

# Advanced Business Analytics Final Project

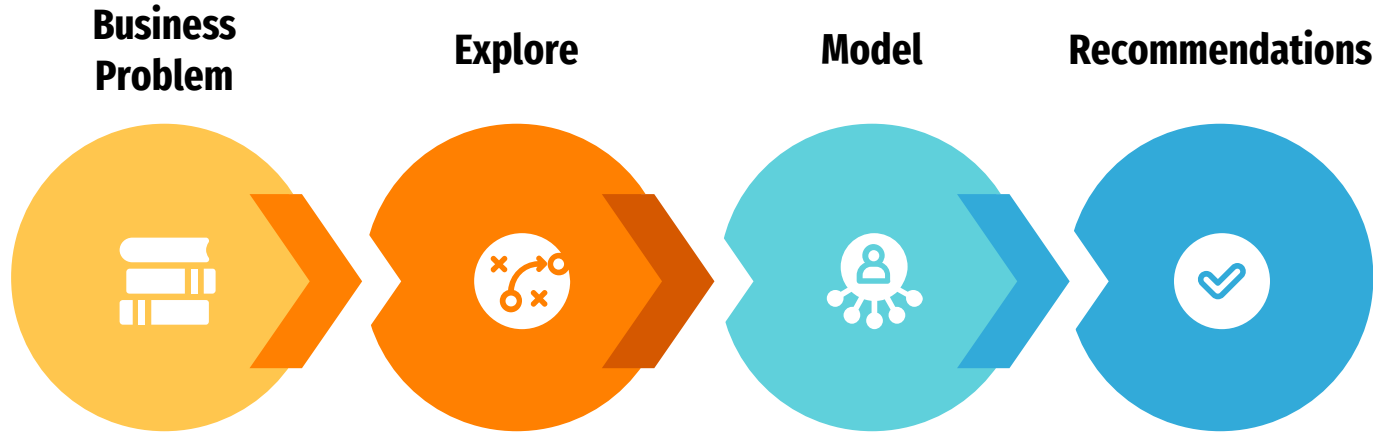
## Forecasting Customer Returns

### Section 3 Team 9

Abhishek Nambiar  
Aditya Uppuluri  
Lavanya Karthikeyan  
Madhulika Chilla  
Mandeep Singh Rahi  
Tanveer Singh Sapra

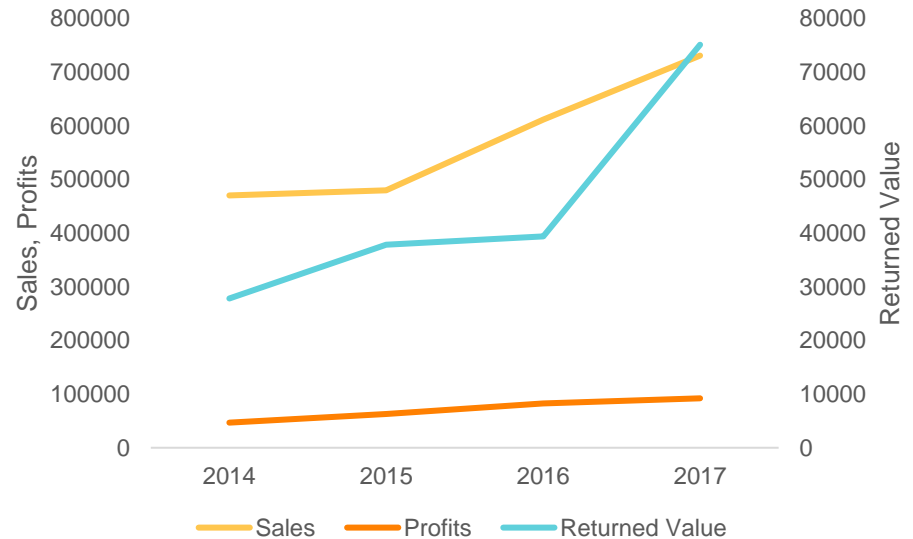


# Steps followed

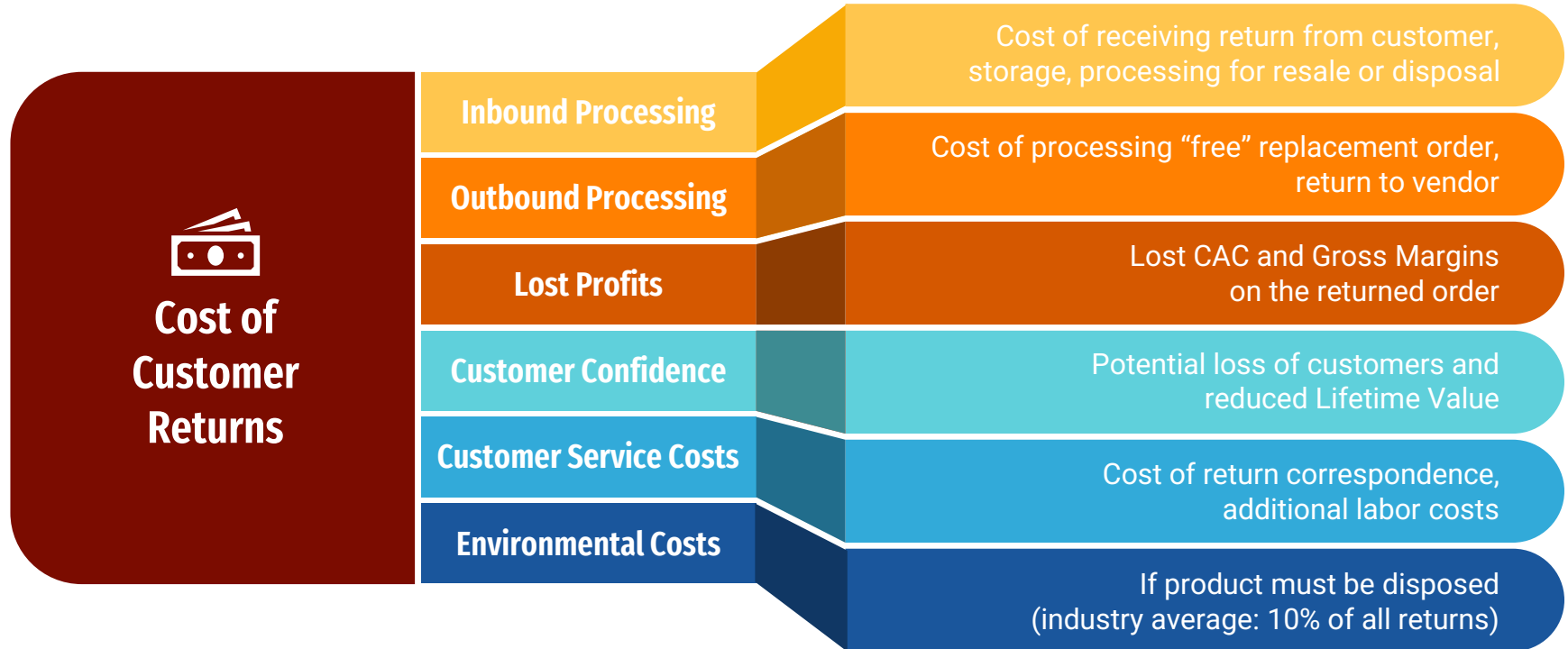


# Defining the business problem

- Steady increase in sales and profits for the business
- But, returned value crossing more than **10%** of sales value in 2017
- Puts future sales planning at risk
- Expected to increase in the future with eCommerce



# Other than losing almost 10% of revenue, additional costs are incurred on customer returns



# Dataset description and aggregation

## Order Data

Collection of sales orders  
with relevant features



## Returns Data

Join collection of returned  
sales orders



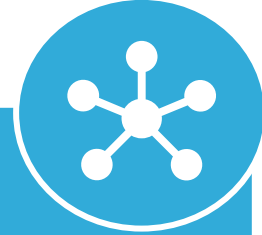
## Calculate

% return rate and  
returned value



## Aggregate

At monthly level granularity



# Exploratory data analysis

**Business  
Overview**



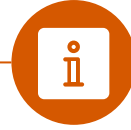
**Analysis of  
Shipping  
Modes**



**Returns  
Overview**



**Impact of  
Returns on  
Regions and  
Categories**



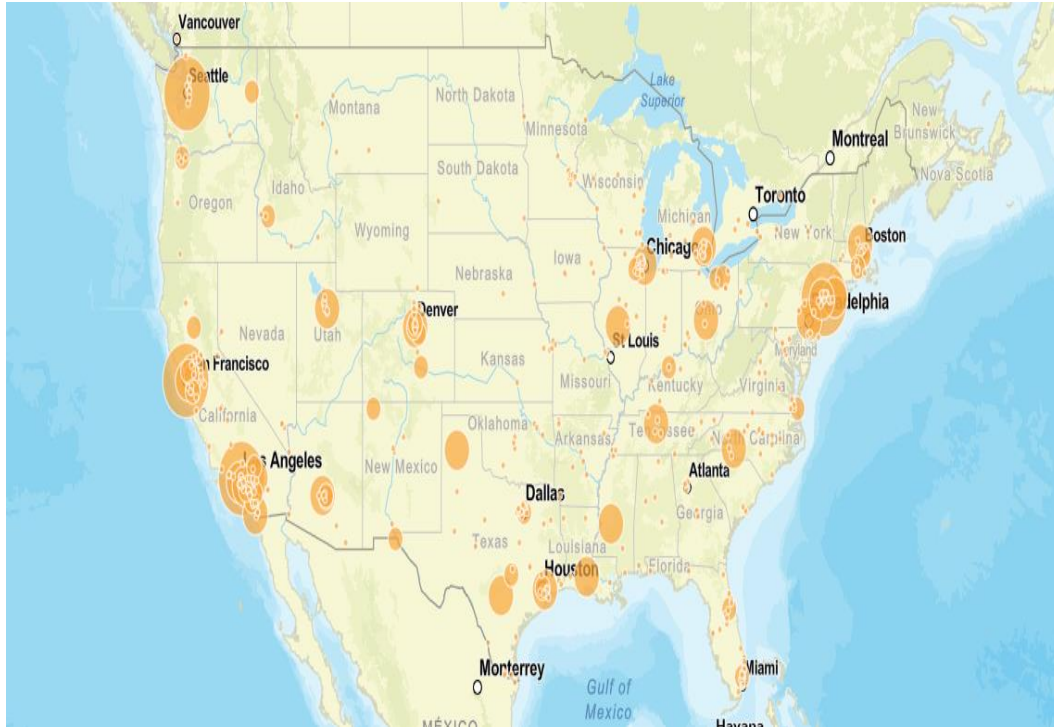
**Impact of  
Delivery  
Duration  
on Profits**



**Impact of  
Delivery  
Duration  
on Returns**



# Business overview



**55%+ discount**

Average sales were highest when discount offered was greater than 55%



**531 cities**

These cities were the main hubs of customers ordering products

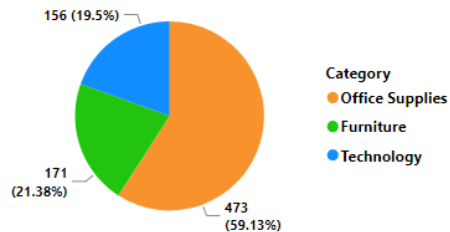


**28% profit**

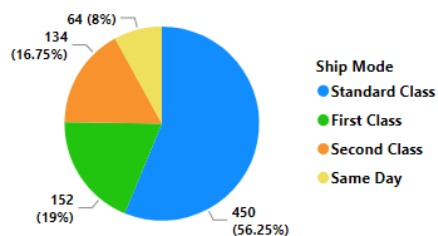
About 700 customers contribute to over 28% profit in sales through purchases

# Returns overview

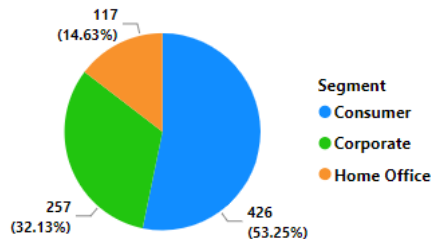
## Number of Products Returned by Category



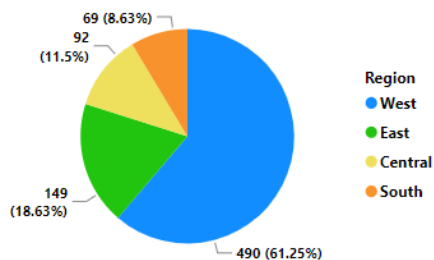
## Number of Products Returned by Ship Mode



## Number of Products Returned by Segment

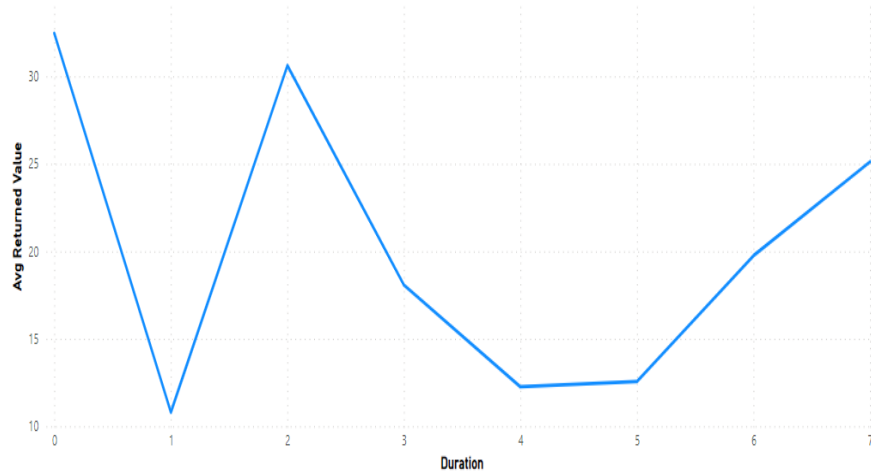


## Number of Products Returned by Region



# Delivery duration

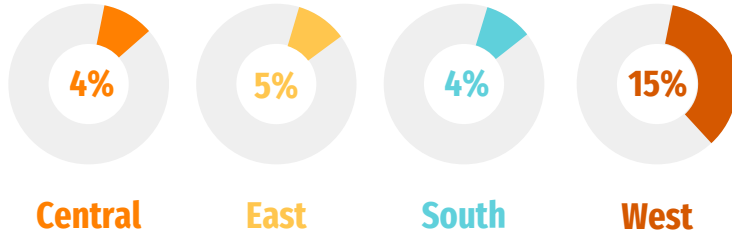
## Average Returned Value by Duration





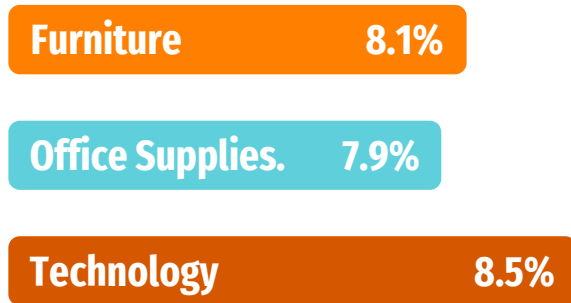
# Returns rate varying by region and category

Region



West has more than **3x** the average returns rate of other regions.

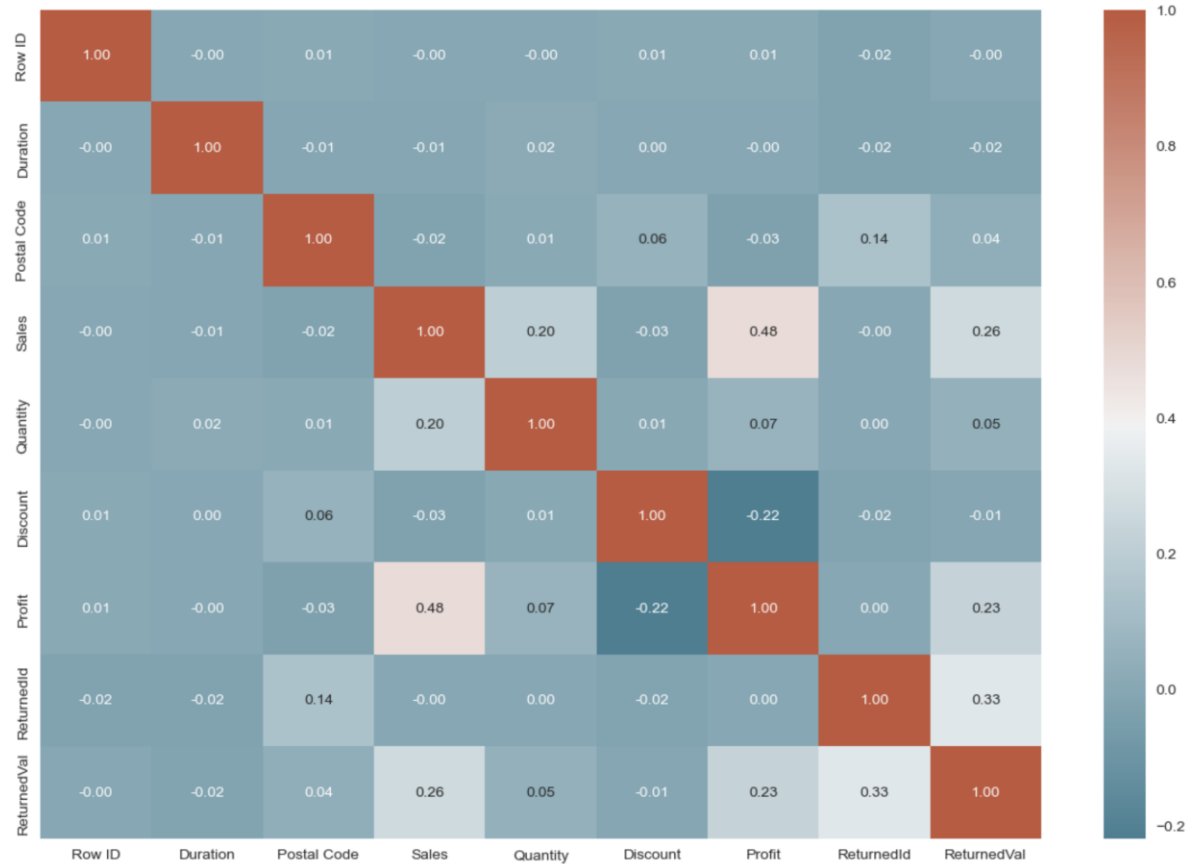
Category



Technology, responsible for 51% of total profits, has the **highest** returns rate among categories.

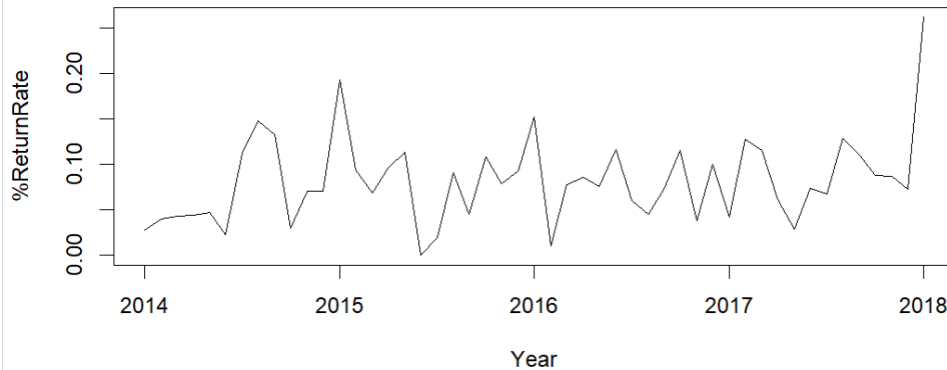
# No significant correlation found

( $\geq 0.5$  or  $\leq -0.5$ )

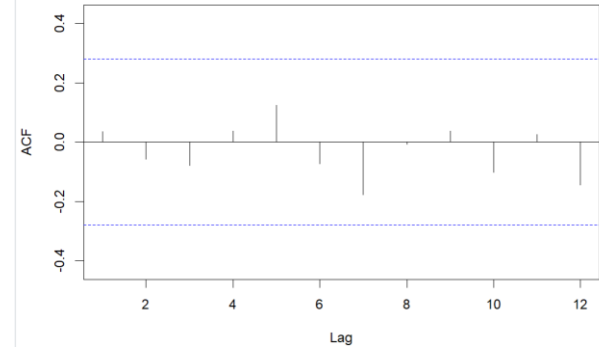


# Non-stationary time series observed

Return rate for entire time series



ACF Plot of entire timeseries



No significant ACF observed

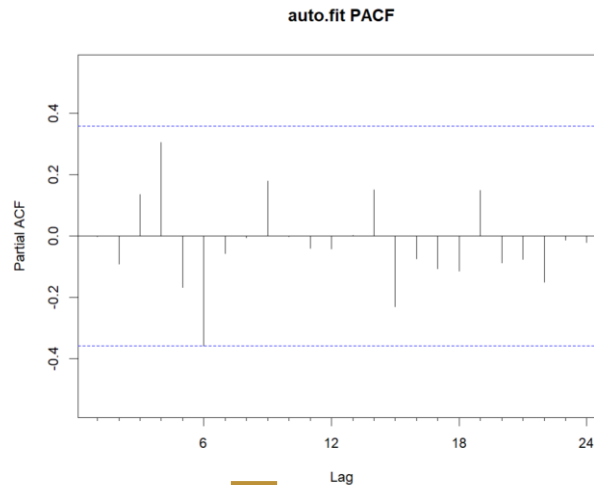
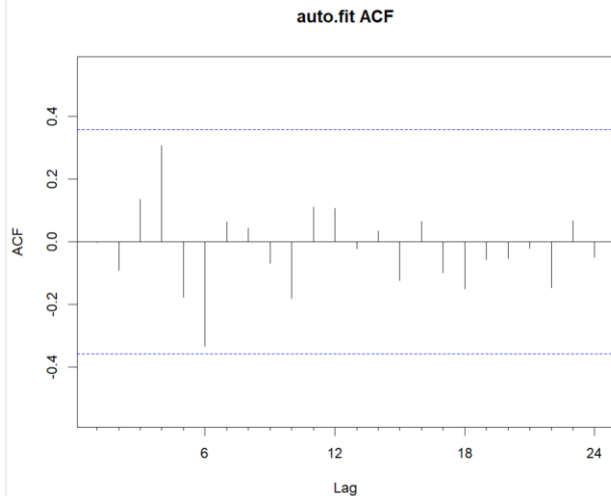
Augmented Dickey-Fuller Test

```
data: return.ts  
Dickey-Fuller = -3.2748, Lag order = 3, p-value =  
0.08608  
alternative hypothesis: stationary
```



Non-Stationary

# Auto Arima



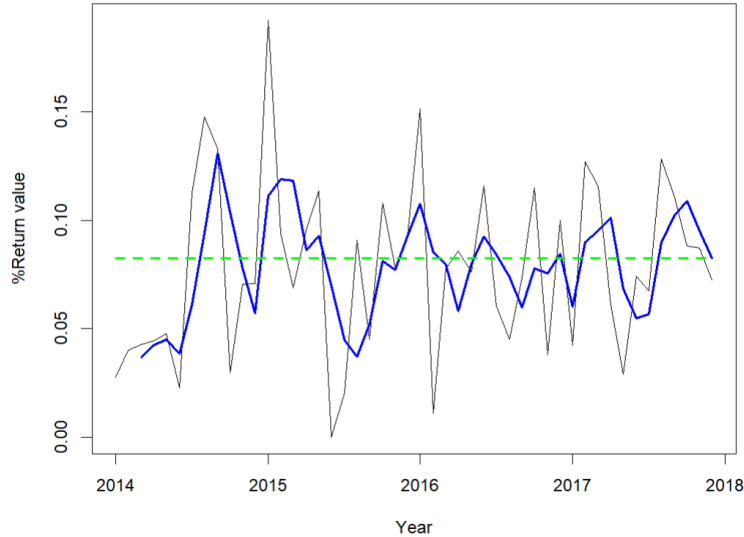
No significant autocorrelation  
factor observed

Training set error measures:

	ME	RMSE	MAE	MPE
Training set	3.601599e-17	0.04156151	0.03359206	-Inf
	MAPE	MASE	ACF1	
Training set	Inf	0.6409524	0.04702396	

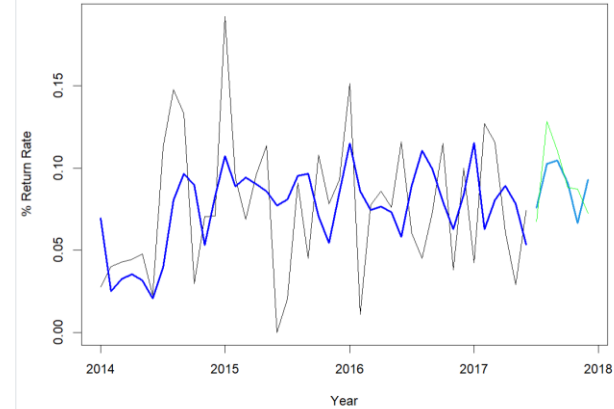

# Moving on to smoothing models

Simple Moving Average



Models not giving best results

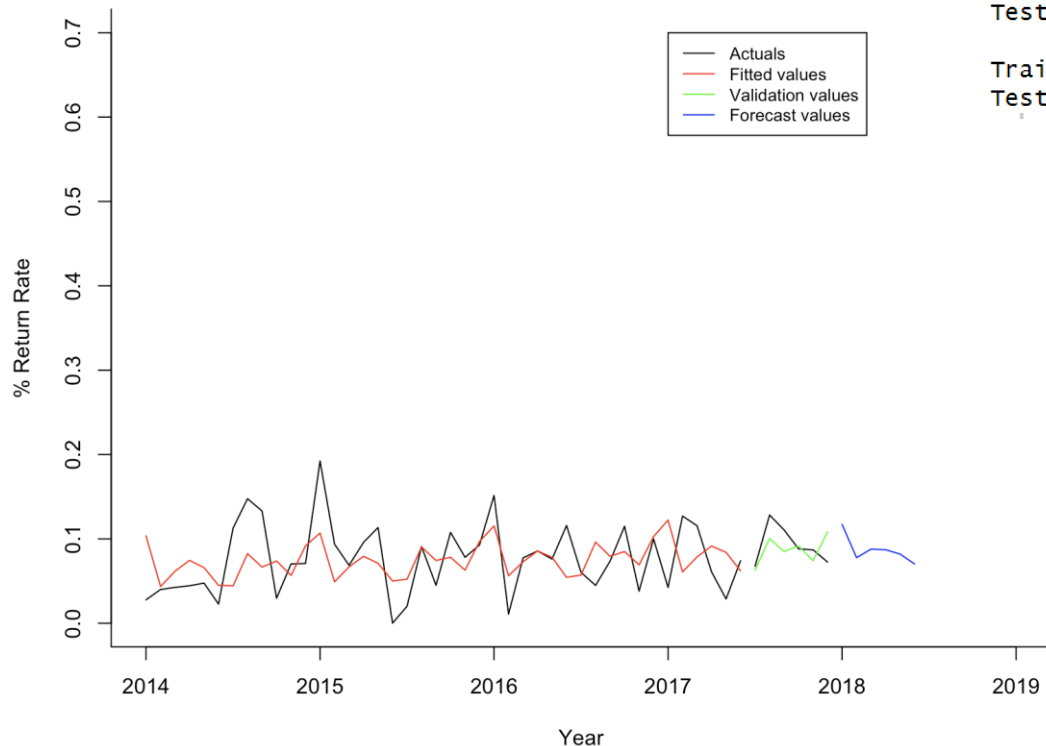
Returns SES(0.2) Validation

	ME	RMSE	MAE	MPE
Training set	0.002109871	0.04420767	0.03304653	-Inf
Test set	0.019561499	0.02880290	0.02140969	17.17331
	MAPE	MASE	ACF1	Theil's U
Training set	Inf	0.6305434	-0.01897547	NA
Test set	19.89829	0.4085071	-0.06877673	0.9487445

# Finalized on Holt-Winters' method

% Return Rate AES(AAA) Model



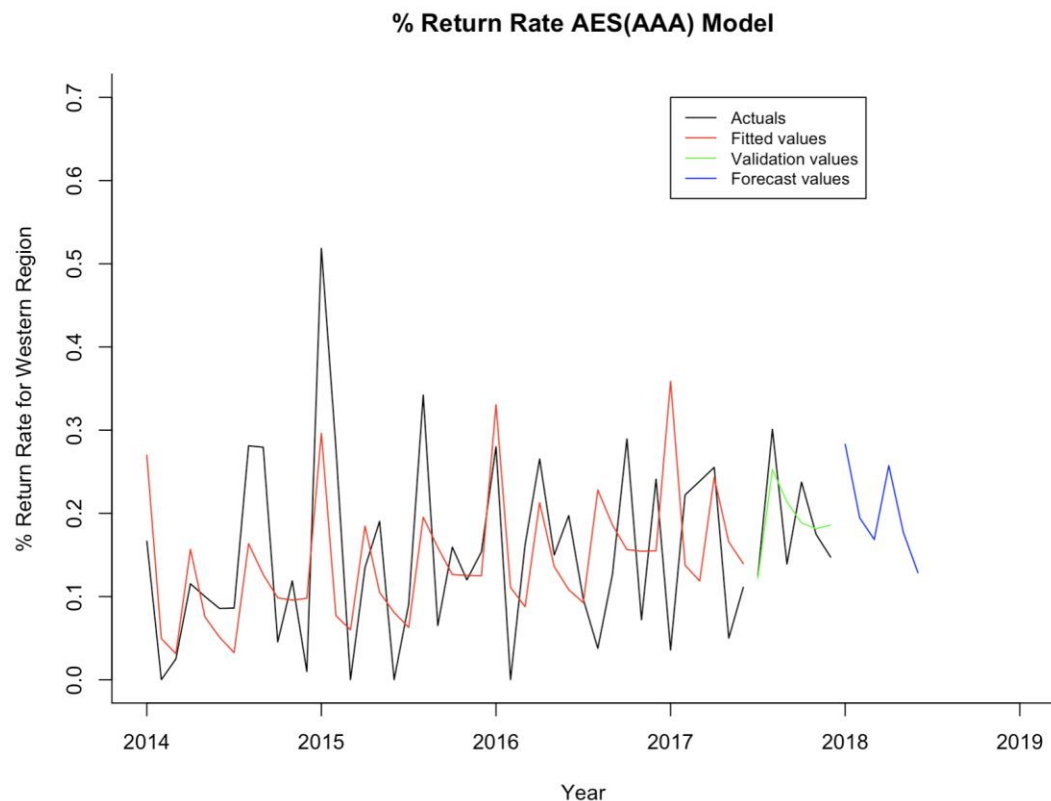
	ME	RMSE	MAE	MPE
Training set	0.003076962	0.04135453	0.03306079	-Inf
Test set	0.012088221	0.02014200	0.01678227	10.48281

	MAPE	MASE	ACF1	Theil's U
Training set	Inf	0.6308155	-0.04376335	NA
Test set	16.95784	0.3202137	-0.32595043	0.6369183

Month-Year	Forecasted values
Jan-2018	0.1172
Feb-2018	0.0777
Mar-2018	0.0879
Apr-2018	0.0871
May-2018	0.0820
June-2018	0.0703

# Particularly forecasting for West region



	ME	RMSE	MAE	MPE
Training set	0.005463227	0.10394683	0.08128112	-7220.1262
Test set	-0.003215744	0.04448113	0.03675545	-7.4059

	MAPE	MASE	ACF1	Theil's U
Training set	7258.95704	0.6398539	-0.1042406	NA
Test set	20.48257	0.2893429	-0.6066518	0.3664636

Month-Year	Forecasted values
Jan-2018	0.2930
Feb-2018	0.1980
Mar-2018	0.1727
Apr-2018	0.2567
May-2018	0.1797
June-2018	0.1223

# Recommendations



Focus on West region to forecast and reduce return rate



Monitor category-wise and city-wise return rates



Collect additional returns data to improve forecasting



Adopt multivariate time series forecasting in the future



Thank you!