B.Sc./Grad. Dip.: Probability Models and Time Series MAS programmes: Stochastic Models and Time Series

## Solutions 6

- 1. (a) The acf of  $\{y_t\}$  dies away slowly, more or less linearly. This indicates the presence of trend. Thus it appears that  $\{y_t\}$  is from a non-stationary process.
  - (b) There appears to be a cut-off point at lag 2 in the acf of  $\{\Delta y_t\}$ , which indicates that  $\{\Delta y_t\}$  is from an MA(2) process. To check this, we should use the approximate 95% probability limits for the  $r_{\tau}$ ,  $\tau > 2$  at

$$\pm \ 2 \ \sqrt{\frac{1+2(r_1^2+r_2^2)}{T}},$$

i.e., at

$$\pm 2 \sqrt{\frac{1 + 2(0.145^2 + 0.362^2)}{399}},$$

i.e., at  $\pm 0.114$ . (Note that there are 399 observed differences.) None of the tabulated  $r_{\tau}$ ,  $\tau > 2$  falls outside these limits. This supports the hypothesis of an MA(2) process.

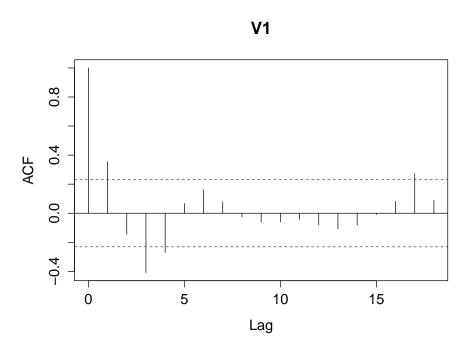
Thus it appears that  $\{y_t\}$  is from an ARIMA(0,1,2) process.

2. You will need to ensure that the file sheepdata.txt is saved into the working directory of RStudio or from whichever interface you are using to run R. You can download sheepdata.txt from moodle.

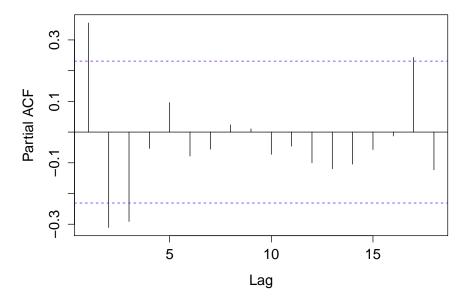
The following is an outline of a suggested analysis.

```
> sheep <- read.table("sheepdata.txt")</pre>
> sheep.ts <- ts(sheep, start=1867)</pre>
> plot(sheep.ts, xlab = "", ylab = "",
       main = "Sheep Pop. in England & Wales: 1867 to 1939", las = 1)
> sheep.acf <- acf(sheep.ts, 18)
> dsheep.ts <- diff(sheep.ts)
> dsheep.acf <- acf(dsheep.ts, 18)</pre>
> dsheep.pacf <- acf(dsheep.ts, 18, type = "partial")</pre>
> sheep310 <- arima(sheep.ts, order = c(3, 1, 0))
> sheep310
Call:
arima(x = sheep.ts, order = c(3, 1, 0))
Coefficients:
                ar2
         ar1
      0.4210 -0.2018 -0.3044
s.e. 0.1193 0.1363 0.1243
sigma^2 estimated as 4783: log likelihood = -407.56, aic = 823.12
> tsdiag(sheep310)
```

- (a) A plot of the data and an examination of the acf, which dies away rather slowly, indicates that there is a trend, so that differencing of the data is probably appropriate.
- (b) The following acf and pacf are for the differenced data.

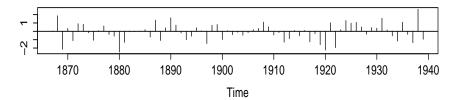


# Series dsheep.ts

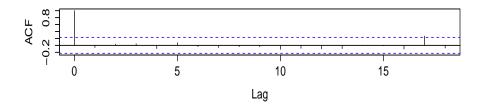


From examination of the acf and pacf, it seems that an AR(3) model might be a reasonable one to try for the differenced data, i.e., an ARIMA(3,1,0) model for the undifferenced data. (Note that 95% probability limits appropriate to the differenced data are given by  $\pm 2/\sqrt{T} = \pm 2/\sqrt{72} = \pm 0.236$ .) The freak significant values at lag 17 need not be taken too seriously – they seem to reflect the fact that there happen to be peaks in the sheep population at intervals of 17 years.

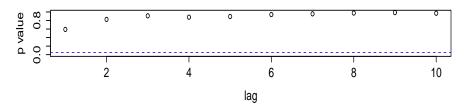
#### Standardized Residuals



#### **ACF of Residuals**



### p values for Ljung-Box statistic



Nothing is indicated by the goodness-of-fit diagnostics which suggests that the ARIMA(3,1,0) model (which has no process mean included) is inappropriate.

The fitted model equation is

$$\Delta Y_t = 0.4210 \Delta Y_{t-1} - 0.2018 \Delta Y_{t-2} - 0.3044 \Delta Y_{t-3} + \epsilon_t,$$

i.e.,

$$Y_t = 1.4210Y_{t-1} - 0.6228Y_{t-2} - 0.1026Y_{t-3} + 0.3044Y_{t-4} + \epsilon_t.$$