

### Recap: Introduction to ARIMA

- Time Series forecasting model
- ARIMA: 'Auto Regressive Integrated Moving Average'



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- Time Series forecasting model
- ARIMA: 'Auto Regressive Integrated Moving Average'
- ARIMA has three parameters
  - Auto regressive p
  - Integrated d
  - Moving Average q



### Recap: Parameters of ARIMA model

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p, d, q





### Recap: Parameters of ARIMA model

- ARIMA has three parameters
  - Auto regressive p
  - Integrated d
  - Moving Average q

Differencing



ARIMA has three parameters

Auto regressive - p

o Integrated - d

Moving Average - q



ARIMA has three parameters



- Integrated d
- Moving Average q
  PACF (partial autocorrelation function) plot



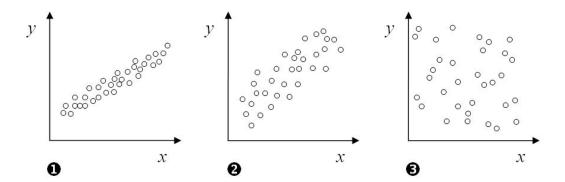
 Some important concepts before we move over to determining the values of p, and q-

- Correlation
- Autocorrelation
- Partial Autocorrelation

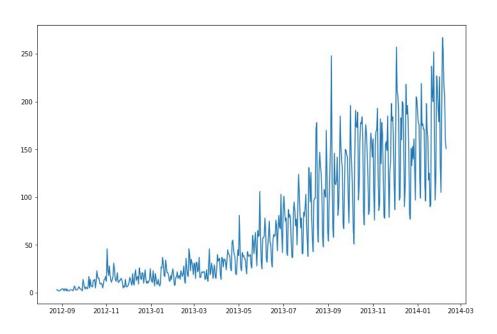


#### Correlation

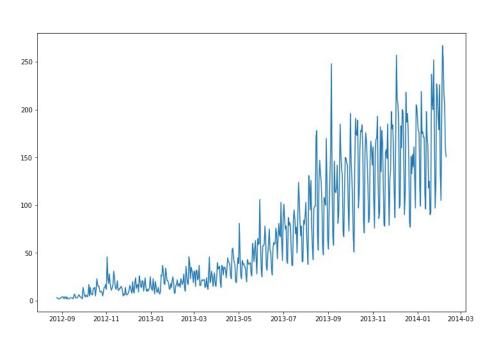
Correlation refers to the strength of mutual relationship between quantities.





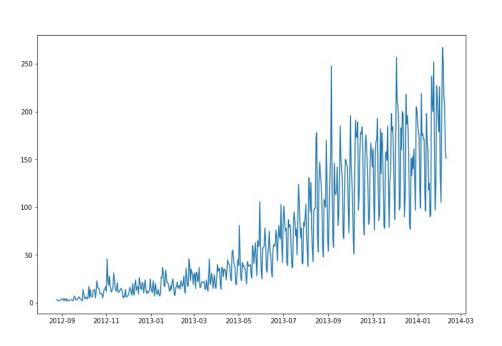






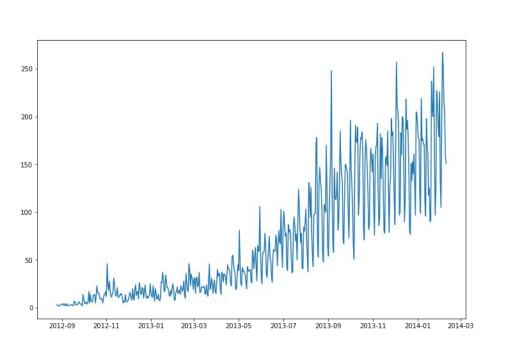
32
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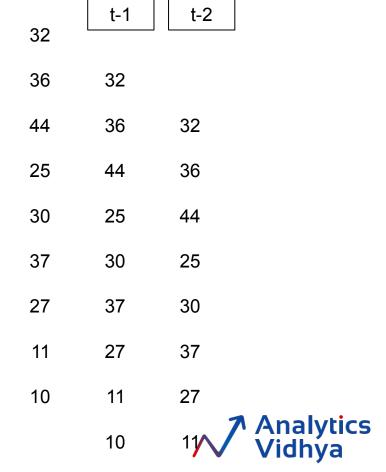




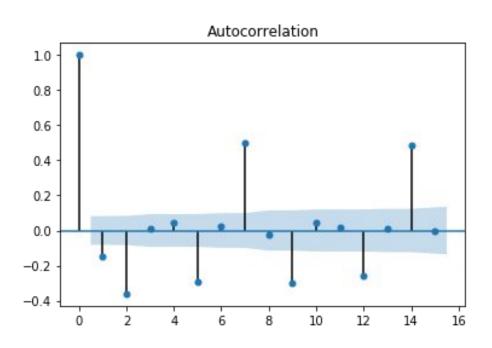
t-1





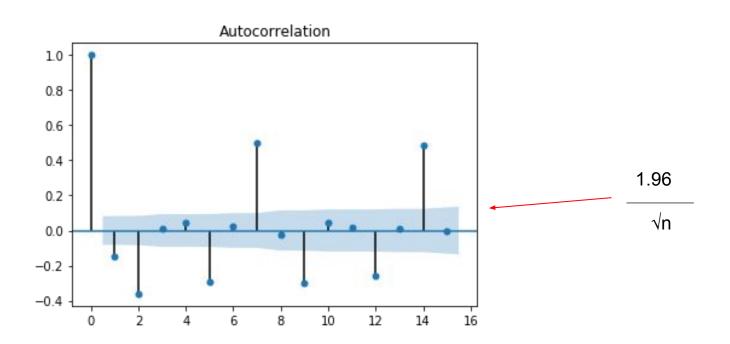


# **Auto-Correlation Function (ACF)**



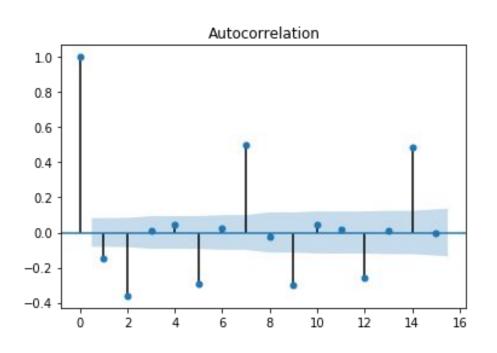


# **Auto-Correlation Function (ACF)**





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AR(2)  
$$y(t) = a1*y(t-1) + a2*y(t-2) + u$$

Lag = 2 have significant correlation



# Summarizing - Auto-Correlation Function (ACF)

- Auto Correlation refers to how correlated is the series with its past self
- ACF plot shows the auto correlation values
- ACF plot can be used to select the value of p for ARIMA





AR(1)

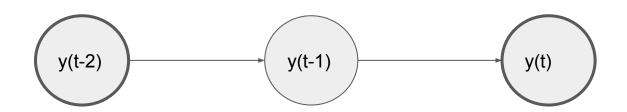
y(t) = a1\*y(t-1) + const.





**AR(1)** 

y(t) = a1\*y(t-1) + const.



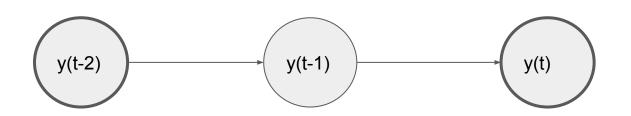


AR(1)

$$y(t) = a1*y(t-1) + const.$$

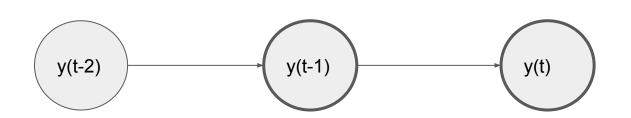
AR(2)

y(t) = a1\*y(t-1) + a2\*y(t-2) + const.



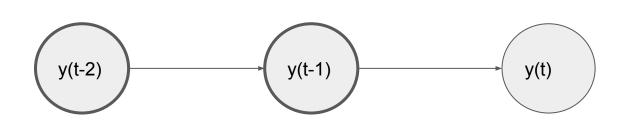


 Amount of variance in y(t) which is not explained by y(t-1)





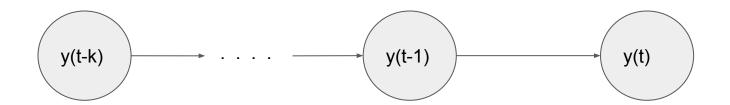
 Amount of variance in y(t) which is not explained by y(t-1)



2. Amount of variance in y(t-2), which is not explained by y(t-1)

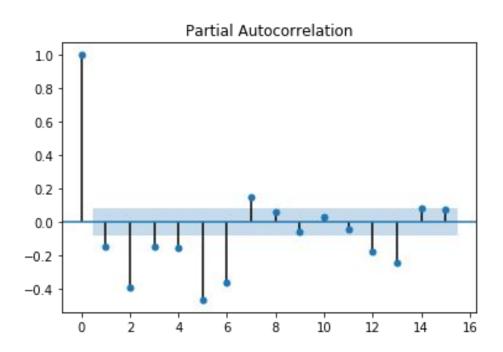


Partial Auto-Correlation: Correlation between y(t) and y(t-k) after removing correlation of time steps in between



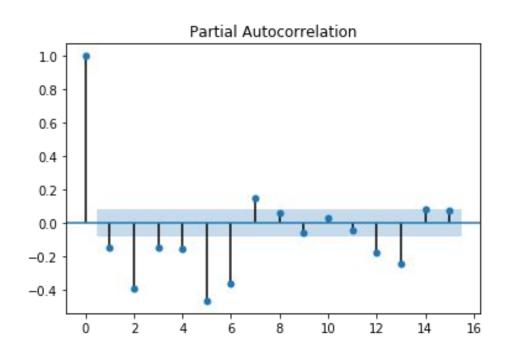


### Partial Auto-Correlation Function (PACF)





# Partial Auto-Correlation Function (PACF)



$$MA(2)$$
  
y(t) = E(t) + a1\*E(t-1) + a2\*E(t-2) + u

Lag = 2



# Summarizing - Partial Auto-Correlation Function (PACF)

- Partial Auto Correlation refers to the correlation with the residuals of the lags.
- PACF plot shows the partial auto correlation values
- PACF plot can be used to select the value of q for ARIMA



### Thank You



# Autoregressive Models - ACF

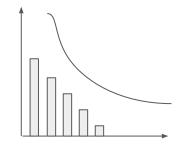
$$y(t) = a1 * y(t-1) + a2 * y(t-2) + ... + ap * y(t-p) + E(t)$$

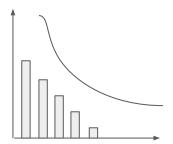
AR(1)

$$y(t) = a1*y(t-1) + E(t)$$

AR(2)

$$y(t) = a1*y(t-1) + a2*y(t-2) + E(t)$$







# Autoregressive Models - PACF

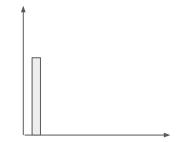
$$y(t) = a1 * y(t-1) + a2 * y(t-2) + ... + ap * y(t-p) + E(t)$$

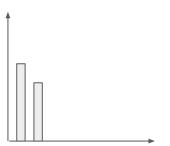
AR(1)

$$y(t) = a1*y(t-1) + E(t)$$

**AR(2)** 

$$y(t) = a1*y(t-1) + a2*y(t-2) + E(t)$$







# Moving Average Models - PACF

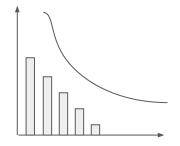
$$y(t) = u + E(t) + a1 * E(t-1) + a2 * E(t-2) + ... + aq * E(t-q)$$

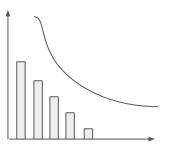
MA(1)

$$y(t) = u + E(t) + a1*E(t-1)$$

MA(2)

$$y(t) = u + E(t) + a1*E(t-1) + a2*E(t-2)$$







# Moving Average Models - ACF

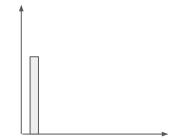
$$y(t) = a1 * y(t-1) + a2 * y(t-2) + ... + ap * y(t-p) + E(t)$$

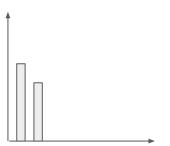
AR(1)

$$y(t) = a1*y(t-1) + E(t)$$

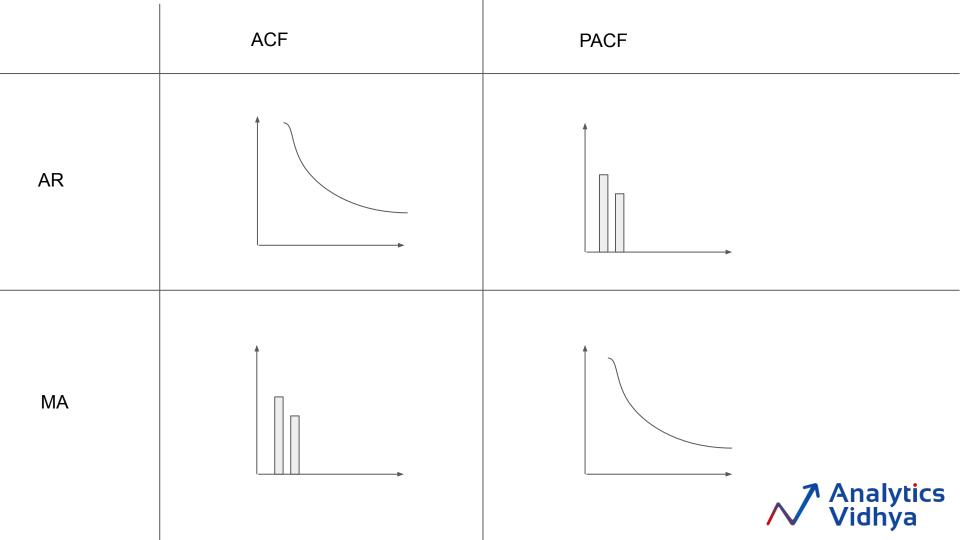
AR(2)

$$y(t) = a1*y(t-1) + a2*y(t-2) + E(t)$$





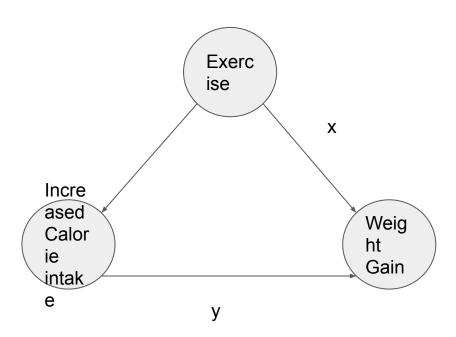




# Summarizing - Auto-Correlation Function (ACF)

- Lag 1 has positive autocorrelation? AR model
- -ve correlation at lag 1? MA model
- ACF drops of at lag k = AR(k) model
- PACF Gradual decrease? MA model







### Differencing - d

- Differencing
  - This is done to stabilize the mean by removing changes in the level
  - Differencing is performed by subtracting the previous observation from the present observation

$$[ y(t) = x(t) - x(t-1) ]$$

