

# Financial data

## Sample statistics

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# Problems in financial data sets

- Financial data tends to be non-stationary and serially correlated.
- OLS regression requires iid data.

# Arithmetic returns

## Definition

$$r_i = \frac{P_t + D_{t-1}}{P_{t-1}} \quad r_i - \text{returns at } i, D_i - \text{dividends at } i, P_i - \text{price at } i$$

- Arithmetic returns are used for the analysis involving cross-sectional methodology, such as portfolio formation.

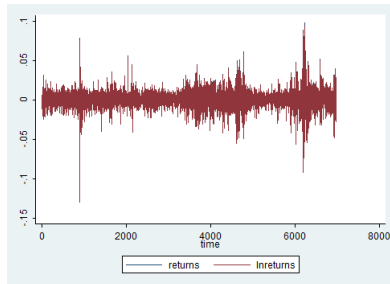
# Logarithmic returns

## Definition

$$r_i = \ln\left(\frac{P_t + D_{t-1}}{P_{t-1}}\right) = \ln(P_t + D_{t-1}) - \ln(P_{t-1})$$
$$r_i$$
 - returns at  $i$ ,  $D_i$  - dividends at  $i$ ,  $P_i$  - price at  $i$

- Logarithmic returns are used for the analysis involving time dimension, such as returns over several periods of time.

# Visual comparison

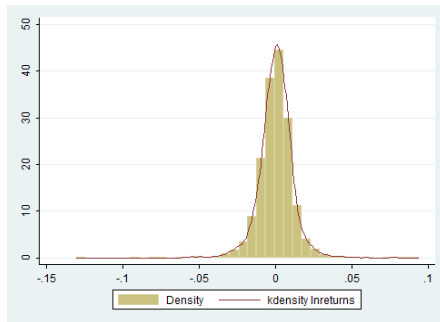
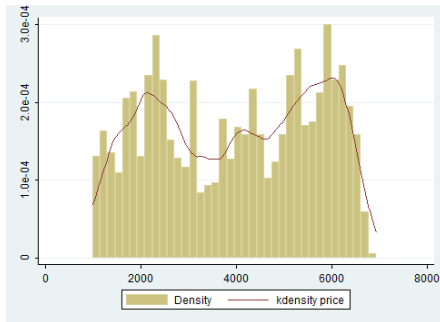


- Price data is non-stationary, while both returns transformations are almost identical and stationary.

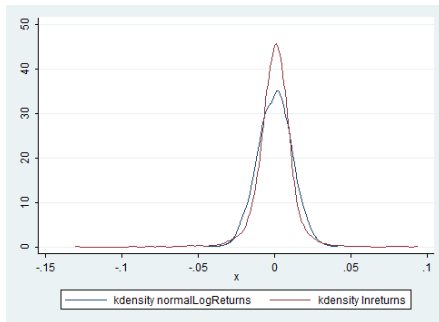
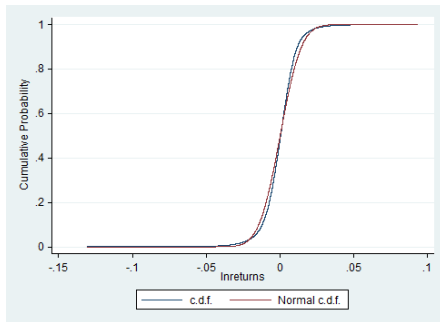
# Implications

- If returns are normally distributed then prices are log-normally distributed.
- Normally distributed returns do not violate limited liability assumption.
- Data is stationary distributed around the mean, with varying variance.

# Sample distribution



# Comparing with Gaussian distribution



- Skewness-Kurtosis test for Normality can be used for numerical results (sktest command). Test is looking for evidence to reject the null hypothesis of normality.

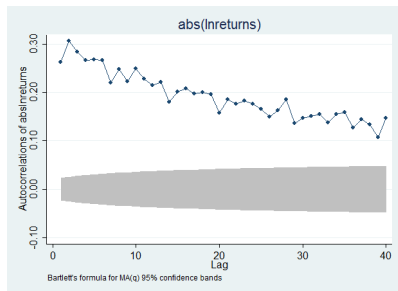
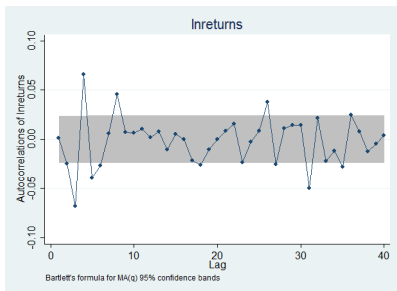
## Simple sample statistics

- Data description section should include a table summarizing simple sample statistics.

### Example

Log returns statistics	
Mean	.00023
Variance	.00013
Skewness	-0.38
Kurtosis	11.38
Min	-0.130
Max	.094
Obs	6976

# Auto-correlation function



## Stylized facts of daily returns

- The distribution of returns exhibits fat-tails.
- The distribution of returns is asymmetrically distributed.
- In general returns do not exhibit linear correlation.
- Volatility (absolute returns) exhibit long-range dependency (slow decay rate of the auto-correlation function).

## Remarks

- OLS methodology assumes that data is independently and identically distributed, but in previous slides it was displayed that data is heteroskedastic, serially correlated and not independently distributed.
- Normal distribution assumption does not hold as was displayed in kernel estimation graphs.