

# Financial data

## Time-series analysis

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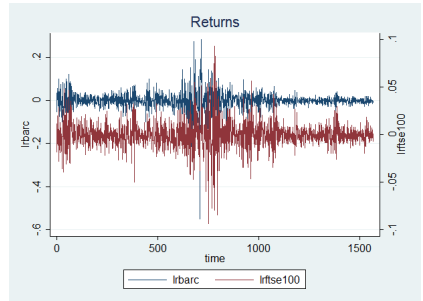
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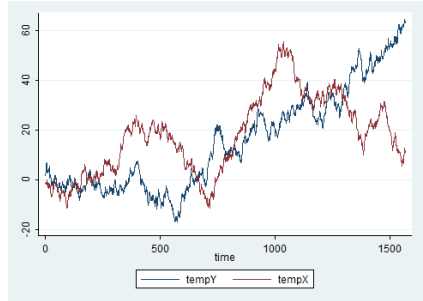
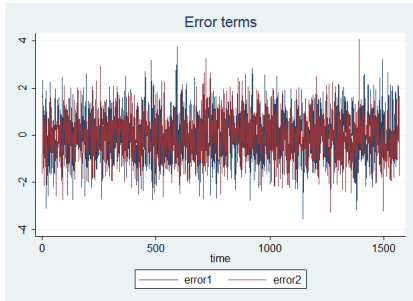
# Outline

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  - Serial correlation
  - Heteroskedasticity
  - Specification test
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# Plotting data



# Spurious results



# Spurious results (cont)

```
. reg tempY tempX
```

Source	SS	df	MS
Model	152070.026	1	152070.026
Residual	492262.652	1566	314.343967
Total	644332.677	1567	411.18869

```
Number of obs = 1568
F( 1, 1566) = 483.77
Prob > F = 0.0000
R-squared = 0.2360
Adj R-squared = 0.2355
Root MSE = 17.73
```

tempY	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]
tempX	.6227384	.028313	21.99	0.000	.567203 .6782739
_cons	4.302305	.674427	6.38	0.000	2.97943 5.62518

```
. reg tempDiffY tempDiffX
```

Source	SS	df	MS
Model	.040345936	1	.040345936
Residual	1641.61427	1565	1.04895481
Total	1641.65462	1566	1.04831074

```
Number of obs = 1567
F( 1, 1565) = 0.04
Prob > F = 0.8445
R-squared = 0.0000
Adj R-squared = -0.0006
Root MSE = 1.0242
```

tempDiffY	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]
tempDiffX	.0052752	.026898	0.20	0.845	-.0474847 .0580352
_cons	.0398369	.0258738	1.54	0.124	-.0109141 .0905878

## Unit-root test

- Dickey–Fuller test is used to test for unit-roots.
- Critical values vary for different specifications (inclusion of trend or drift parameters).
- Inclusion of lagged values leads to the augmented version of the test.
- Testing is done under the null hypothesis of a unit-root and it is one sided. Therefore significantly negative values are need to reject the null hypothesis of non-stationary.

### Definition

$$\Delta y_t = \sigma y_{t-1} + \varepsilon_t$$

*drift*

$$\Delta y_t = \beta_0 + \sigma y_{t-1} + \varepsilon_t$$

*drift + trend*

$$\Delta y_t = \beta_0 + \beta_1 t + \sigma y_{t-1} + \varepsilon_t$$

## Serial correlation test

- Breusch–Godfrey test is used in STATA to test for serial correlation in the model with critical values from  $\chi^2$  distribution.
- Test is run after performing a regression.
- If model errors are serially correlated, your estimates are inconsistent.

# Heteroskedasticity

- Breusch-Pagan test is used to test for heteroskedasticity.
- Heteroskedasticity implies that your data is not identically distributed.

## Specification test

- There is always uncertainty if your model is correctly specified.
- Ramsey RESET test is used test for higher order polynomial transformation significance in the model.
- Rejection of null hypothesis indicates that there are possible omitted variables.

## Jarque - Berra test

- For inference to be valid in the model, residuals should be normally distributed.
- Jarque - Berra test can be applied on the residuals of the model to test for the normality of the residuals distribution.

## Specifying hypothesis

- Finding appropriate variables to test your hypothesis is an art form.
- It is possible to test only positive hypothesis.

### Example

$H_0$  : Asset price returns follow CAPM model

# Testing

- T- test is used to test single parameter significance.
- Overall significance and multiple restrictions are tested using F- test.
- $R^2$  gives you information how better is your model compared with no model.