# ARIMA - integrated ARMA

ARIMA MODELS IN R



#### **David Stoffer**

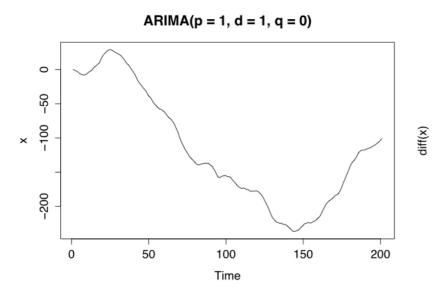
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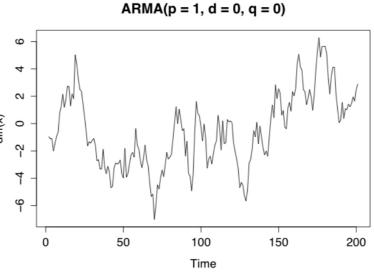


#### Identifying ARIMA

 A time series exhibits ARIMA behavior if the differenced data has ARMA behavior

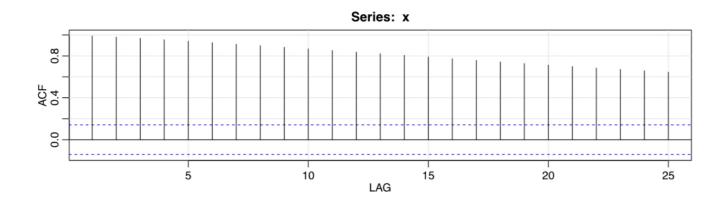
```
# Simulation ARIMA(p = 1, d = 1, q = 0) 
 x \leftarrow arima.sim(list(order = c(1, 1, 0), ar = .9), n = 200) 
 plot(x, main = "ARIMA(p = 1, d = 1, q = 0)") 
 plot(diff(x), main = "ARMA(p = 1, d = 0, q = 0)")
```

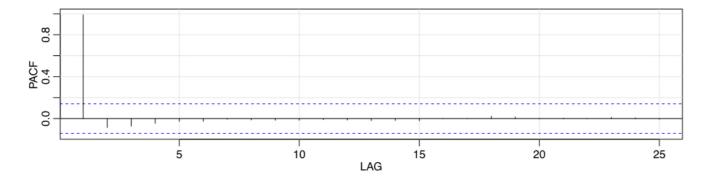




#### ACF and PCF of an Integrated ARMA

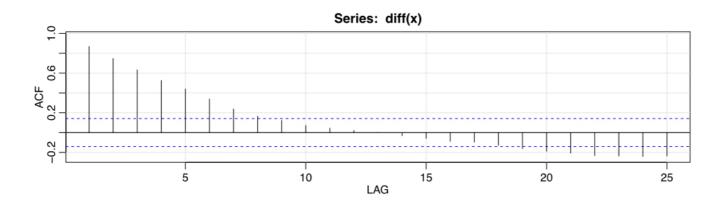
```
x <- arima.sim(list(order = c(1, 1, 0), ar = .9), n = 200) acf2(x)
```

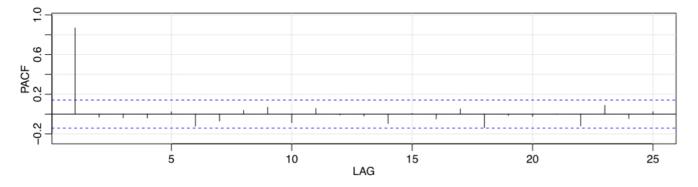




#### ACF and PCF of a Differenced ARIMA

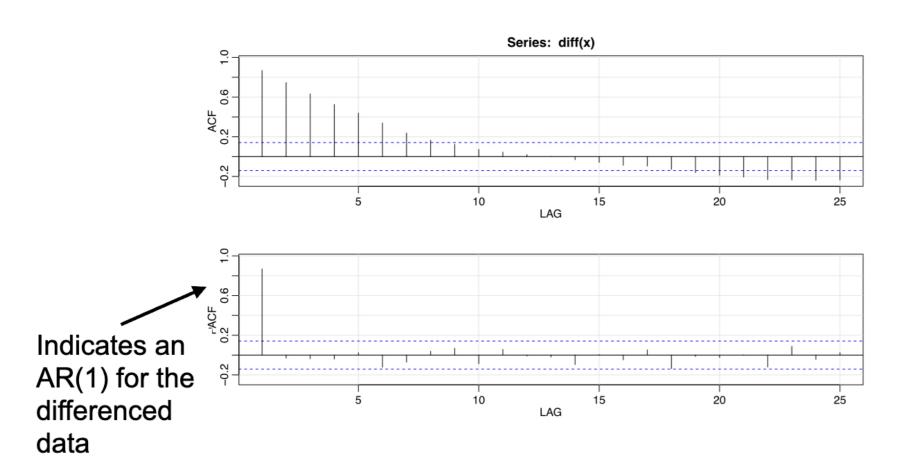
```
x \leftarrow arima.sim(list(order = c(1, 1, 0), ar = .9), n = 200) acf2(diff(x))
```





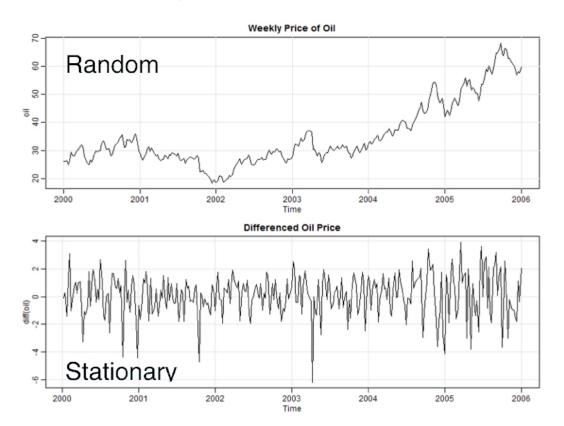
#### ACF and PCF of a Differenced ARIMA

 $x \leftarrow arima.sim(list(order = c(1, 1, 0), ar = .9), n = 200)$  acf2(diff(x))



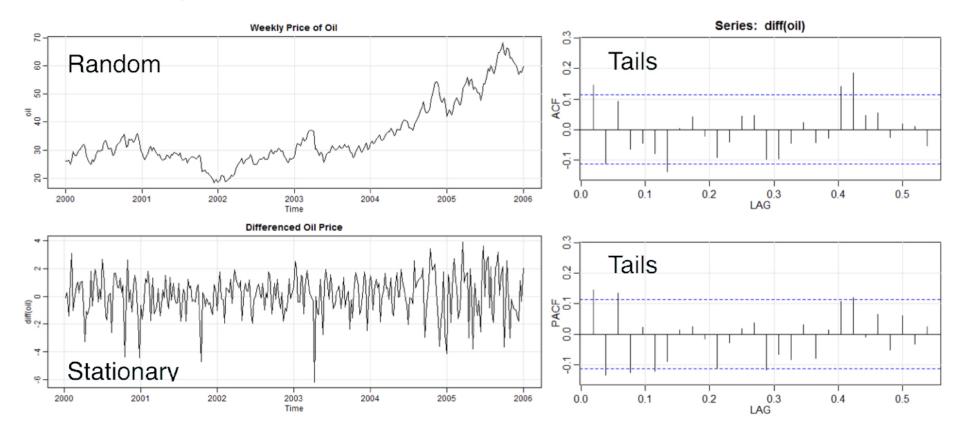


### Weekly Oil Prices





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Looks like ARIMA(1, 1, 1)

# Let's practice!

ARIMA MODELS IN R



### ARIMA diagnostics

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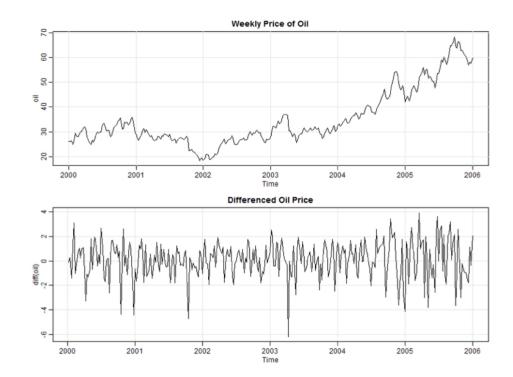


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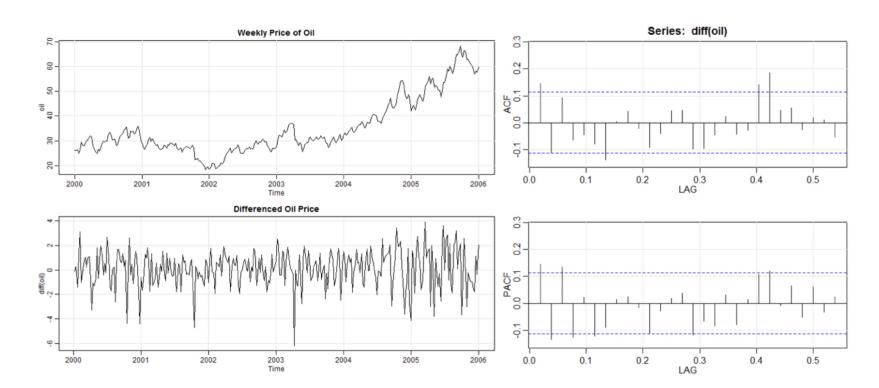


### Weekly Oil Prices ARIMA(1, 1, 1)?





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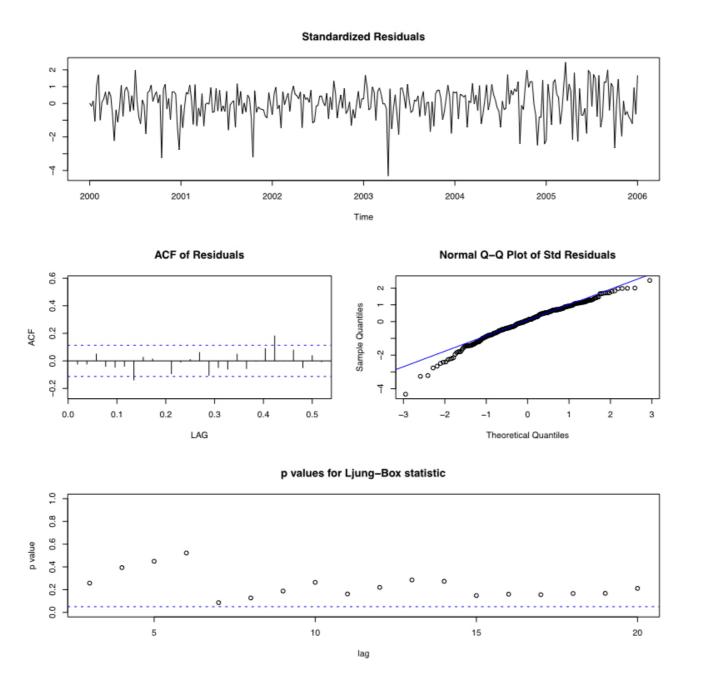


#### Weekly Oil Prices ARIMA(1, 1, 1)?

```
oil <- window(oil, end = 2006)
x <- sarima(oil, p = 1, d = 1, q = 1)
x$ttable</pre>
```

```
Estimate SE t.value p.value
ar1 -0.4987 0.0995 -5.0131 0.0000
ma1 0.7316 0.0734 9.9732 0.0000
constant 0.1091 0.0936 1.1664 0.2443
```

### Weekly Oil Prices ARIMA(1, 1, 1)!





#### Overfit: ARIMA(2, 1, 1) and ARIMA(1, 1, 2)

```
oil_fit1 <- sarima(oil, p = 2, d = 1, q = 1)
oil_fit1$ttable</pre>
```

```
Estimate SE t.value p.value
ar1 -0.4704 0.1117 -4.2121 0.0000
ar2 -0.0738 0.0652 -1.1319 0.2586
ma1 0.6771 0.0986 6.8696 0.0000
constant 0.1088 0.0878 1.2391 0.2163
```

```
oil_fit2 <- sarima(oil, p = 1, d = 1, q = 2)
oil_fit2$ttable</pre>
```

```
Estimate SE t.value p.value
ar1    -0.3664 0.1816 -2.0178    0.0445
ma1    0.5777 0.1818    3.1777    0.0016
ma2    -0.0836 0.0837 -0.9989    0.3186
constant    0.1088 0.0884    1.2306    0.2194
```

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## Forecasting ARIMA

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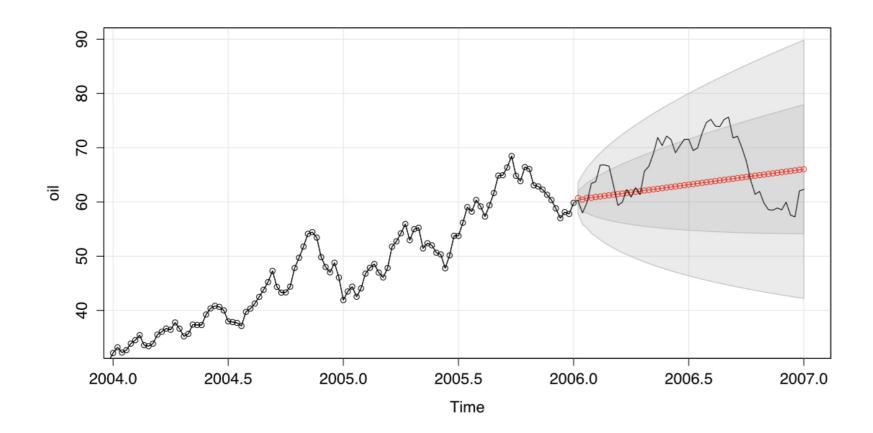


#### Forecasting ARIMA Processes

- The model describes how the dynamics of the time series behave over time
- Forecasting simply continues the model dynamics into the future
- Use sarima.for() to forecast in the astsa-package

#### Forecasting ARIMA Processes

```
oil <- window(astsa::oil, end = 2006)
oilf <- window(astsa::oil, end = 2007)
sarima.for(oil, n.ahead = 52, 1, 1, 1)
lines(oilf)</pre>
```





# Let's practice!

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