X Education – Lead Scoring Case Study

Group Members: Mohit Raj Harshitha DA Sahithi **Problem Statement: To Identify Hot Leads to Increase Conversion Rate**

Lead – Conversion Process

Lead Generation via referrals and ads on websites like Google

Visit to X
Education website by these potential customers (professionals)

Visitors provide contact details

Calling and reaching out to the leads

~30% leads ge converted

Proposed Solution:

A model to filter lead to increase the conversion ratio

Proposed Solution

Selection of Hot Leads

Communicating with Hot Leads

Conversion of Hot Leads

Leads Clustering

We cluster the leads into certain categories based on their tendency or probability to convert, thus, reducing the sample size but getting more efficient.

Focus Communication

Since we would know more about this smaller set of leads, we can have an impactful conversation.

Increase Conversion

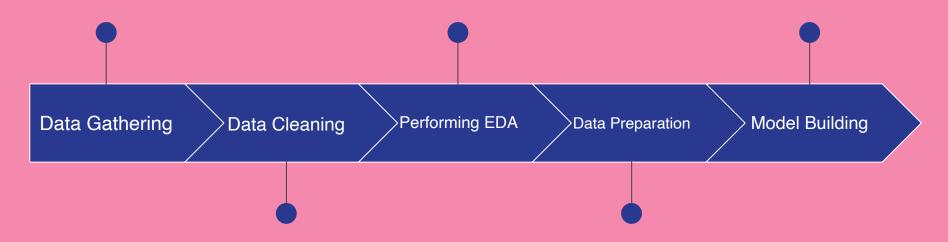
Since we focussed on hot leads, which were more probable to convert, we would have a better conversion rate.

Implementation

Loading and Observing past data provided by the company

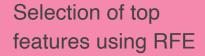
Univariate, bivariate, and heatmap for numerical and categorical columns

Performing pre-requisites for RFE and logistic regression



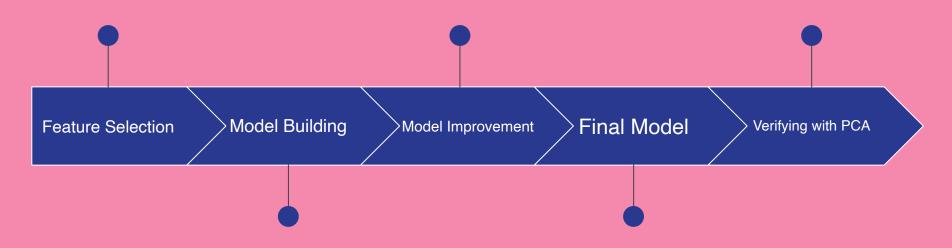
Removing duplicate values, treating null values, eliminating unnecessary column, etc.

Treating outlier, Feature Standardisation



Reduction of columns and model re-building

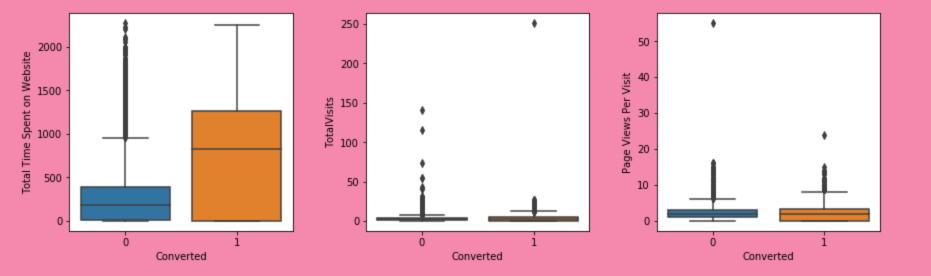
Verifying our final model accuracy with PCA



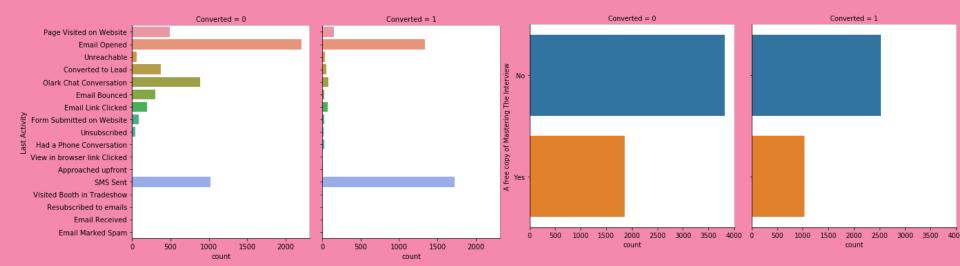
Model building using RFE for selected columns

Final model analysis and performance on test data

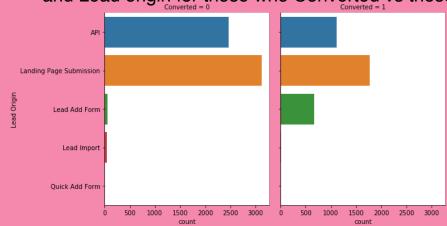
Plots (Visualisation)

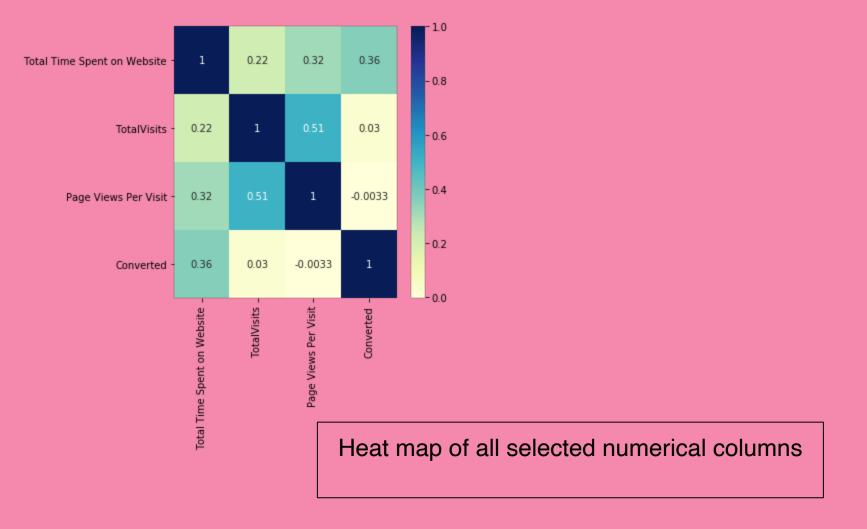


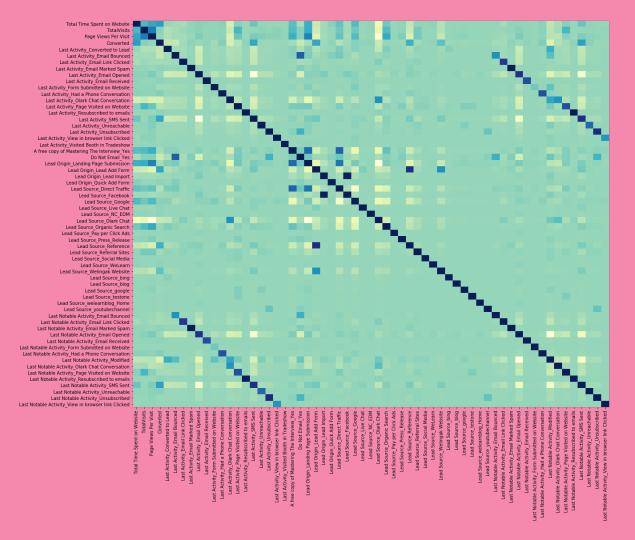
Plots depicting variation in numerical columns with converted



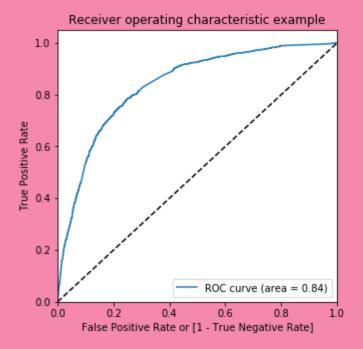
Plots depicting variation in Last Activity, Mastering the interview and Lead origin for those who Converted vs those who didn't



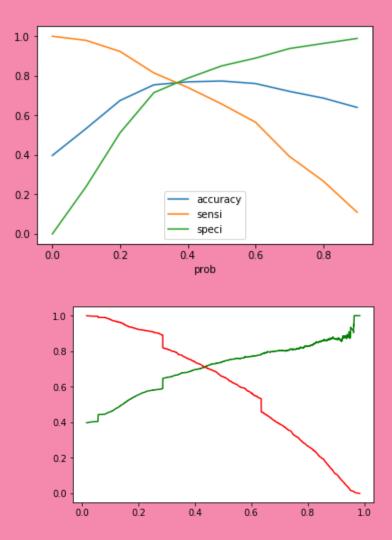


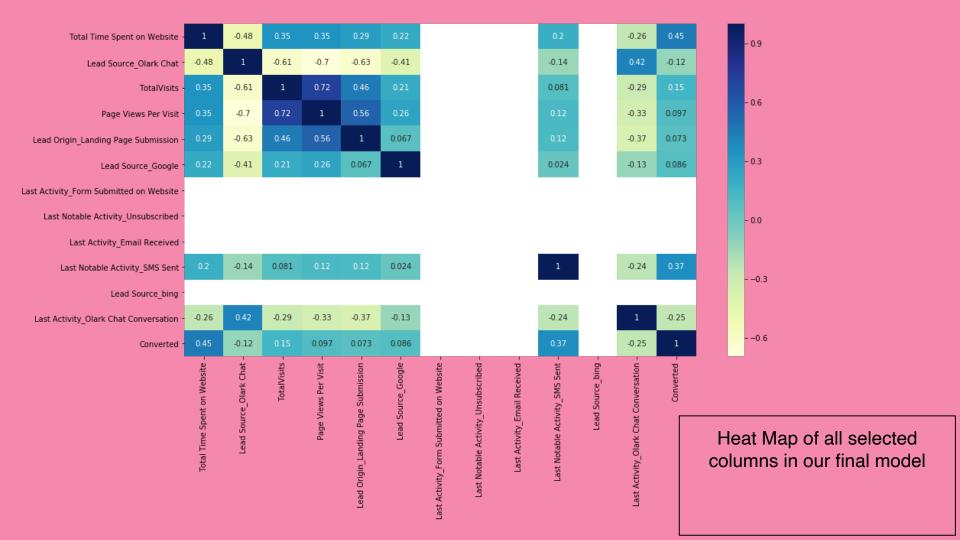


Heat map for all selected columns (numerical columns



Linear Regression Final
Model Parameters
Area under ROC = 0.84
Intermediate cut-off = 0.35
Final cut-off = 0.42





Inference / Conclusion

Model Analysis

Performance of our Final Model

Overall accuracy on Test set: 0.81

Sensitivity of our logistic regression model: 0.82

Specificity of our logistic regression model: 0.82

Inferences from Model

Business Insights Derived from our Model

Top 3 variables in our model that contribute towards lead conversion are:

- Total Time Spent on Website
- TotalVisits
- Lead Origin

Inferences from Model

Business Insights Derived from our Model

Top 3 variables in my model, that should be focused are:

- Last Activity_SMS Sent (positive impact)
- Last Activity_Olark Chat
 Conversation (negative impact)
- Lead Source_Olark Chat (negative impacting)