Lead Scoring Case Study using Logistic Regression

By

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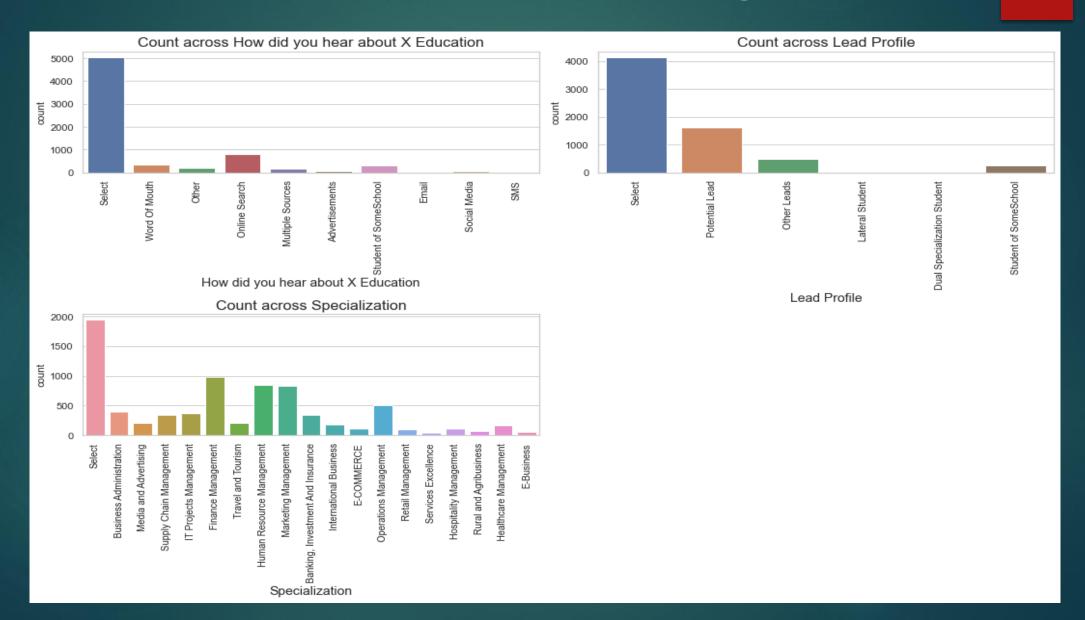
Problem Statement

X Education sells online courses to professionals. Many visit the website, become leads after form filling, and are contacted by the sales team. About 30% of leads convert. To boost efficiency, the company wants to pinpoint high-potential "Hot Leads." This targeted approach should increase the conversion rate as the sales team focuses on promising leads.

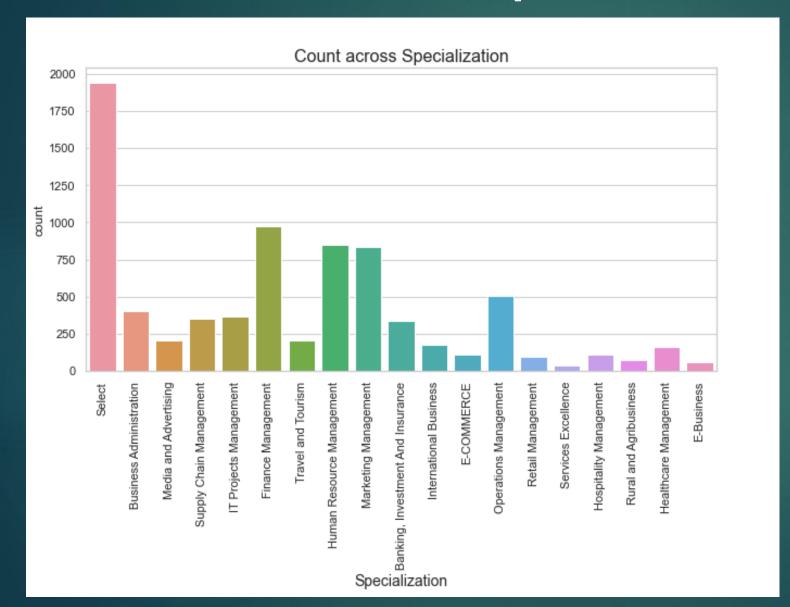
Business Objective

Lead X seeks a model to assign lead scores (0-100) for identifying Hot leads and boosting the conversion rate, aiming for 80%. The model should adapt to future needs, addressing peak times, resource optimization, and post-target approaches. CEO's goal: enhance conversion and efficiency.

EDA – Data Cleaning

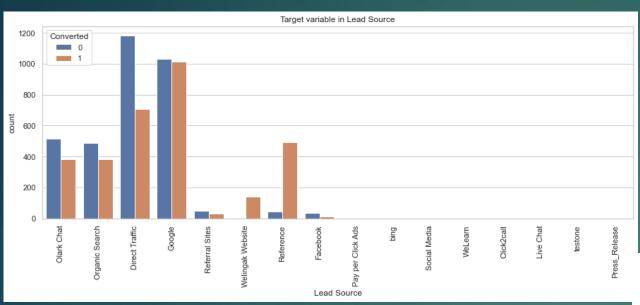


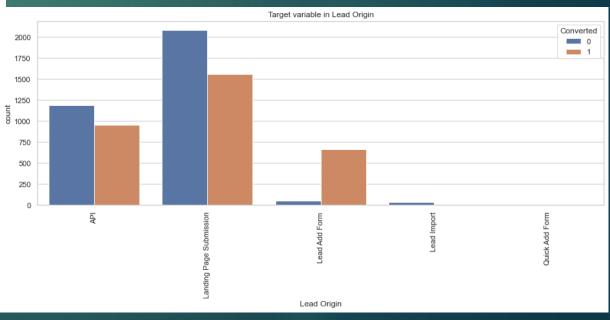
Specialization



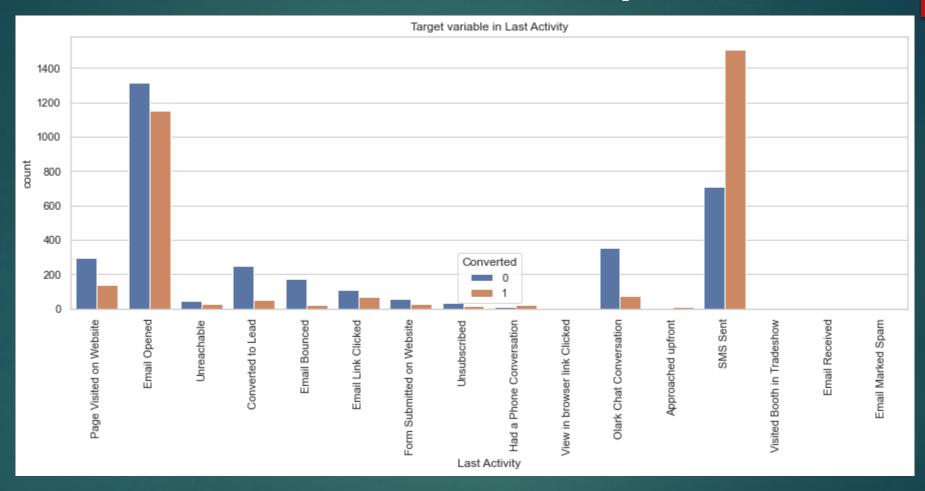
Leads with specializations in HR, Finance, and Marketing management exhibit a strong likelihood of conversion.

Lead Source & Lead Origin





Lead Last Activity



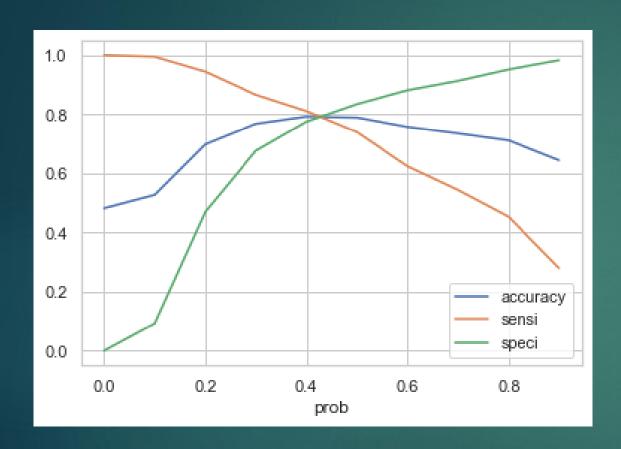
Leads that engage with emails show a high likelihood of conversion, and utilizing SMS also proves beneficial.

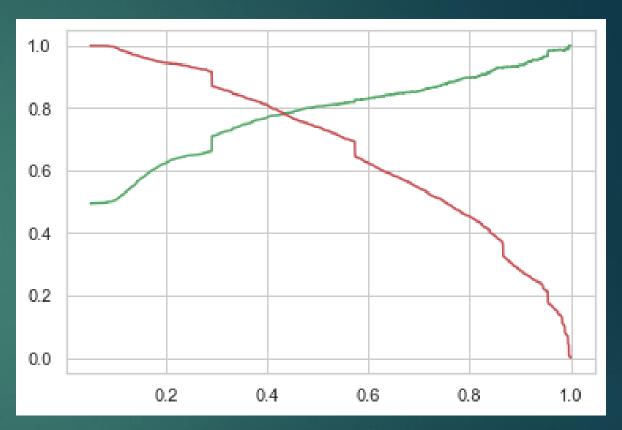
Correlation



There is no correlation between the variables.

Model Evaluation – ROC Curve





The tradeoff between Precision and Recall is at 0.42. Hence, it's reasonable to classify any Prospect Lead with a Conversion Probability exceeding 42% as a hot Lead.

Observations

Train Data:

Accuracy: 80%

Sensitivity: 77%

Specificity: 80%

Test Data:

Accuracy: 80%

Sensitivity: 77%

Specificity: 80%

Final Features list:

Lead Source_Olark Chat

Specialization_Others

Lead Origin_Lead Add Form

Lead Source_Welingak Website

Total Time Spent on Website

Lead Origin_Landing Page Submission

What is your current occupation_Working Professionals

Do Not Email

Conclusion

- Conversion rates for API and Landing page submissions hover around 30-35%, aligning with the average. However, Lead Add form and Lead import exhibit notably lower conversion rates. Consequently, a strategic focus on leads originating from API and Landing page submissions is warranted.
- Google/Direct traffic yields the highest lead generation, with the greatest conversion ratio stemming from references and the Welingak website.
- Leads spending extended time on the website demonstrate an increased likelihood of conversion.
- Commonly observed last activity is email opening, with the highest conversion rate linked to SMS transmission. A significant portion of leads are unemployed, while the highest conversion is seen among working professionals.