Question 3.41

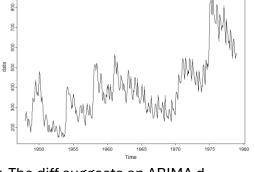
I first plot data and diff(data). The diff(data) looks to exhibit more stationary trends.

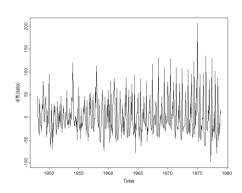
I then plot the ACF and PACF using the acf2 function.

There is a clear seasonality

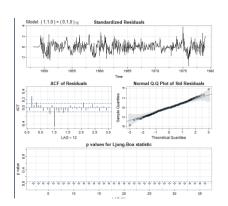
trend every 12 months or 1 year. The diff suggests an ARIMA d

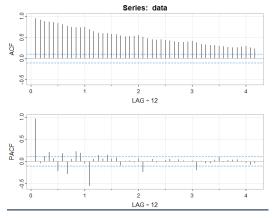
of 1 and s of 12 to caputre seems to tail off, and PACF large lag, or 2. I first tried an ARIMA(1,1,0) x (0,1,0)_12 as results: The QQ plot looks decent, but the p values for





this seasonal trend. The ACF looks to maybe cut off after 1 an initial guess. Here are the



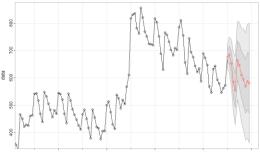


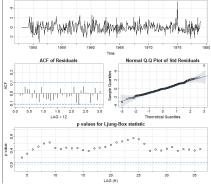
the box test do not give me much hope. I decided to bump up the AR value to capture this significant lag in PACF. This new ARIMA(2,1,0) x

(0,1,1)_12 worked much much better. For fun I ran an auto arima function too. It gave me



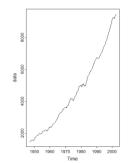
model. Forecast looks decent too!





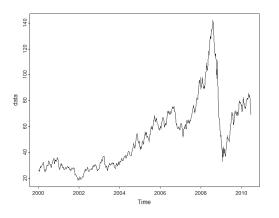
Question 5.4

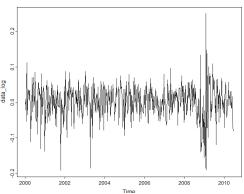
After plotting the data, yea the graph definitely looks explosive. I ran the 3 tests from the supplemental reading, all with the alternative hypothesis = "explosive". Each of them gave a p-value of .01, meaning we reject the null in facor of the alternative, being that according to each of these 3 tests the series is explosive.



Question 5.6

First I plotted the data and the diff(log(data)). The log data looks like much more of an appropriate fit for a GARCH model. I tried a bunch of different SARIMA models to see





 $gmodel = garchFit(\sim arma(2,1) + garch(1,0), data_log)$

what the general trends looked like. The ACF and PACF of the diff(log(data)) were both not very helpful, as many of the lag coefficients were non-significant. I settled on this model:

It's not perfect, the Q-Q plot looks decent until about the +- 2 std dev from 0. Many of the p-values for the box test are close to the line for a significant p-value, but the first few start out pretty great. I ran a GARCH model as such, following the book's code and some online suggestions for basic GARCH models. The results are shown

below in black. Many of the p values are very low, which

indicate a model that fits well.

Overall it's not the best model in the world, but it seems to perform pretty well.

```
Standardised Residuals Tests:
 Jarque-Bera Test
                          Chi^2
                                 124.4050971 0.000000e+00
                                   0.9676387
                                              1.387584e-09
Shapiro-Wilk Test
                          Q(10)
Ljung-Box Test
                                  13.7927856 1.826548e-01
Ljung-Box Test
                          Q(15)
                                     6345369
                                              2.307750e-01
                                  24.7018406
 Ljung-Box Test
                          Q(20)
                                  96.3419940
                                              3.330669e-16
Liung-Box Test
                    R^2
                          0(10)
 Liuna-Box Test
                          0(15)
                                 110.2326694
                                              1.110223e-16
 Ljung-Box Test
                          Q(20)
                                 115.8653749 1.665335e-15
   Arch Test
                          TR^2
                                      9511081 6.505934e-09
Information Criterion Statistics:
                                    HOIC
      AIC
                BIC
                           SIC
```

.359849 -3.312434 -3.360089 -3.341311

