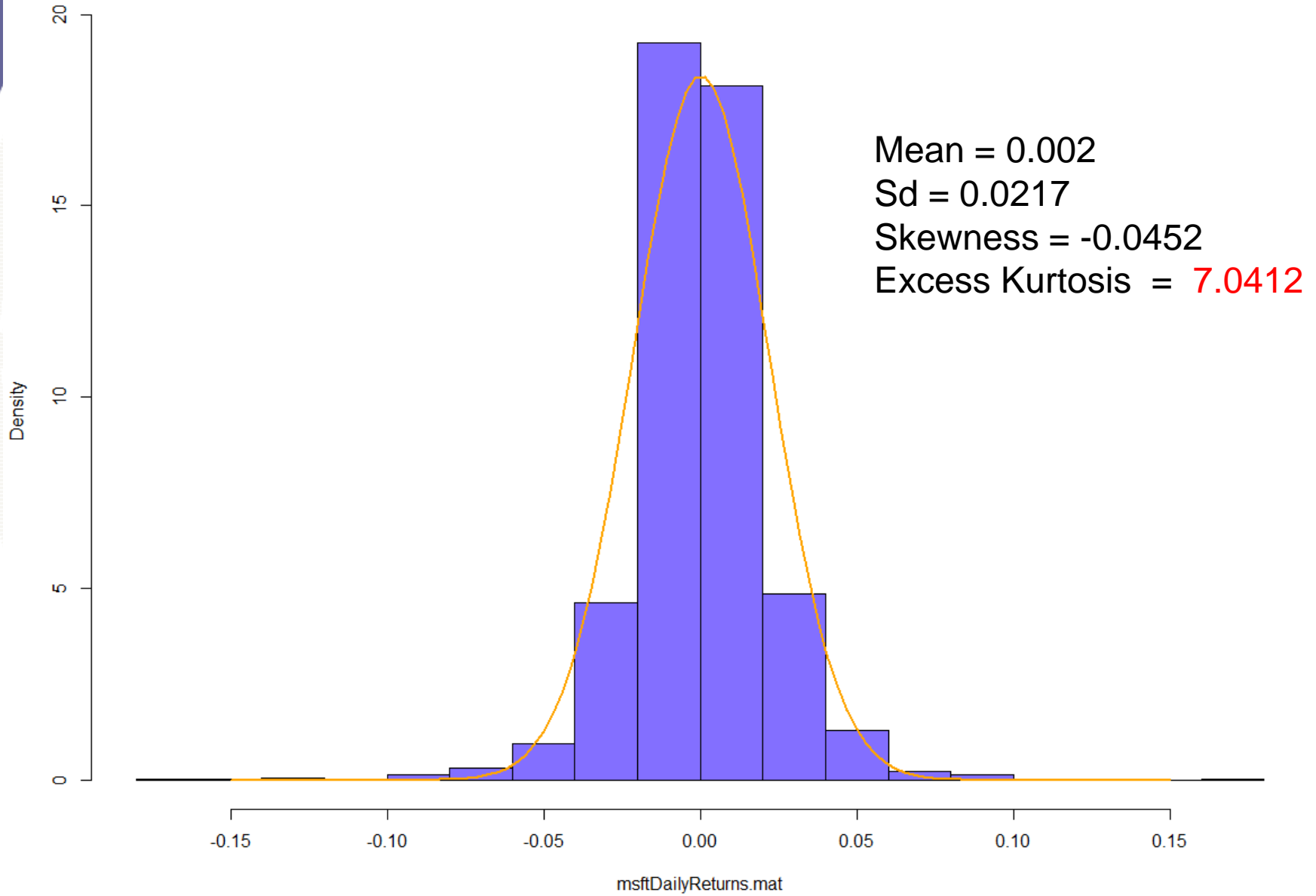


Notice the periods of high and low volatility and the extreme choppiness of the returns. Volatility is obviously not constant!

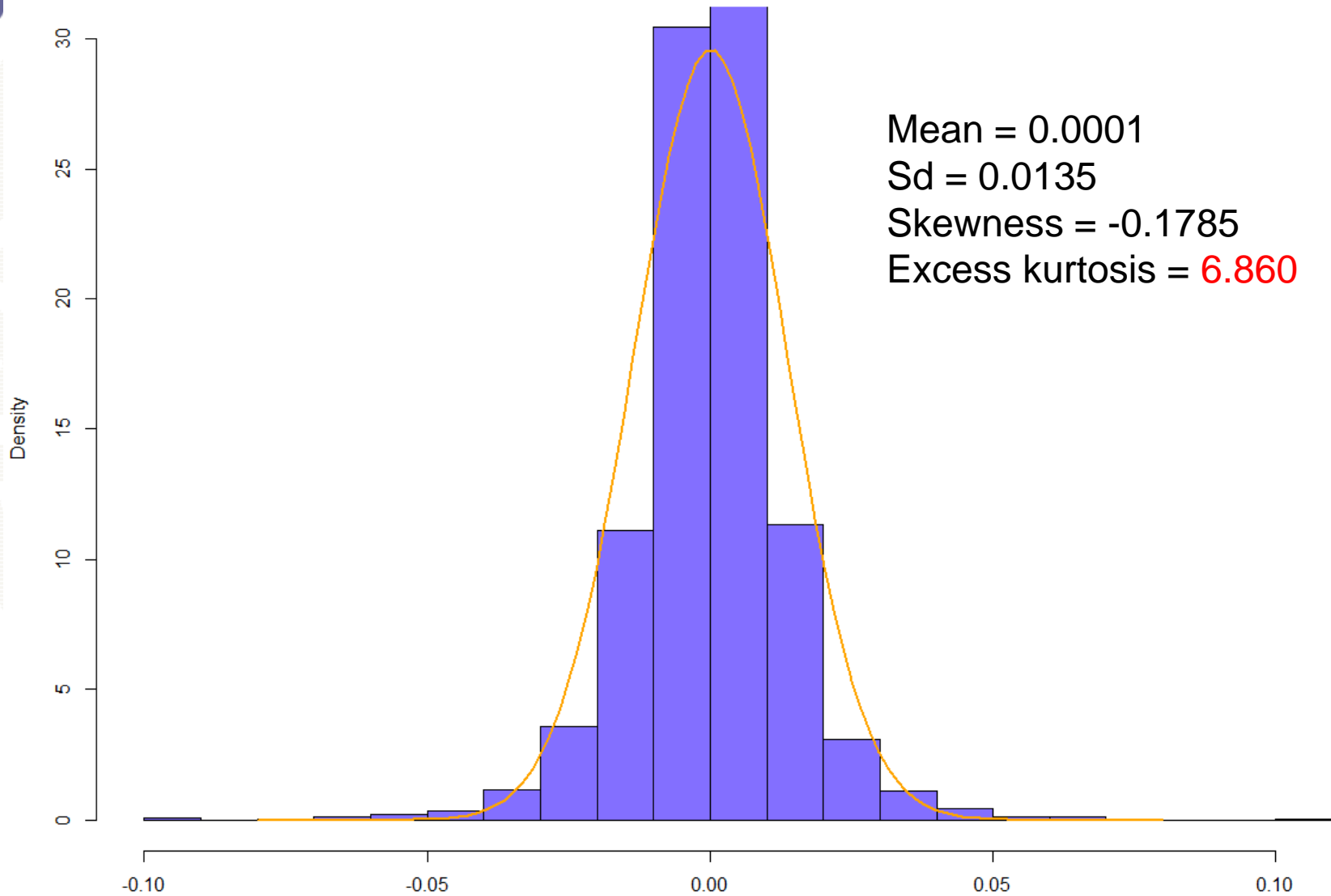
Daily cc returns on SP500



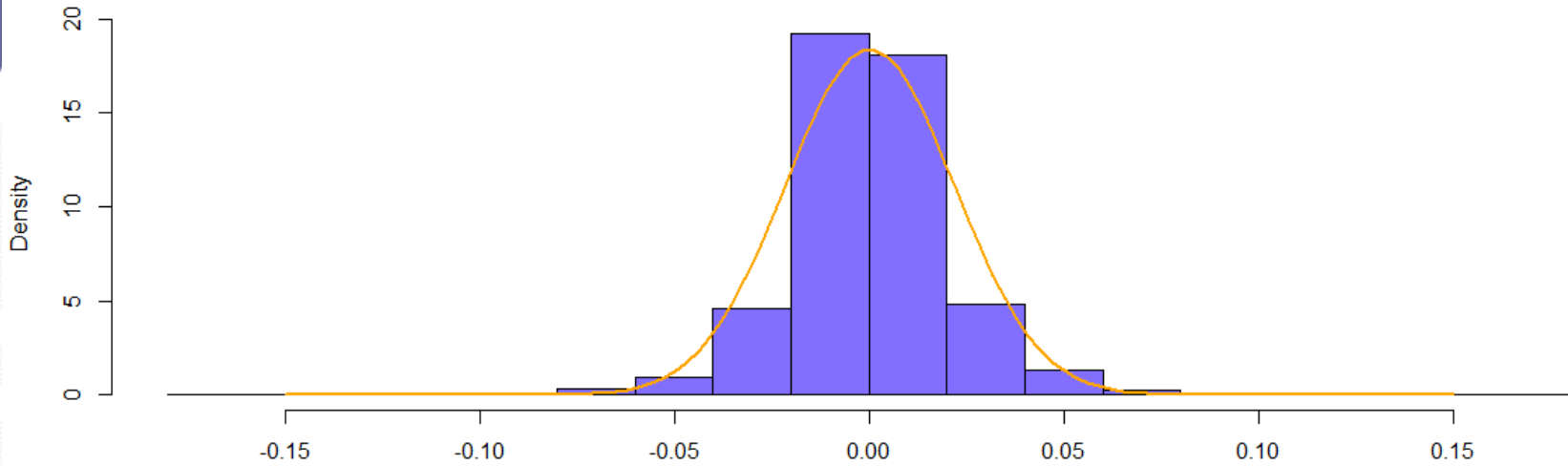
MSFT Daily Returns with Calibrated Normal curve



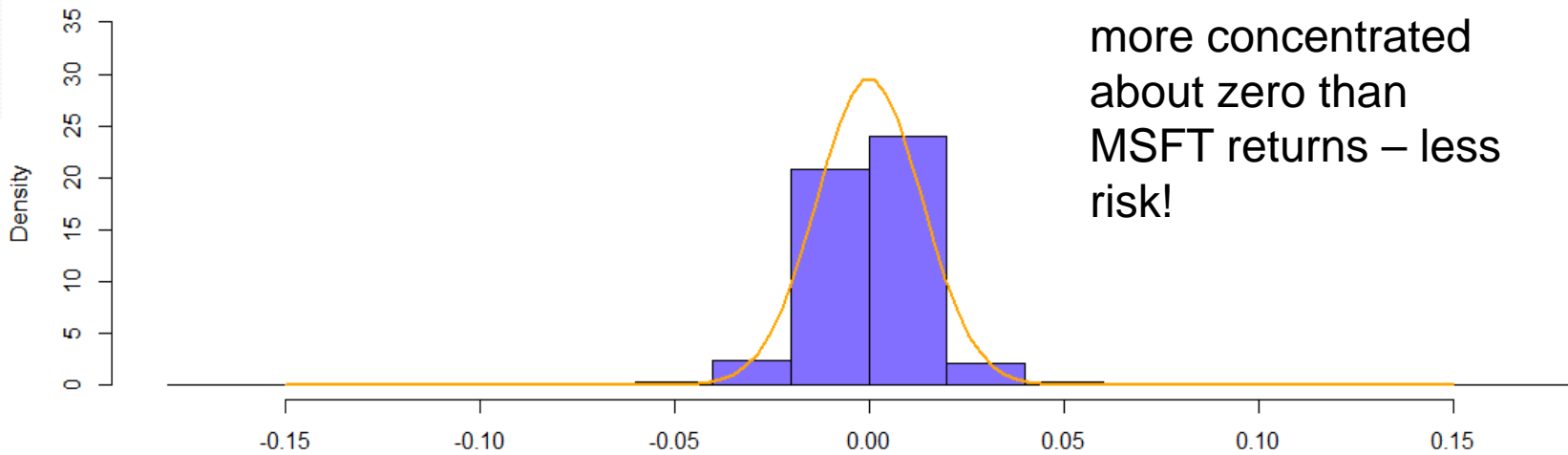
SP500 Daily Returns with Calibrated Normal curve



MSFT daily returns

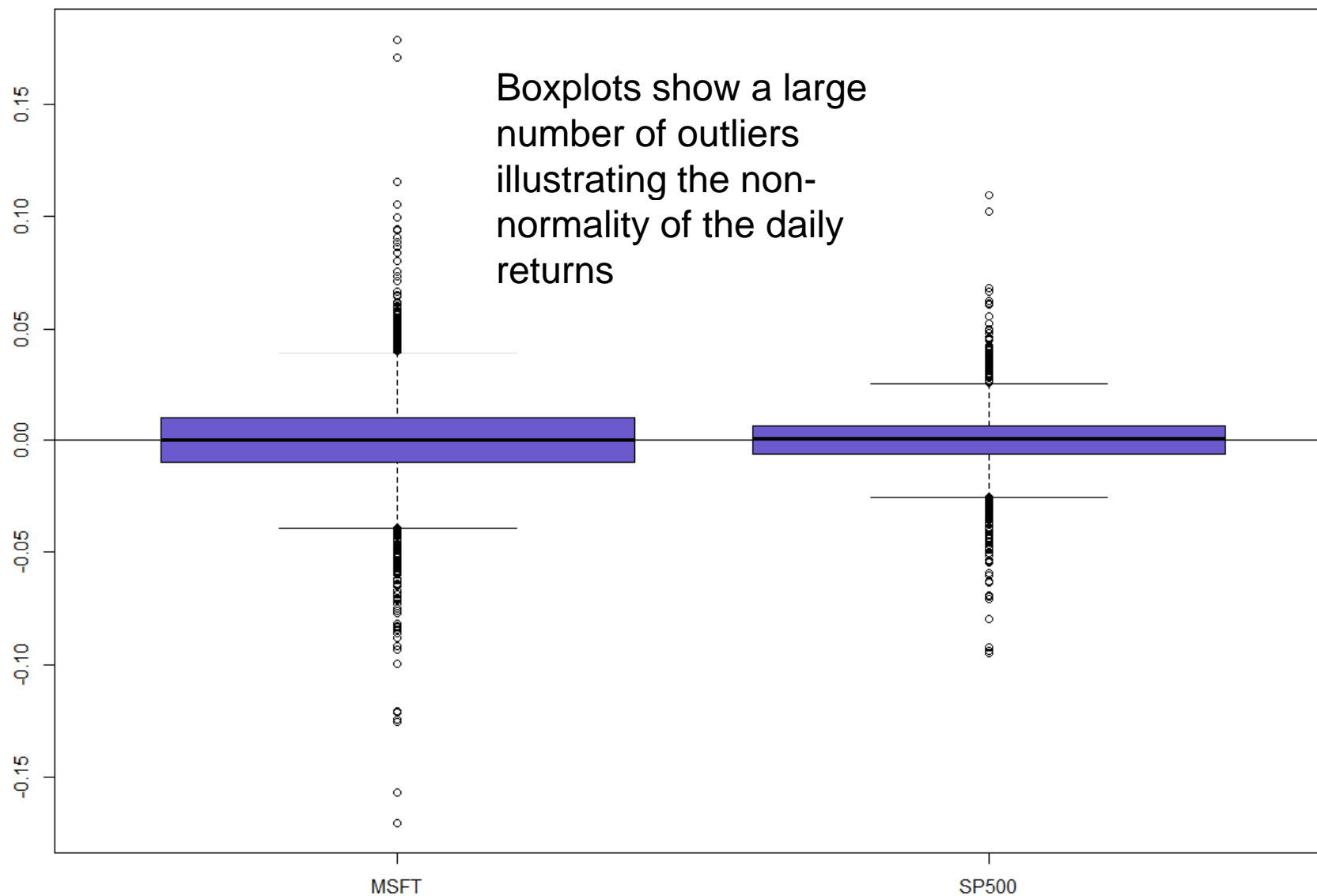


SP500 daily returns



SP500 returns are more concentrated about zero than MSFT returns – less risk!

Daily Returns



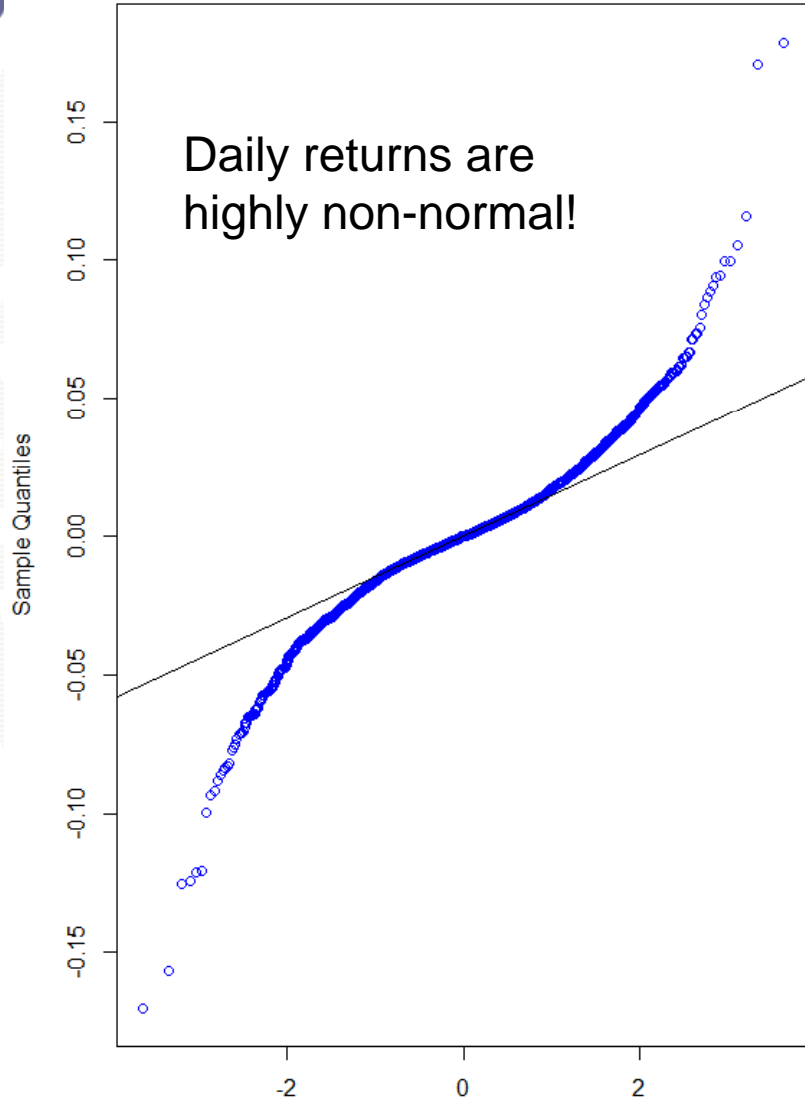
Daily Historical VaR on \$100K invested in MSFT

```
# Compute daily VaR using empirical quantiles
> q.01 = quantile(msftDailyReturns.mat, probs=0.01)
> q.05 = quantile(msftDailyReturns.mat, probs=0.05)
> q.01
      1%
-0.05854
> q.05
      5%
-0.03243
> VaR.01 = 100000*(exp(q.01) - 1)
> VaR.05 = 100000*(exp(q.05) - 1)
> VaR.01
      1%
-5686
> VaR.05
      5%
-3191
```

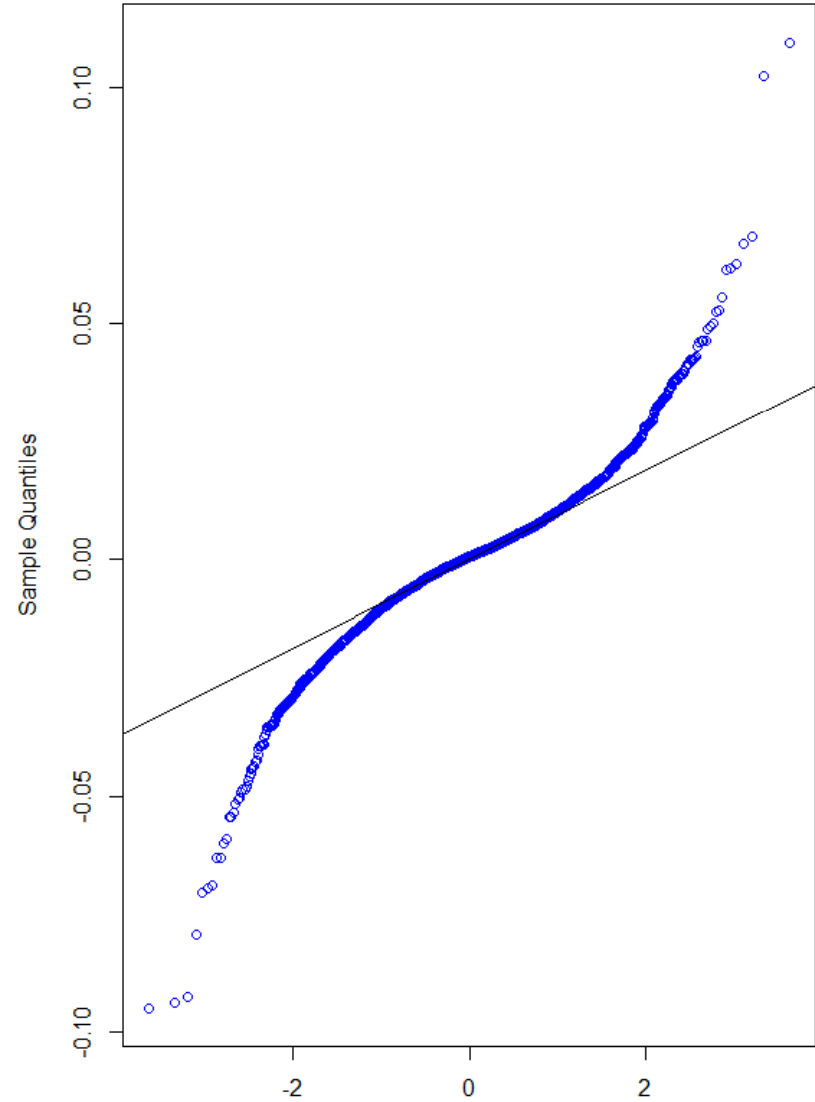
Daily Historical VaR on \$100K invested in SP500

```
# Compute daily VaR using empirical quantiles
> q.01 = quantile(sp500DailyReturns.mat, probs=0.01)
> q.05 = quantile(sp500DailyReturns.mat, probs=0.05)
> q.01
      1%
-0.03727
> q.05
      5%
-0.02114
> VaR.01 = 100000*(exp(q.01) - 1)
> VaR.05 = 100000*(exp(q.05) - 1)
> VaR.01
      1%
-3658
> VaR.05
      5%
-2092
```

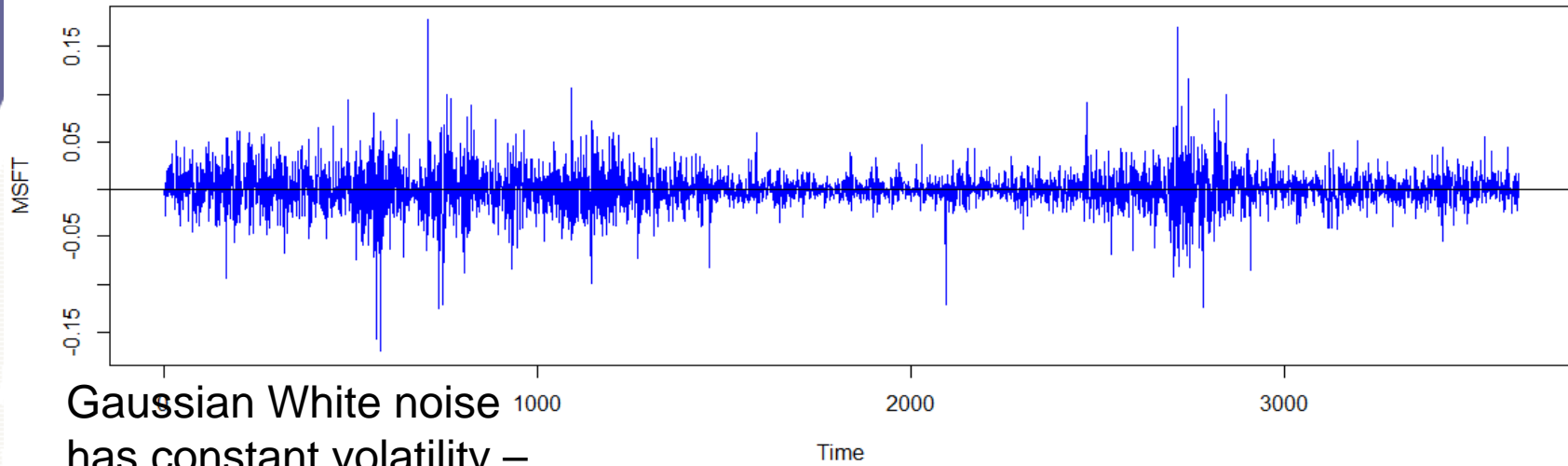
Normal Q-Q Plot



Normal Q-Q Plot

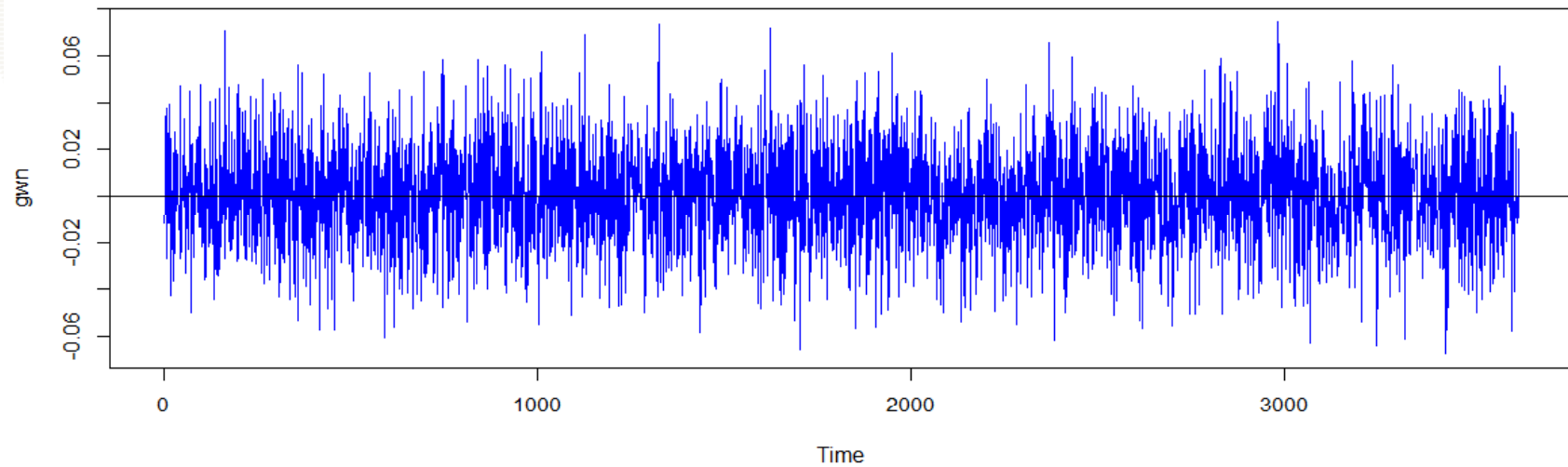


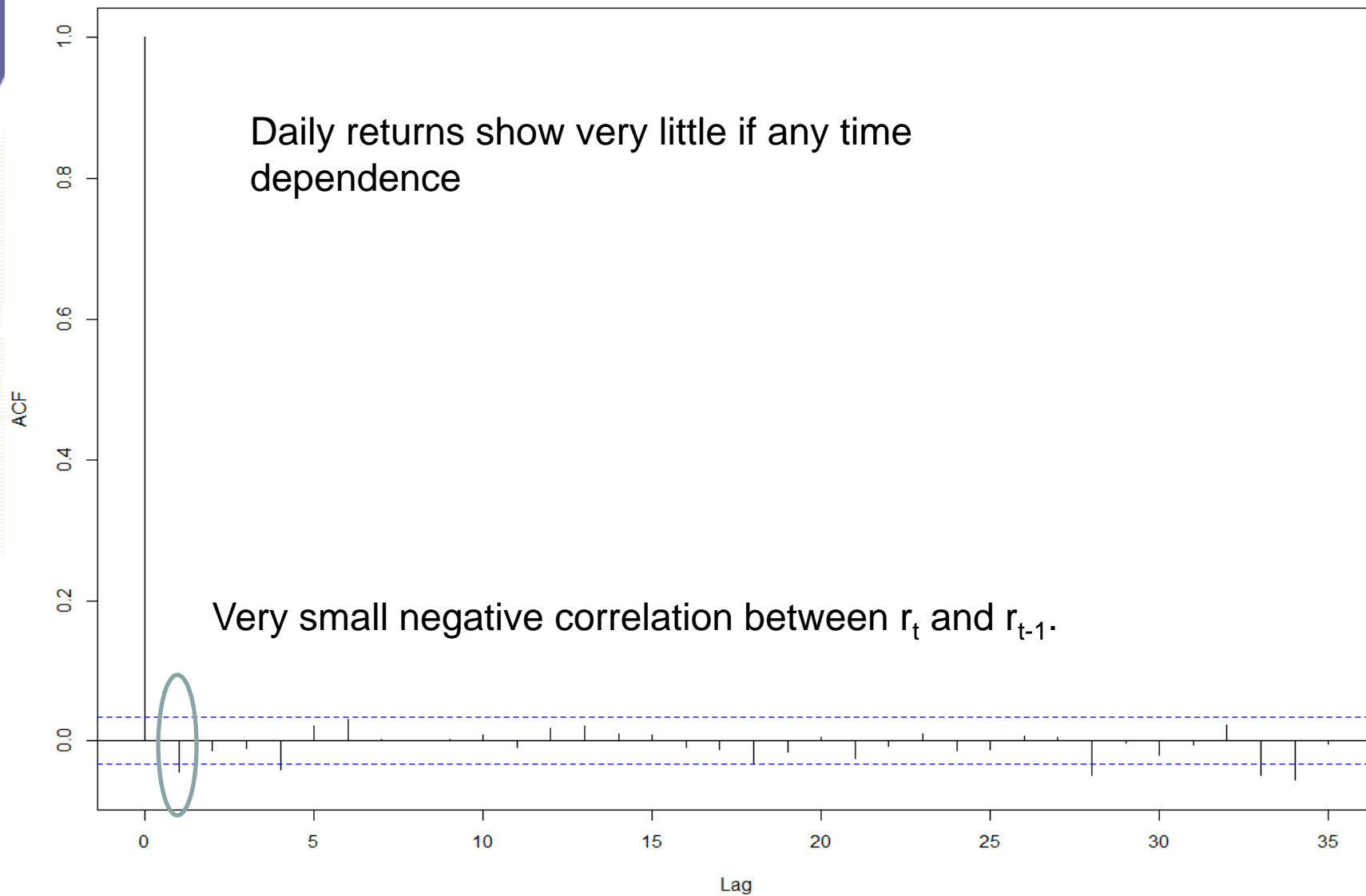
MSFT daily returns

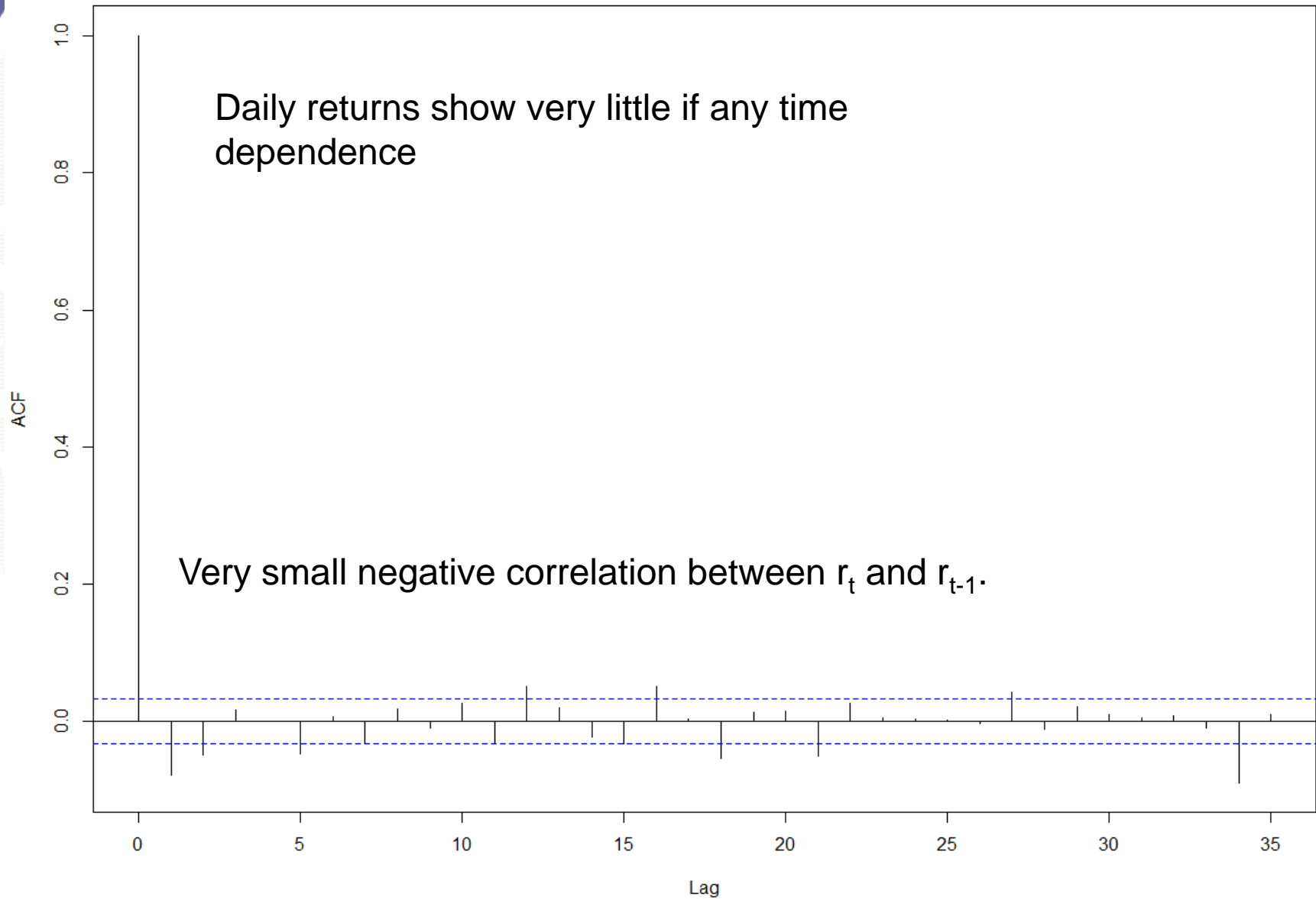


Gaussian White noise has constant volatility – something that MSFT does not have!

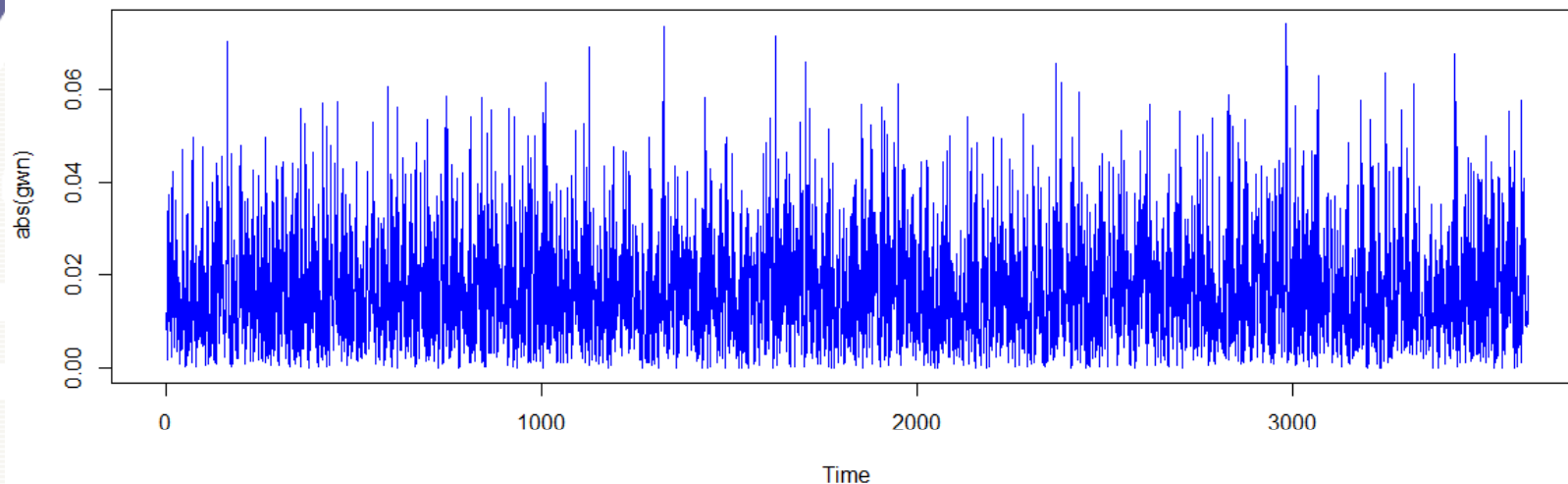
Gaussian data calibrated to MSFT





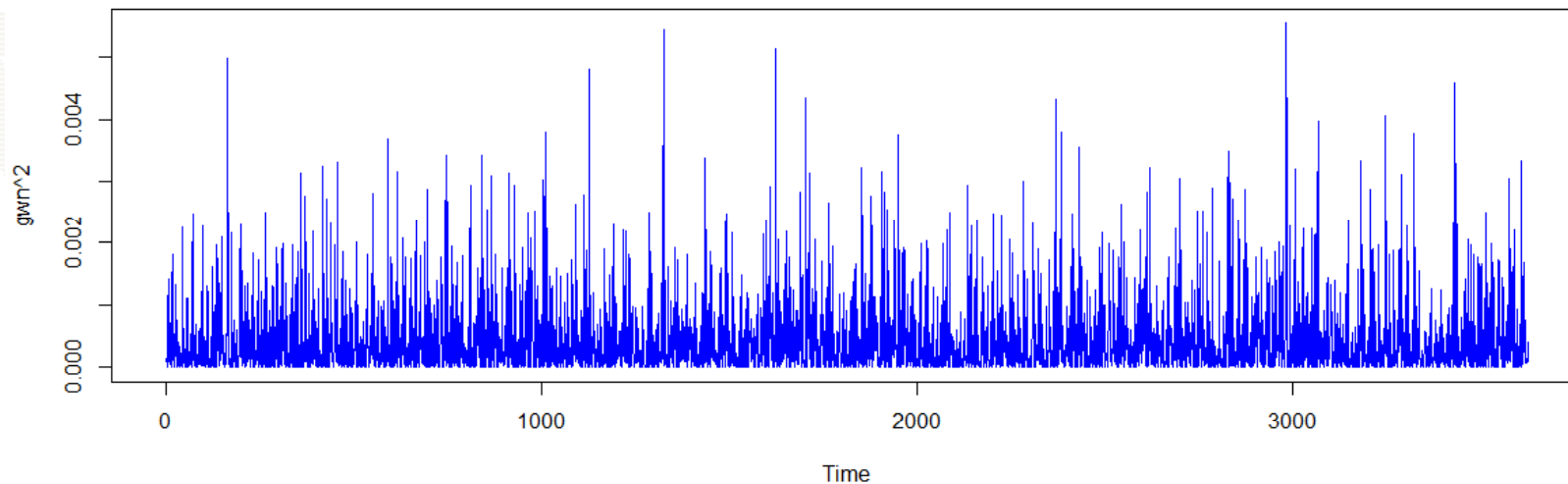


Absolute values of GWN

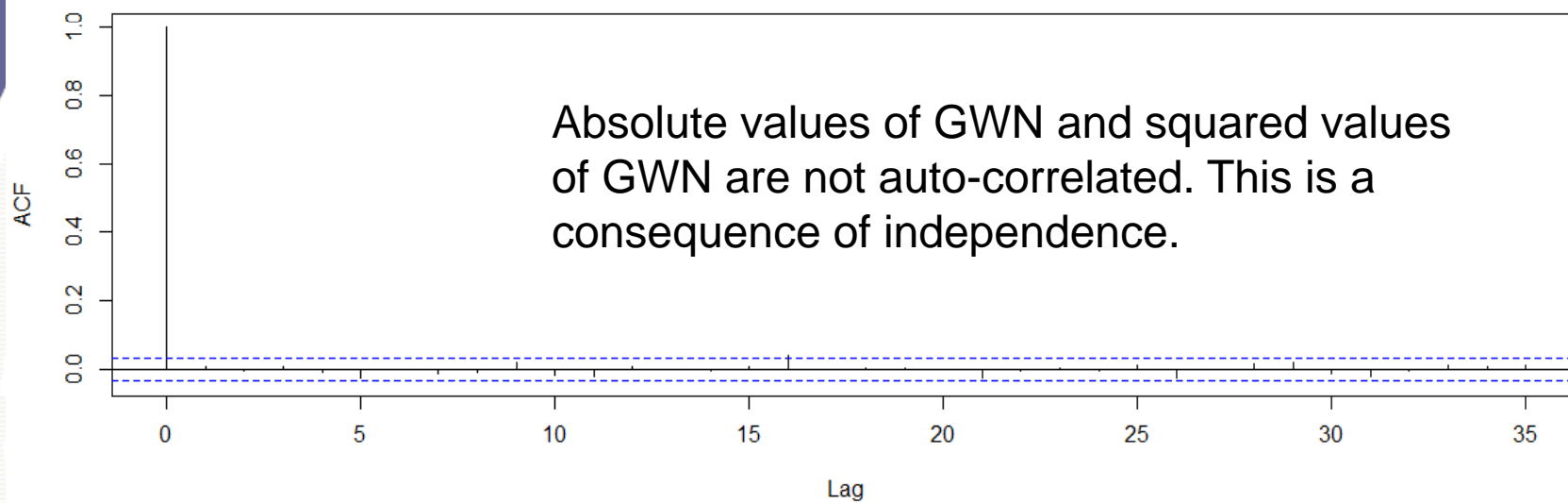


Absolute values proxy volatility; squares proxy variance

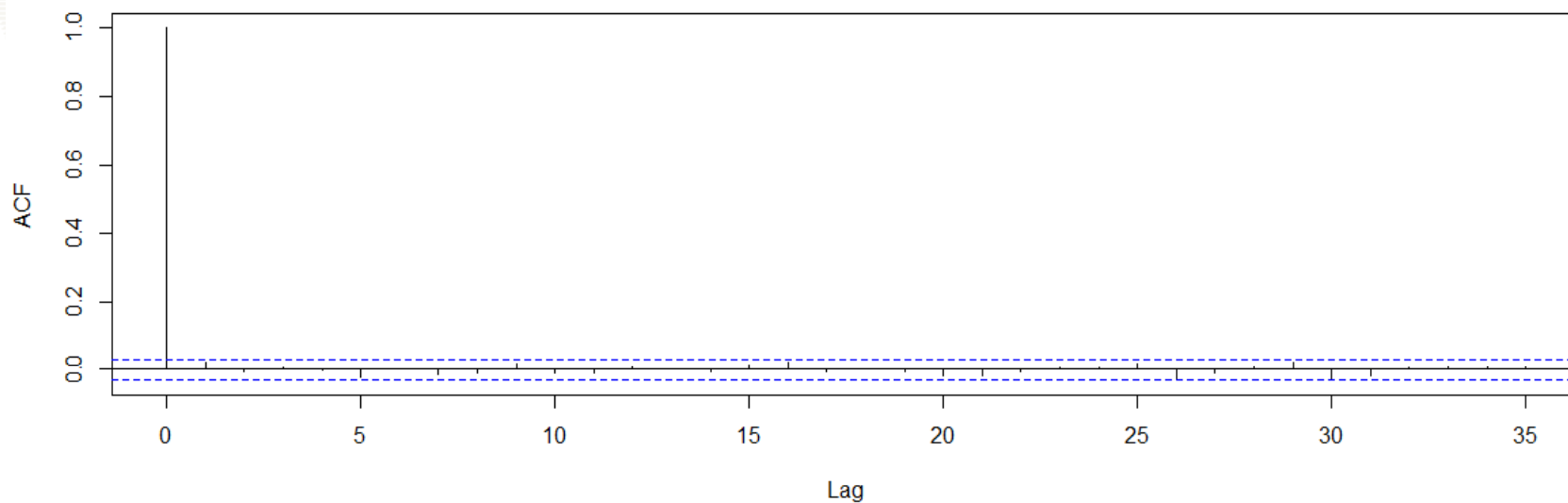
Squared values of GWN



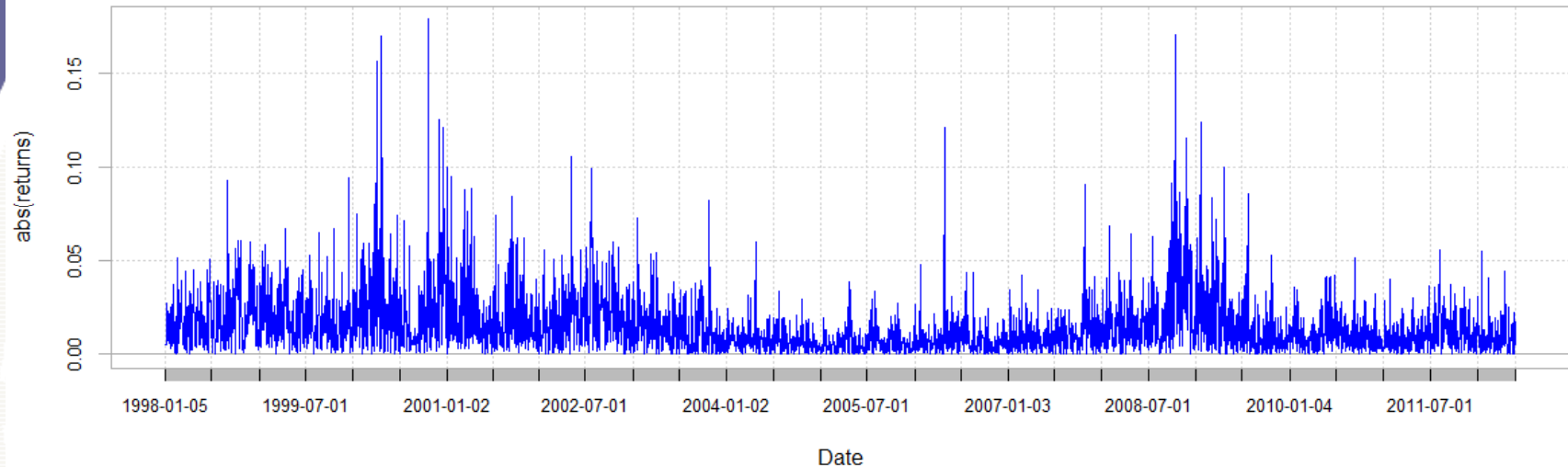
Series abs(gwn)



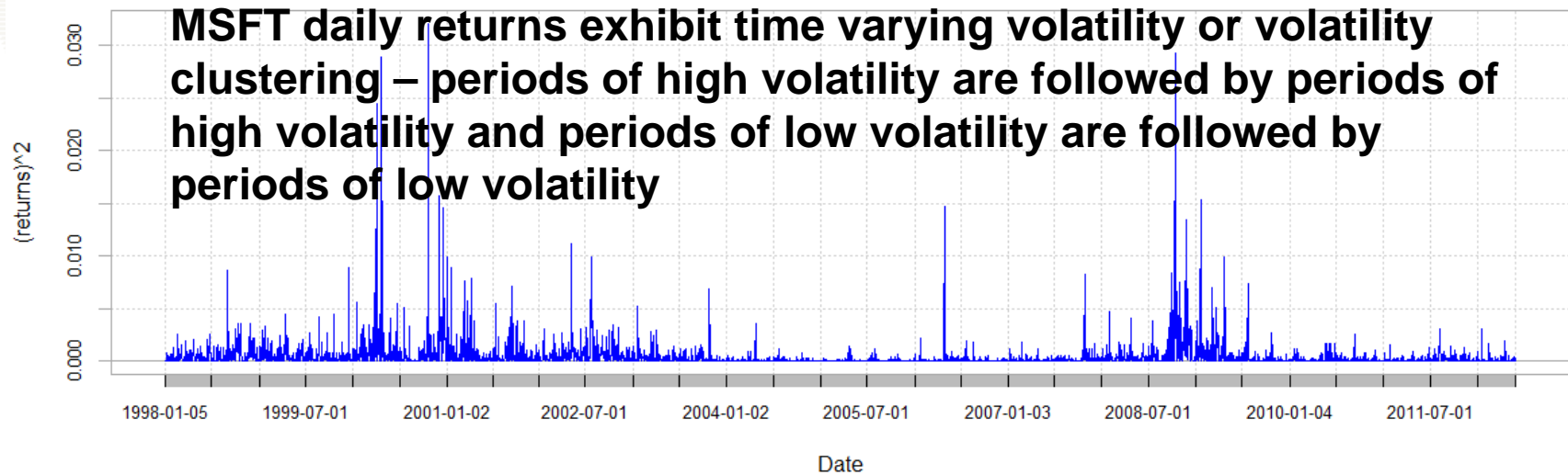
Series gwn^2



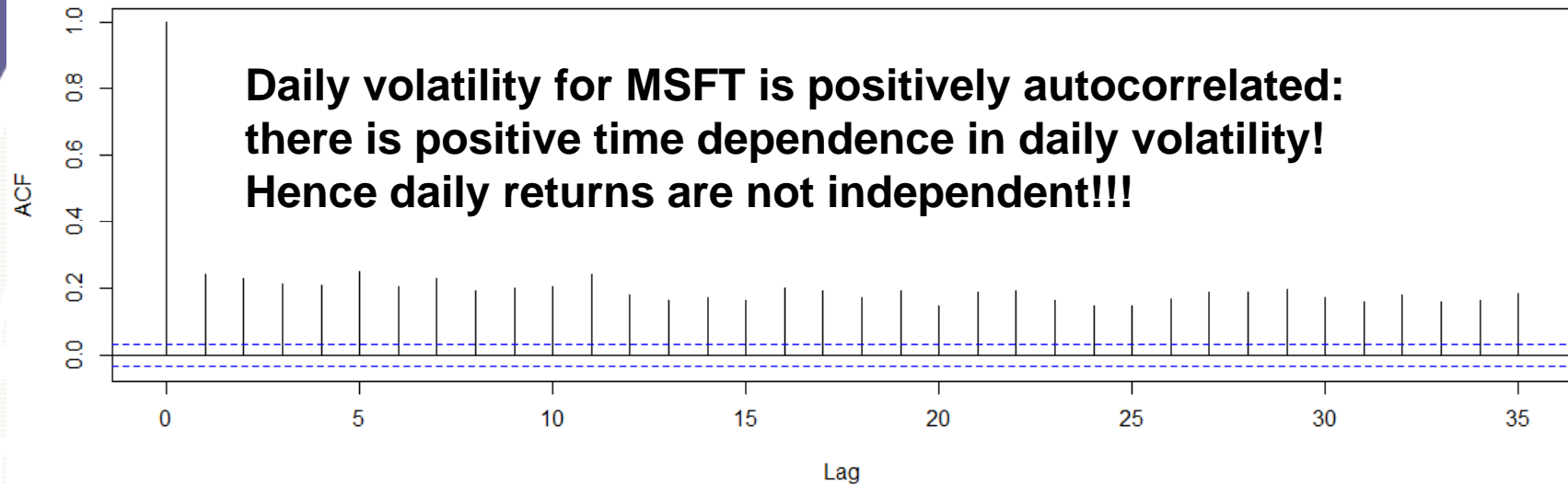
Daily absolute returns on Microsoft



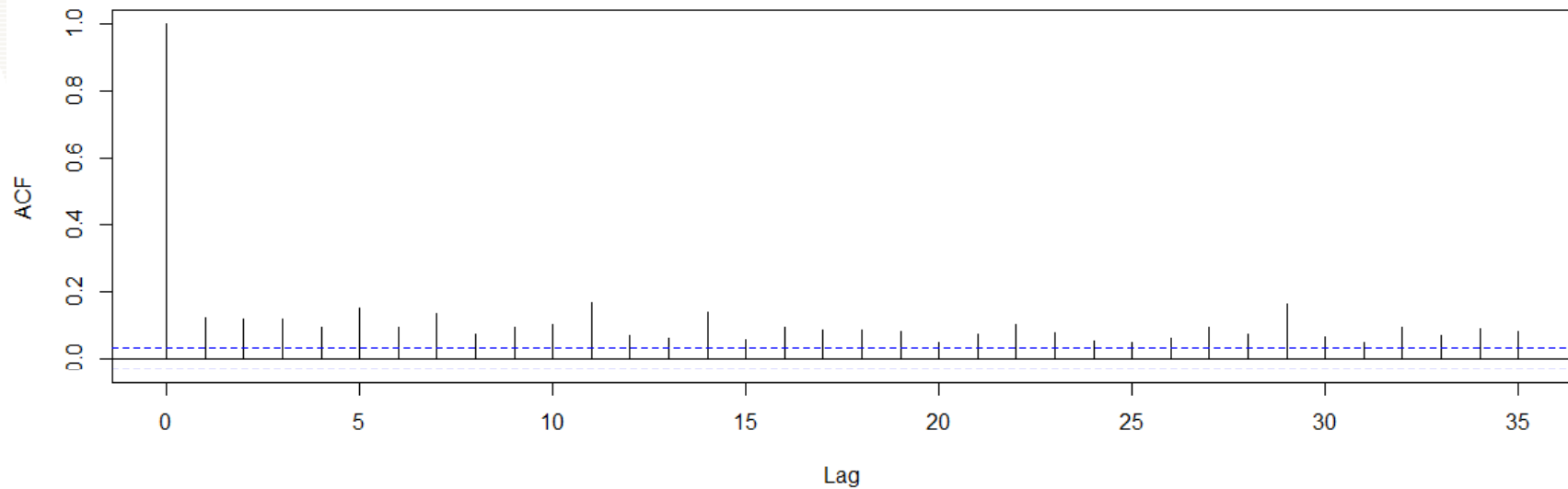
Daily squared returns on Microsoft



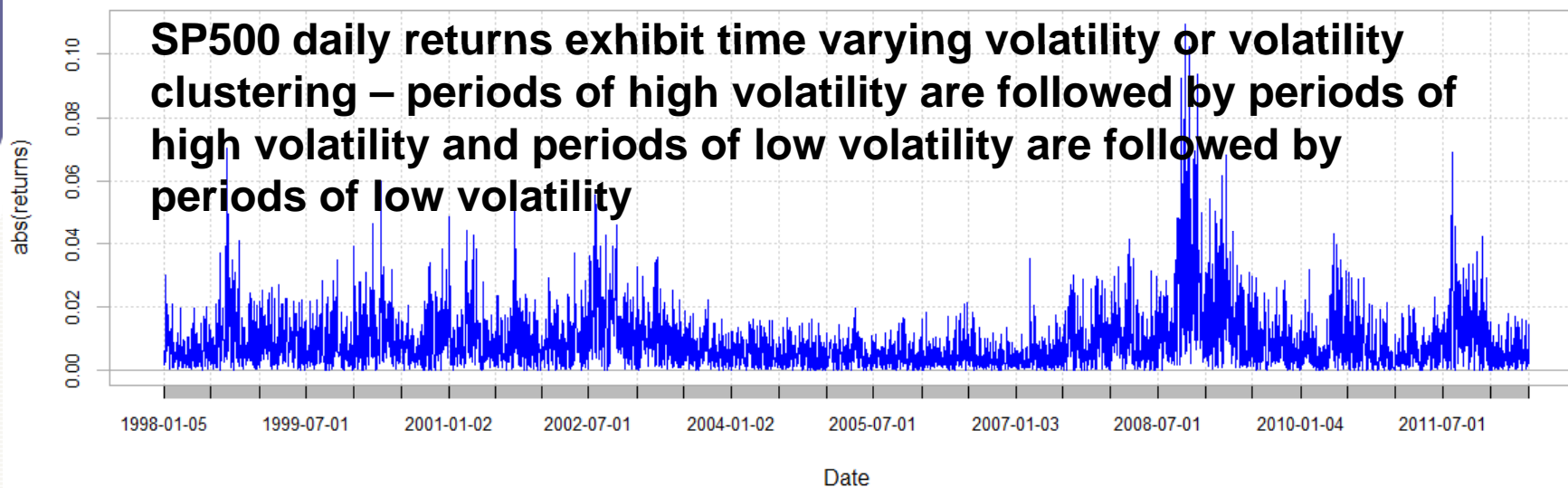
MSFT absolute returns



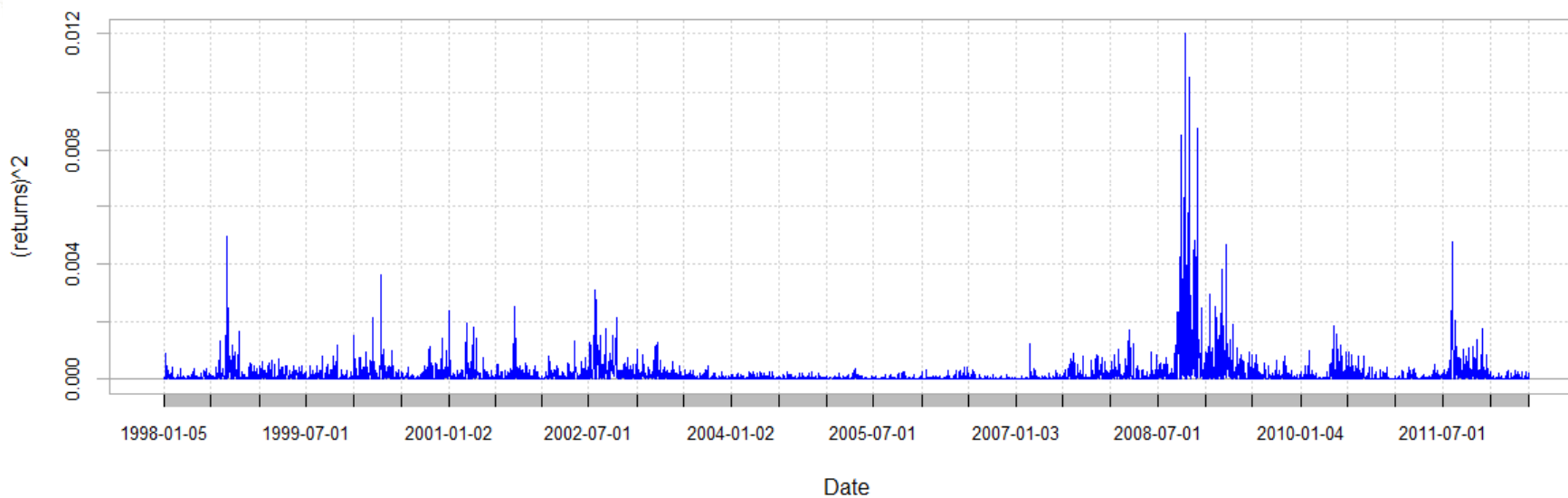
MSFT squared returns



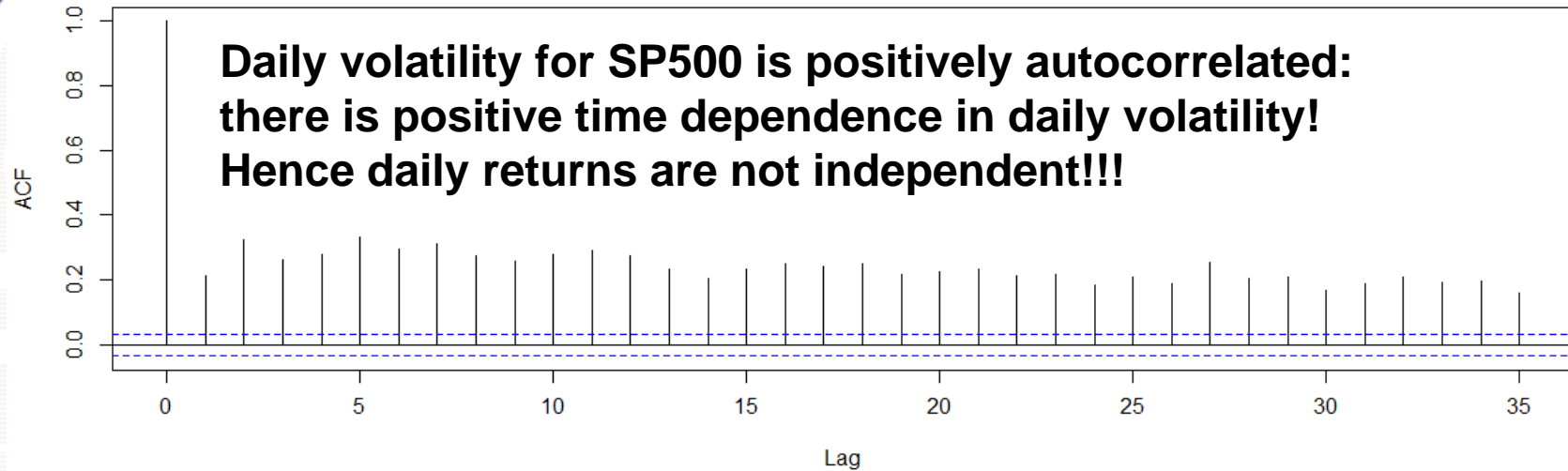
Daily absolute returns on S&P 500



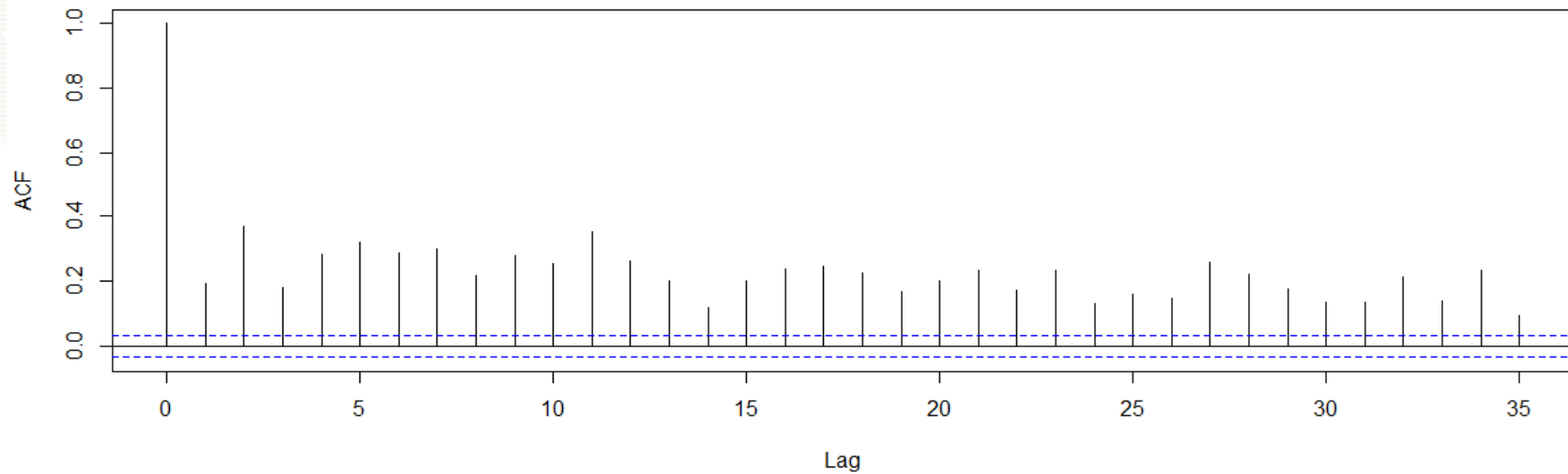
Daily squared returns on S&P 500



SP500 absolute returns



SP500 squared returns



Stylized Facts for Daily Returns

- Returns are not normally distributed. Empirical distributions have fatter tails than normal distribution (more outliers)
- Returns are approximately uncorrelated over time (no serial correlation)
- Returns are not independent over time
 - Squared and absolute returns are positively autocorrelated
 - Volatility appears to be serially correlated
 - See Engle's GARCH model