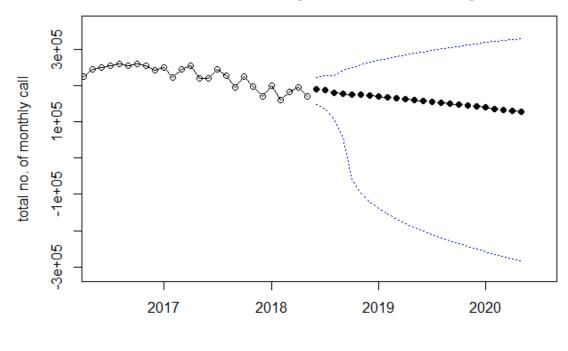
Forecasting: predict two years ahead.

- Forecast service offered in 24 month with 95% confidence intervals.
 - □ Seems there is a decrease trend for service after May 2018.
 - □ The longer the model forecasts, the bigger the variance and wider the confidence intervals.

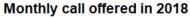
Forecast total monthly call of the next two years

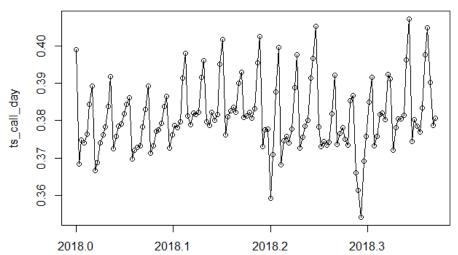




Daily Forecasting: testing stationarity

- Test stationarity: in order to use ARIMA must make sure data is stationary.
 - ☐ The data is stationary already! No need to take difference.
 - Unit Root test shows data is stationary.





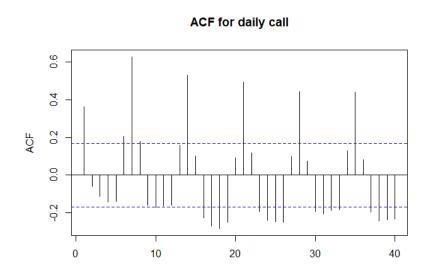
Augmented Dickey-Fuller Test

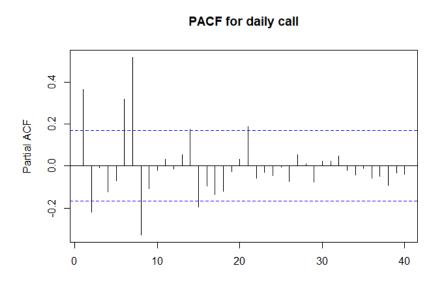
data: ts_call_day
Dickey-Fuller = -3.5799, Lag order = 5, p-value =
0.03778
alternative hypothesis: stationary

2

Daily Forecasting: seasonality and trends.

- Check ACF and PACF to see if there is seasonality trend or pattern.
 - □ Both ACF and PACF show there is a sudden increase between t(1), t(7), t(14), and t(21), suggesting a weekly seasonality.
 - □ Seems AR model may fit, but need to test a few to see.





Daily Forecasting: model selection

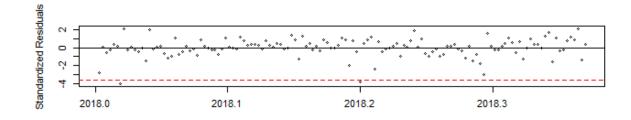
- Use auto.arima to test a few models and see which one performs better.
 - □ ARIMA(2,0,1) model is selected. But still need to test a few others.
 - □ Seems model ARIMA(1,0,0) * (1,0,1)7 works best (has lowest AIC, coefficients are significant).
 - Still need to do model diagnostics.

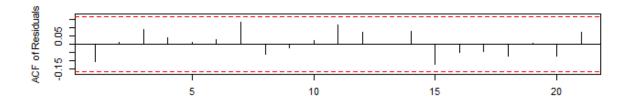
```
auto.arima(ts call day, d=NA, D=NA, max.p=15, max.q=15, max.P=15, max.Q=15)
Series: ts call day
ARIMA(2,0,1) with non-zero mean
Coefficients:
         ar1
                 ar2
                         ma1
                                mean
      0.3106 -0.1856 0.1671 0.3812
s.e. 0.4958 0.2155 0.5124 0.0010
model02 <- arima(ts call day, order=c(1,0,0),seasonal=list(</pre>
           order=c(1,0,1), period=7)
Coefficients:
                        smal intercept
        ar1
               sar1
      0.6179 0.9976 -0.8951
                                0.3817
s.e. 0.0742 0.0055 0.1158 0.0075
```

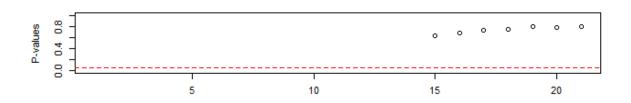


Daily Forecasting: model diagnosis

- Check if the model is appropriate.
 - Residuals seem normally distributed and independent (i.i.d).
 - Model seems appropriate.



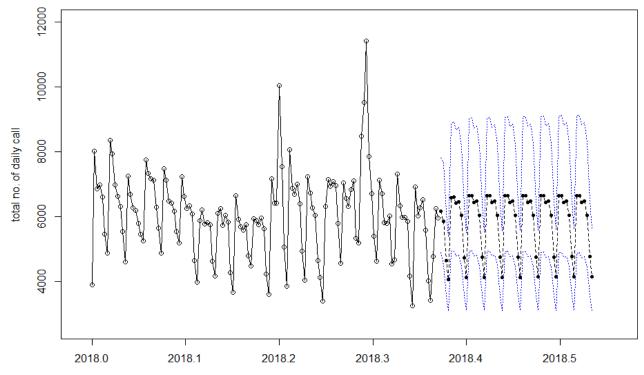






- Forecast daily call offered in 8 weeks with 95% confidence intervals.
 - □ Daily call has a weekly seasonality.
 - Same trend continues to the future weeks.

Forecast total daily call of the next two months



By Simon Liu