## Project 6: Forecasting Sales

### **Project Overview**

You're a supply chain analyst that creates and sells video games. our manager has tasked you to forecast monthly sales data in order to help plan out the supply with demand for the company's video games.

## Step 1: Plan Your Analysis

1. Does the dataset meet the criteria of a time series dataset? Make sure to explore all four key characteristics of a time series data.

Yes, the dataset meets criteria of a time series dataset.

The dataset is taken across a continuous time interval and in yyyy-mm format.

The dataset is sequential.

The dataset is separated by monthly intervals.

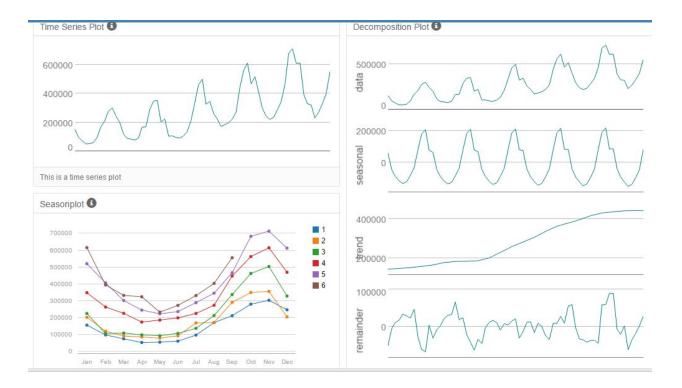
The dataset contains at most one data point for each interval.

2. Which records should be used as the holdout sample?

The final prediction is forecast for the next 4 months of sales. The holdout sample will be the last 4 months of sales data from 2013-06 to 2013-09.

## Step 2: Determine Trend, Seasonal, and Error components

1. What are the trend, seasonality, and error of the time series? Show how you were able to determine the components using time series plots. Include the graphs.



The time series and decomposition plots are generated using TS plot tool.

Trend is upward and linear, Seasonality has peaks and valleys and increasing over time, Error has irregular pattern.

## Step 3: Build your Models

1. What are the model terms for ETS? Explain why you chose those terms.

**ETS Model Terms** 

Error - Multiplicative - Irregular pattern

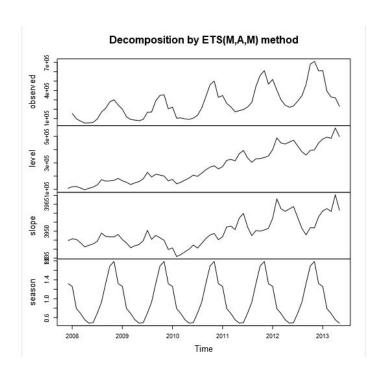
Trend - Additive - Upward and Linear

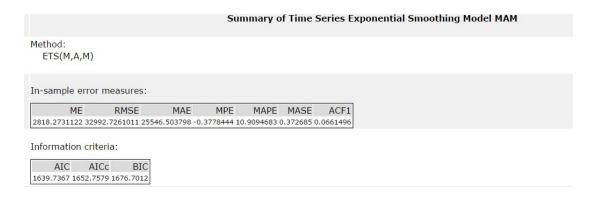
Seasonality - Multiplicative - Increasing peaks and valleys

ETS Model (M,A,M) is chosen.

ETS model is run with a holdout sample of 4 months.

ETS model

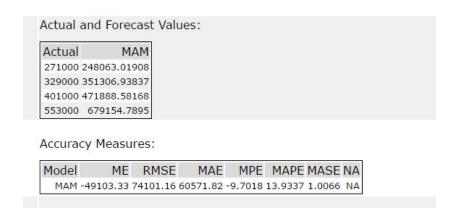




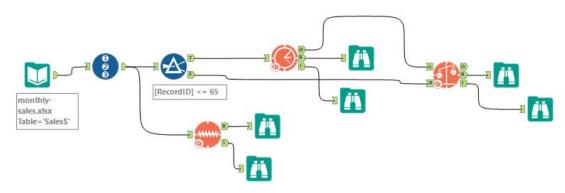
Two key components to look at are the RMSE, which shows the in-sample standard deviation, and the MASE which can be used to compare forecasts of different models.

ETS model has RMSE 32992.7 and MASE 0.37 and AIC 1639.7 MASE value is under the 1.0 threshold(commonly accepted threshold for model accuracy), which is good.

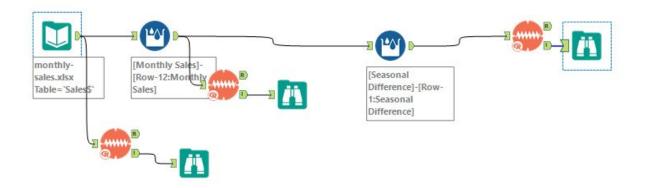
ETS model



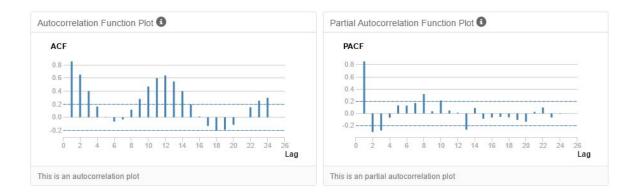
### Alteryx Workflow ETS model



2. What are the model terms for ARIMA? Explain why you chose those terms. Graph the AutoCorrelation Function (ACF) and Partial Autocorrelation Function Plots (PACF) for the time series and seasonal component and use these graphs to justify choosing your model terms.

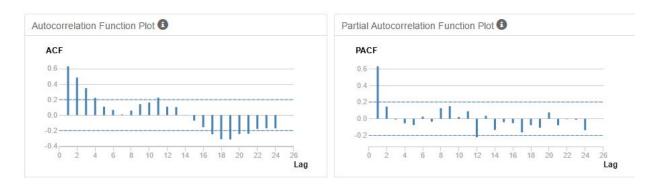


The original time series plot shows seasonality.

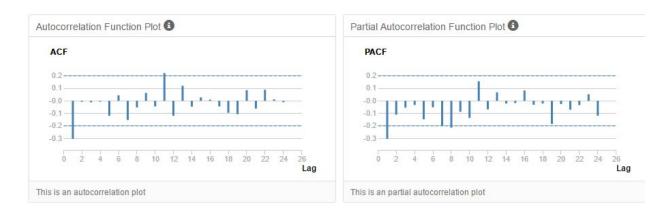


The ACF plot and PACF plot show positive correlation at lag 1.

So differencing for the 12 months is done. This will remove seasonality. ACF and PACF plot after seasonal difference is applied.



ACF and PACF still show positive correlation at lag 1.
A seasonal first difference is applied and ACF plot does not show strong correlation.



ARIMA model (0,1,1) (0,1,0) is used as lag 1 is negative and the number of period is 12 months.

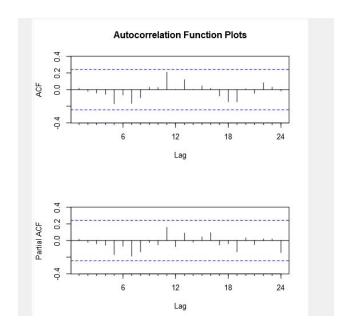
# Information Criteria: AIC AICc BIC 1256.5967 1256.8416 1260.4992

In-sample error measures:

ME	RMSE	MAE	MPE	MAPE	MASE	ACF1
-356.2665104	36761.5281724	24993.041976	-1.8021372	9.824411	0.3646109	0.0164145

Two key components to look at are the RMSE, which shows the in-sample standard deviation, and the MASE which can be used to compare forecasts of different models.

ARIMA model has RMSE 36761.5 and MASE 0.36 and AIC 1256.59 MASE is at 0.36 which means it under the commonly accepted threshold of 1.0





### Accuracy Measures:

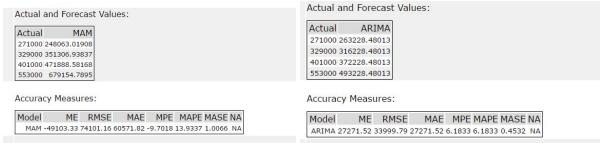
Model ME RMSE MAE MPE MAPE MASE NA ARIMA 27271.52 33999.79 27271.52 6.1833 6.1833 0.4532 NA

### Step 4: Forecast

Answer these questions.

1. Which model did you choose? Justify your answer by showing: in-sample error measurements and forecast error measurements against the holdout sample.

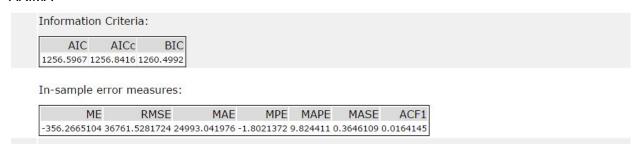
ETS model ARIMA model



ARIMA model is better at forecasting sales using holdout sample.

The RMSE for ARIMA is **33999.79** compared to ETS' RMSE at **74101.16**. ARIMA's MASE value of **0.4532** is also lower than ETS' MASE value of **1.0066**. ARIMA model has lower AIC of **1256.59** and ETS has higher AIC of **1639.73** 

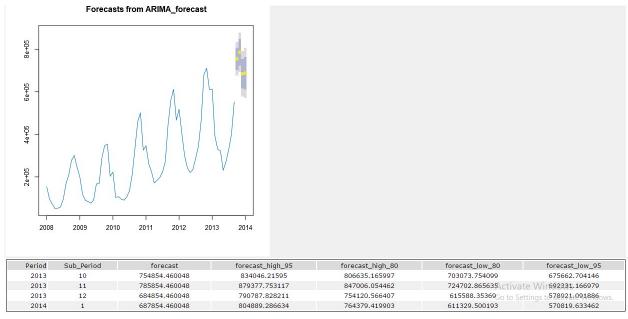
#### ARIMA

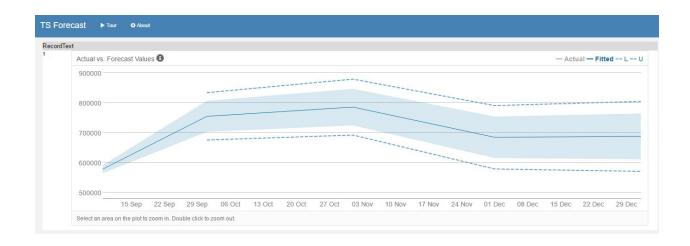




Further investigation shows that the MAPE and ME of the ARIMA model are lower than the ETS. This suggests that, on average, the ARIMA model misses its forecast by a lesser amount. ARIMA model AIC is lower than that of ETS. Lower AIC reflects better model accuracy. Hence, ARIMA model is chosen.

2. What is the forecast for the next four periods? Graph the results using 95% and 80% confidence intervals.





### Alteryx Workflow ARIMA model

