



KKbox

Churn Rate Prediction

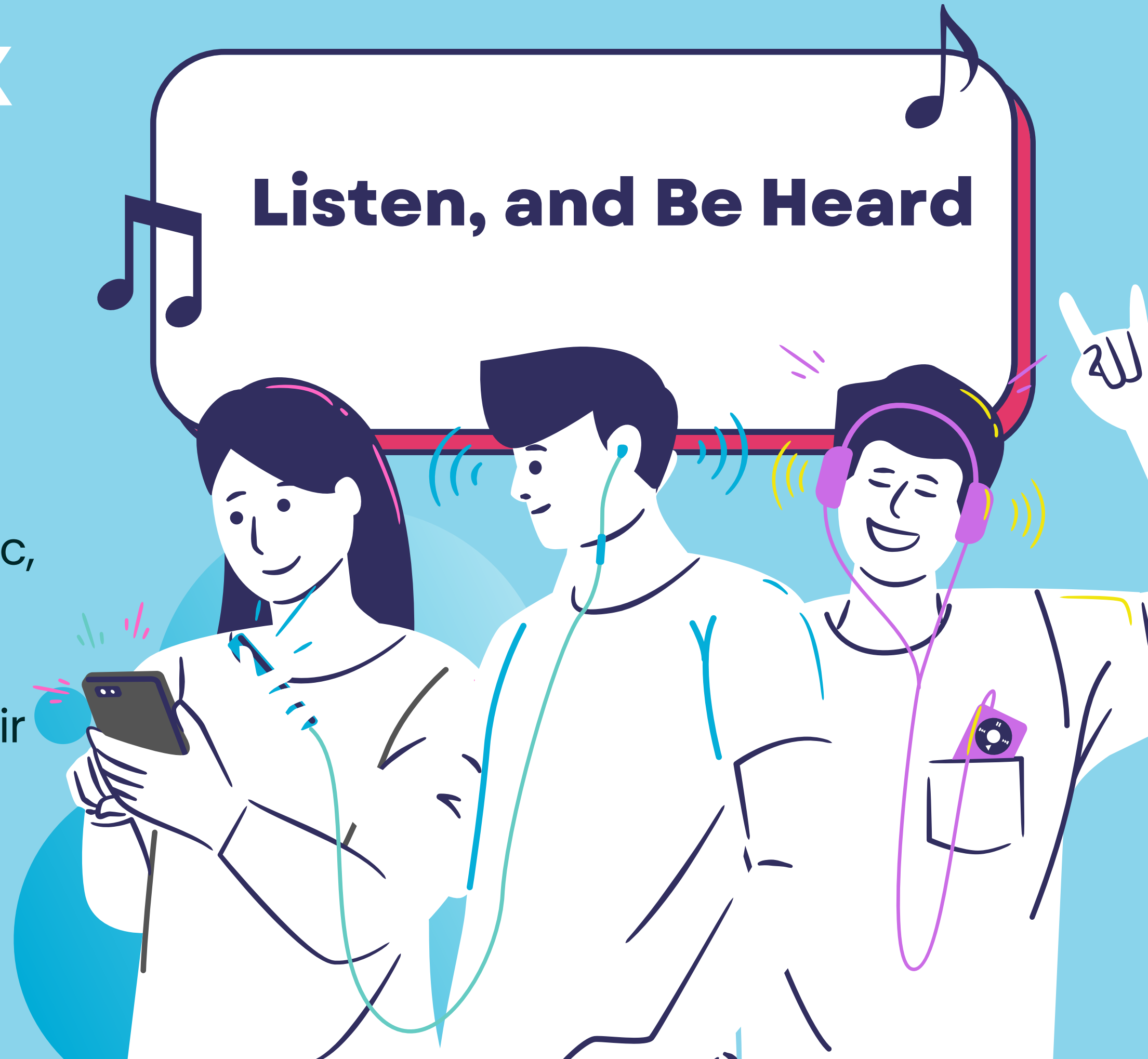
<https://www.kkbox.com/intl/>

Presented By:
Daniela Magiricu



About KKBox Music App

- KKBox is a Taiwanese company offering a music streaming service to millions of people across Asia.
- Leading provider of Asian Pop music, with over 30 million tracks
- Offering an unlimited version of their service to millions of people supported by advertising and paid subscriptions



Business Problem



Business Question

.....

*How can KKBox improve customer retention and minimize revenue loss with **machine learning**?*

.....

KKBox would like to forecast the likelihood of customers discontinuing their subscriptions in the future.

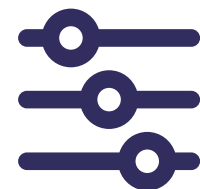
Their business model is dependent on **accurately predicting the churn of their users.**

Business Value KPI's

Future Expected Revenue



Predicting future churn rate helps KKBox gain a better understanding of **future expected revenue**.



Churn prediction is essential for KKBox to understand what **preventative steps** are necessary to ensure **lost revenue** is minimized.

Customer Retention



Cost of acquiring new customers is **5 times** higher than keeping existing ones

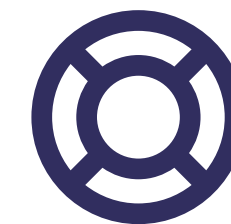


KKBox should focus their efforts towards **retaining existing customers**

Customer Lifetime Value



Churn prediction allows KKBox to **target** individual customers and **prevent** them from discontinuing their subscription.



Churn prediction is also one of the **key components** in determining the lifetime value of customers.

Churn Rate Prediction Impact on Revenue Loss

Predicted Churn Rate: 1.3%

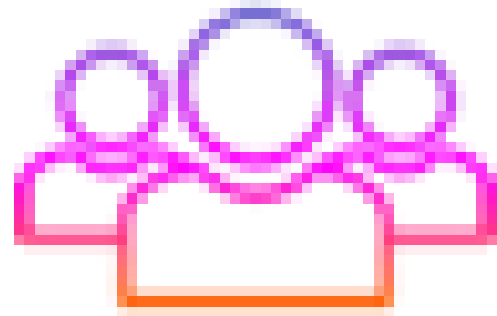
Churn Users:
12,690

Total Users:
970,960

Churn Prediction = **\$ 1.9 million** in
lost revenue within the next 30
days



Data and Cleaning



01

Members Data

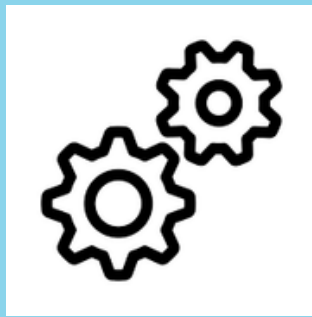
02

Transactions Data

03

User Logs Data

Modelling Process



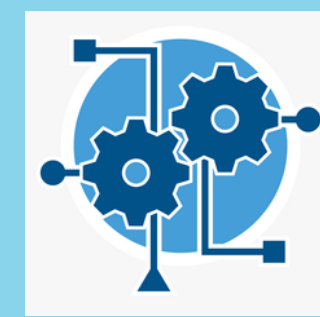
Feature
Engineering



Chi-Squared
Statistical Correlation
Tests for
Multicollinearity



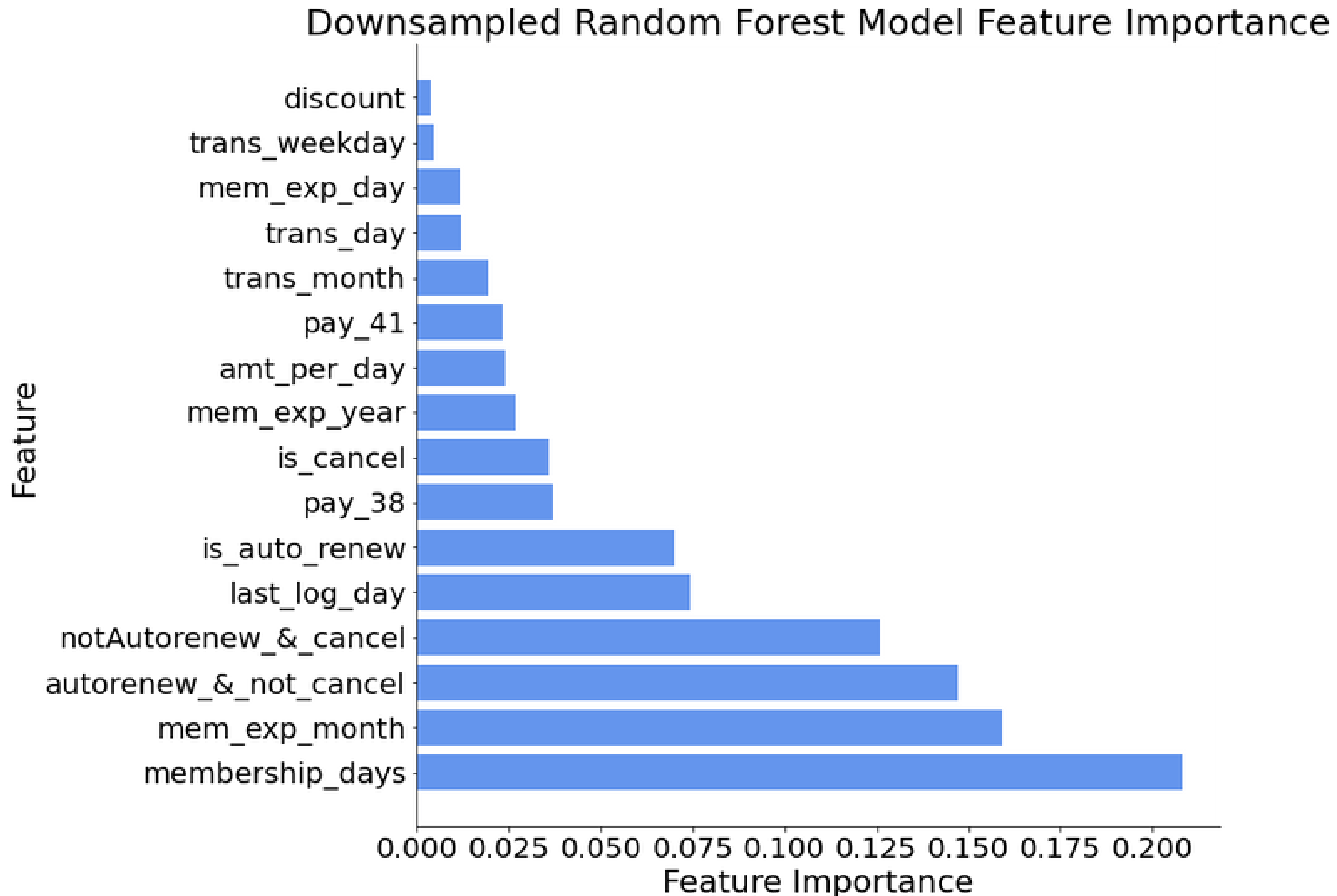
Imbalanced Data:
Upsampling and
Downsampling
Techniques



Logistic
Model and
Random
Forest Model

Random Forest Model Top 15 Important Features

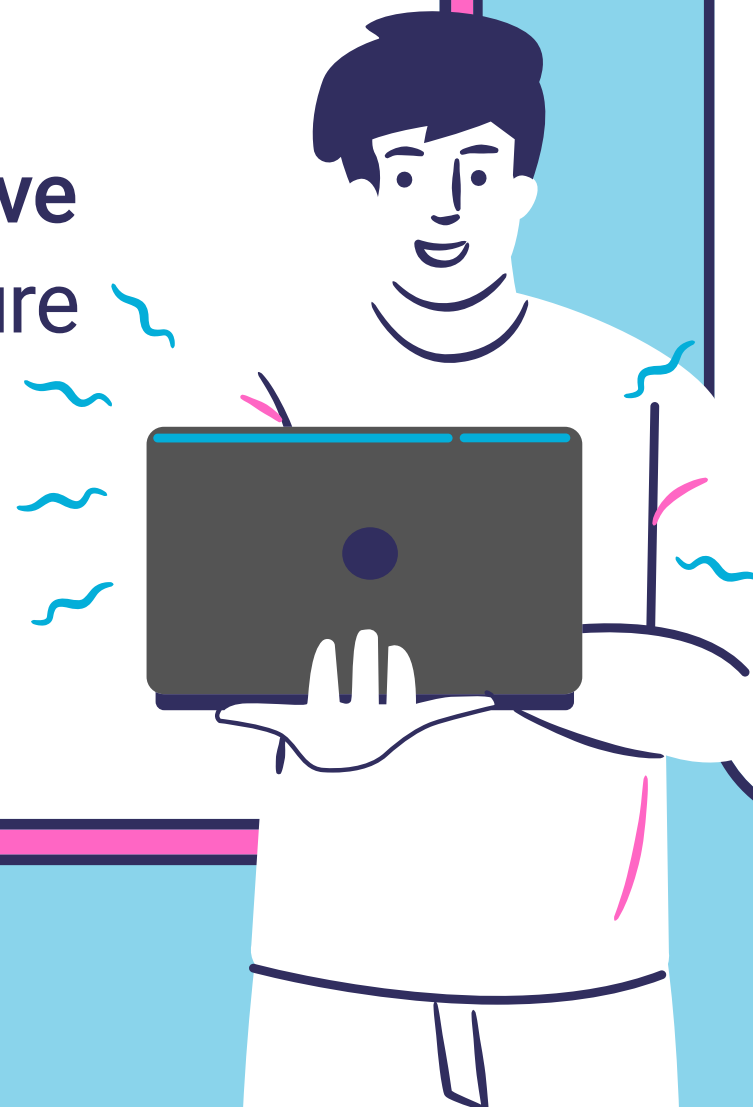
06



Actionable

KKBox can use these results to identify and improve upon areas where customer service is lacking

Marketing team can understand what **preventative** steps are necessary to ensure **lost revenue is minimized**

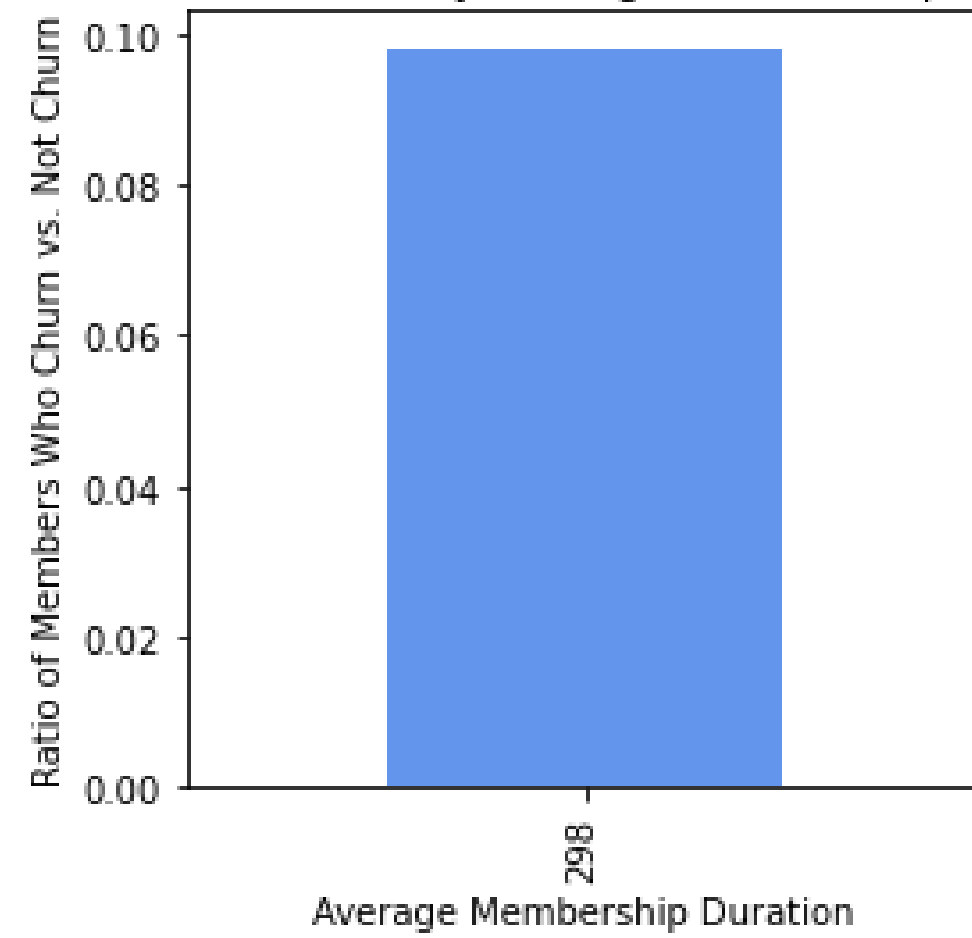


Insights

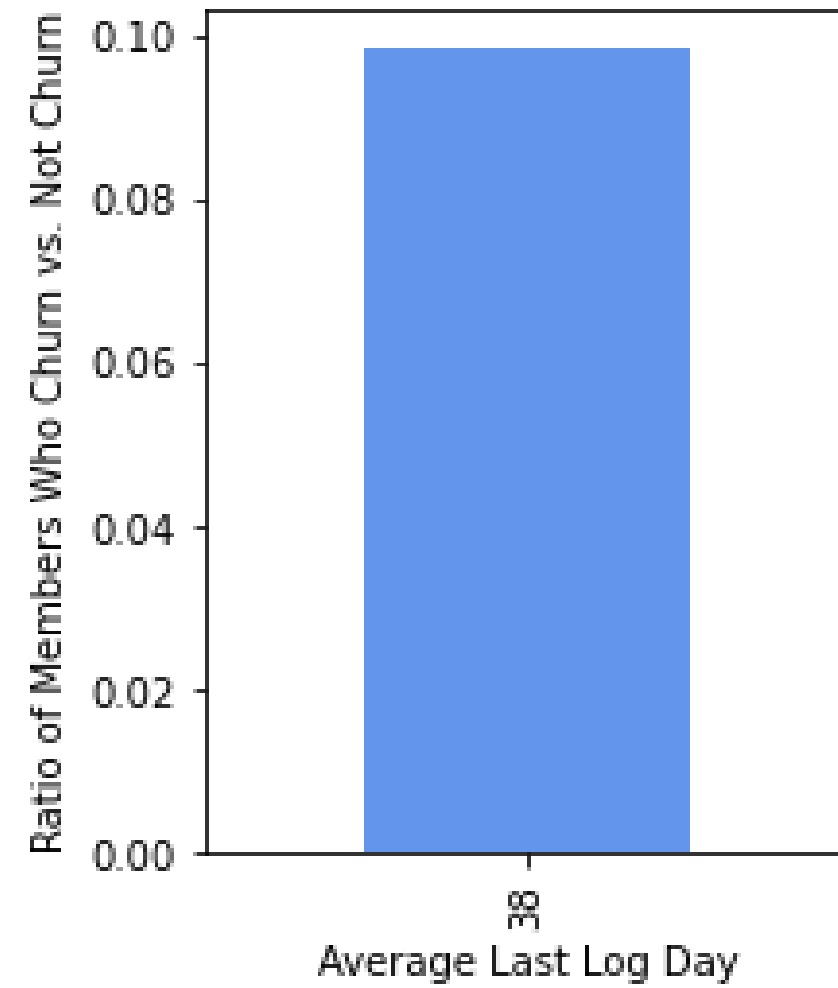
Focus on the **most important features** from our Random Forest Modelling results to make improvements in **customer lifetime value** as well as **customer retention** and **further reduce the churn rate and revenue loss.**



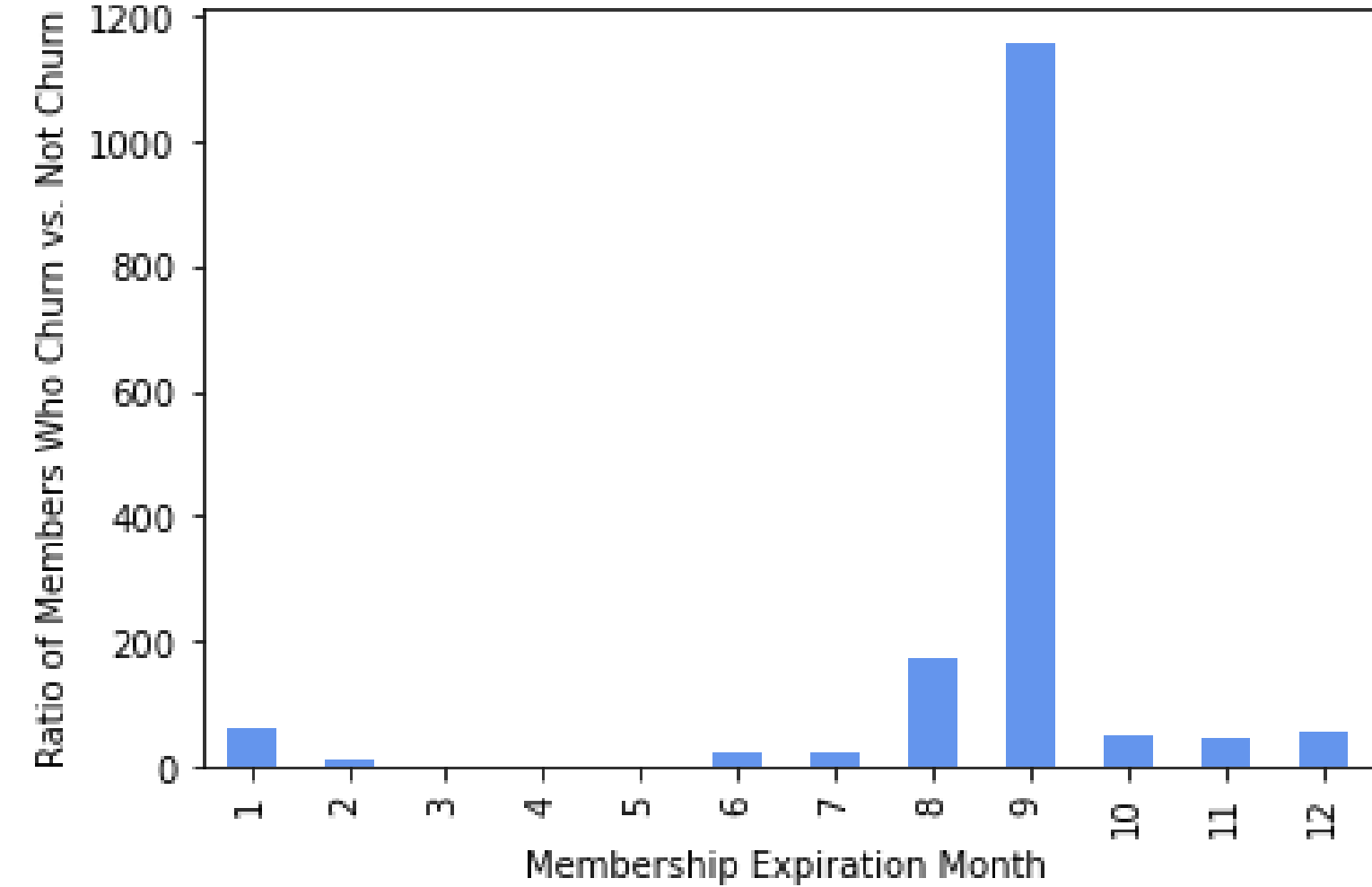
Churn Distribution by Average Membership Duration



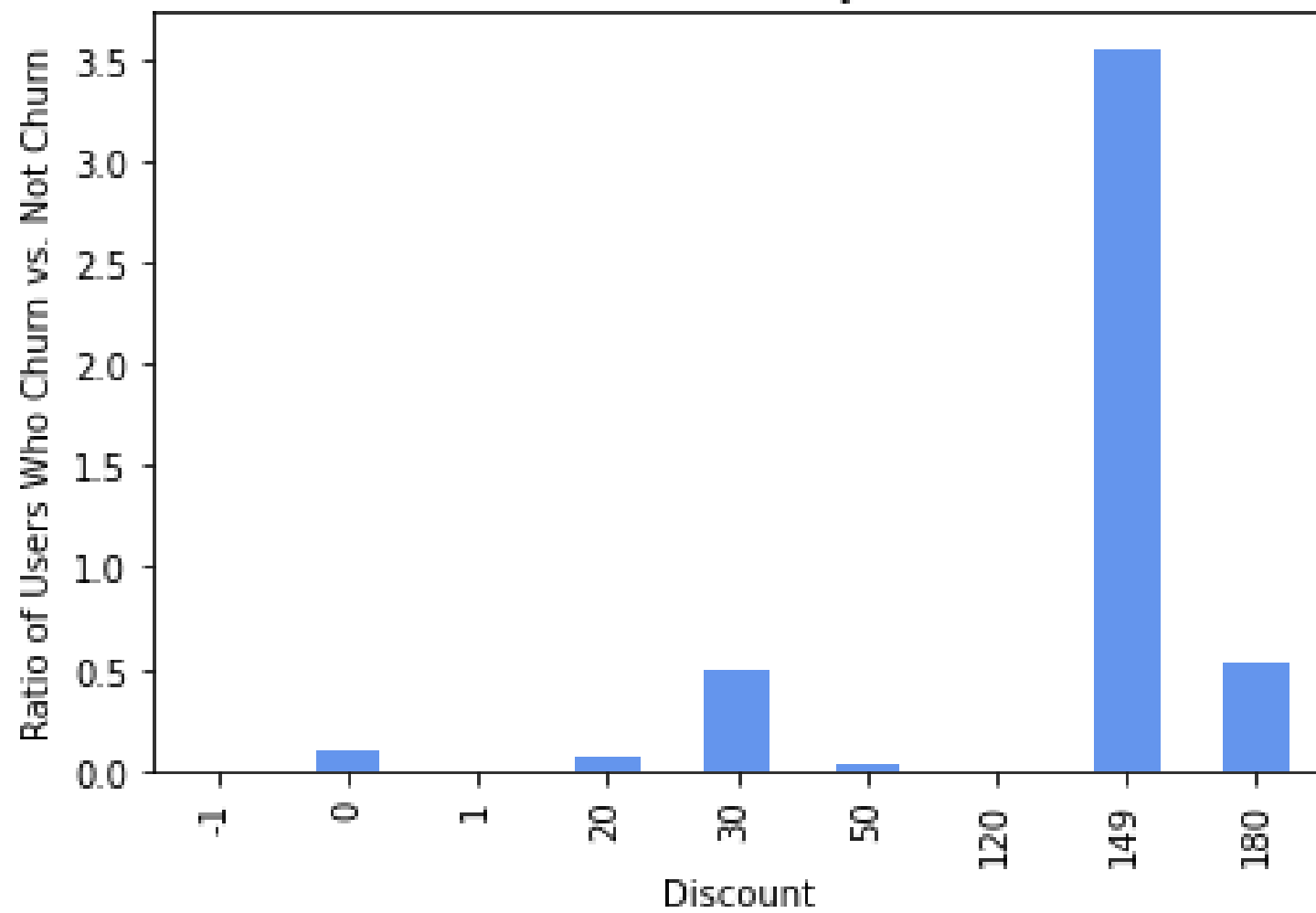
Churn Distribution by Last Log Day



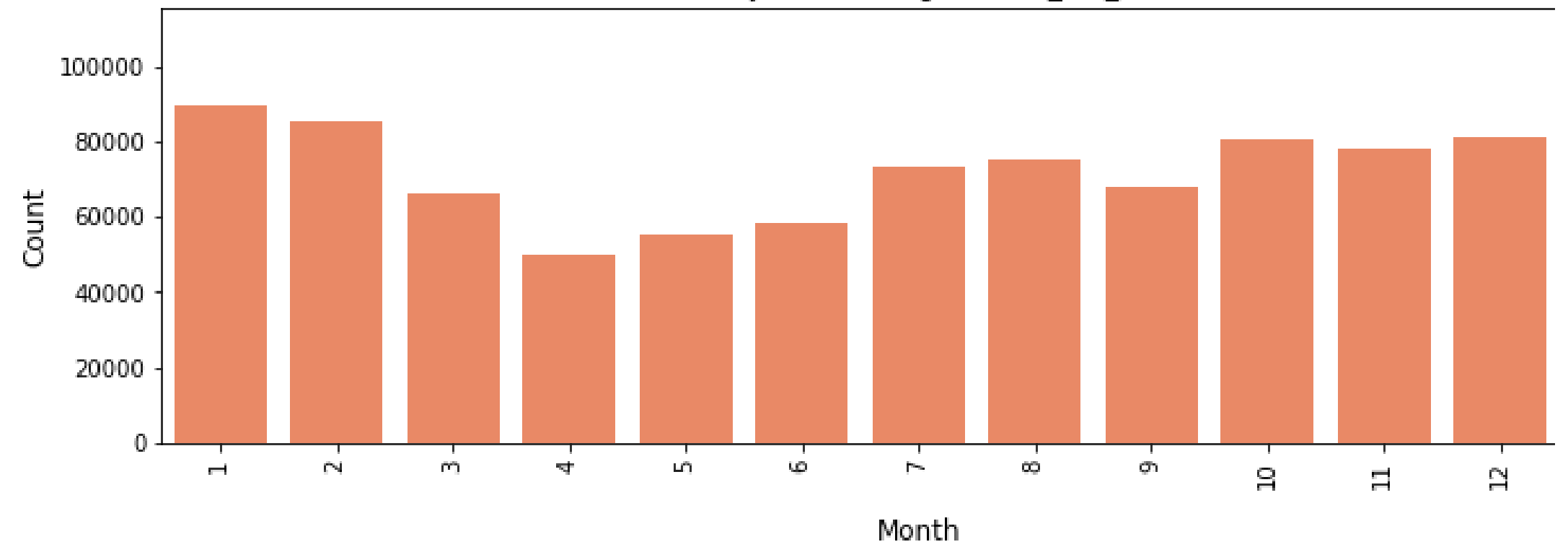
Churn Distribution by Membership Expiration Month

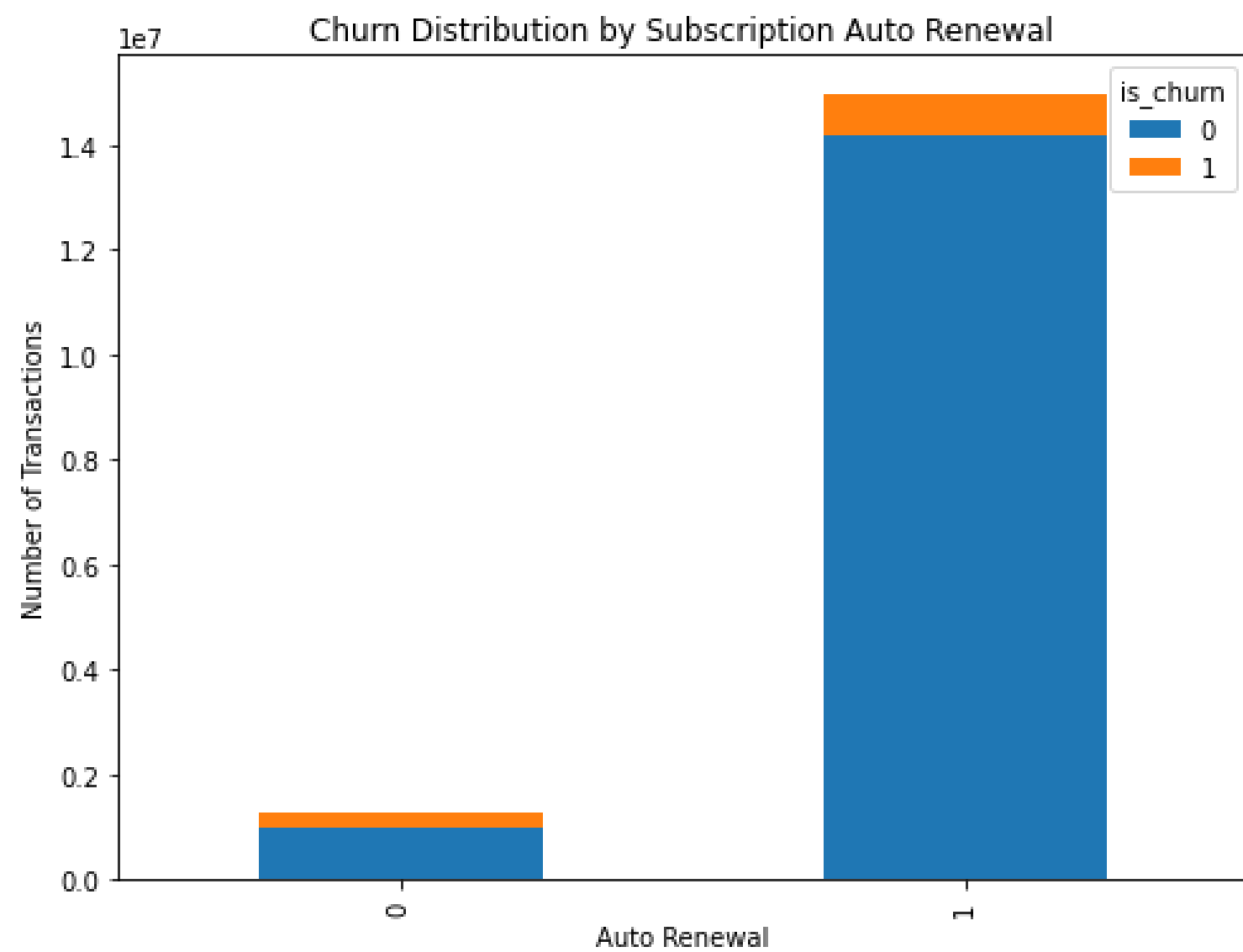


Churn Distribution by Discount



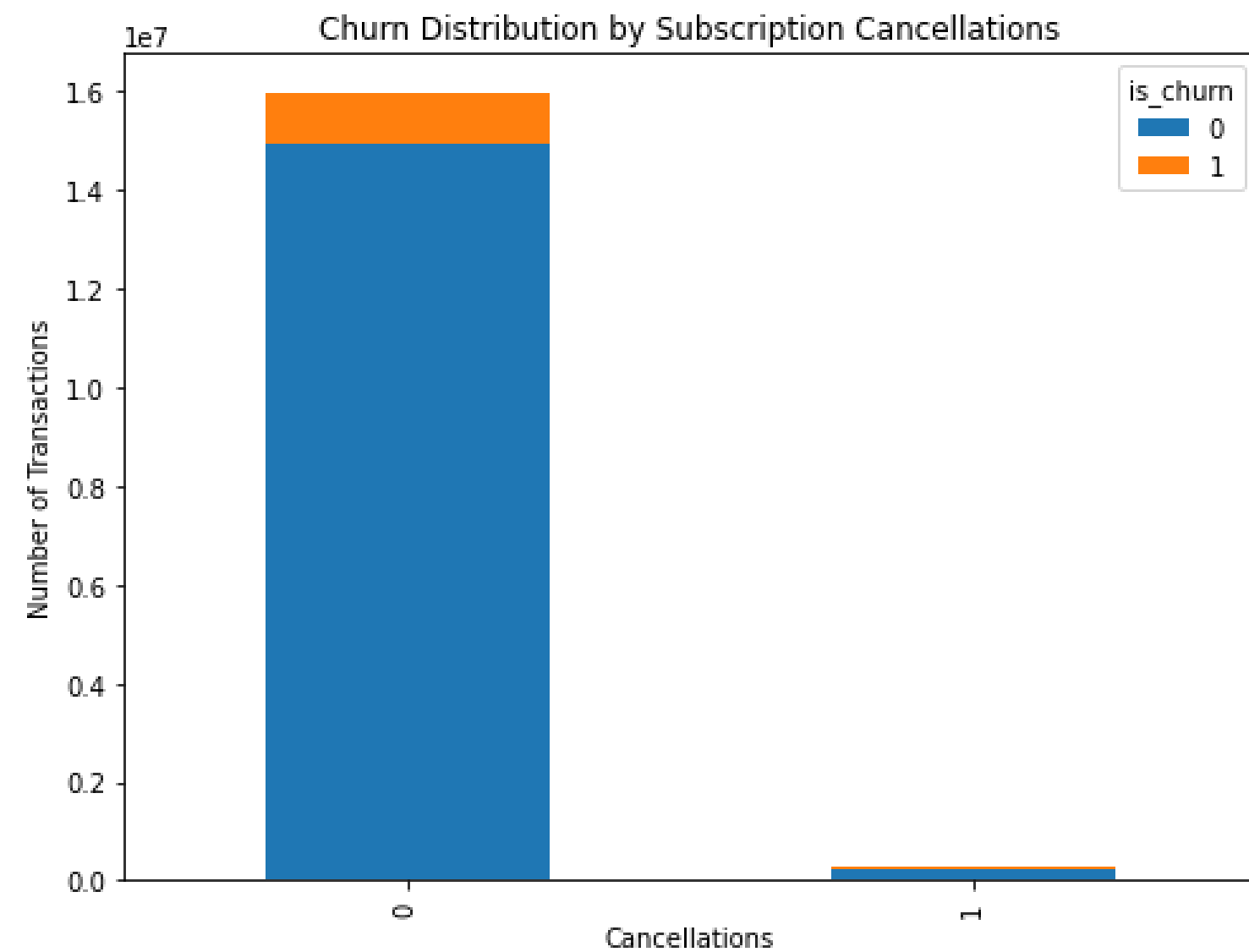
Monthly Trend of registration_init_time





	No Churn	Churn	Ratio
Not Autorenew	964,662	31,7794	0.329436
Autorenew	14,199,457	773,709	0.054489

	No Churn	Churn	Ratio
Not Cancel	14930693	1043633	0.069898
Cancel	233426	47870	0.205076





Thank You

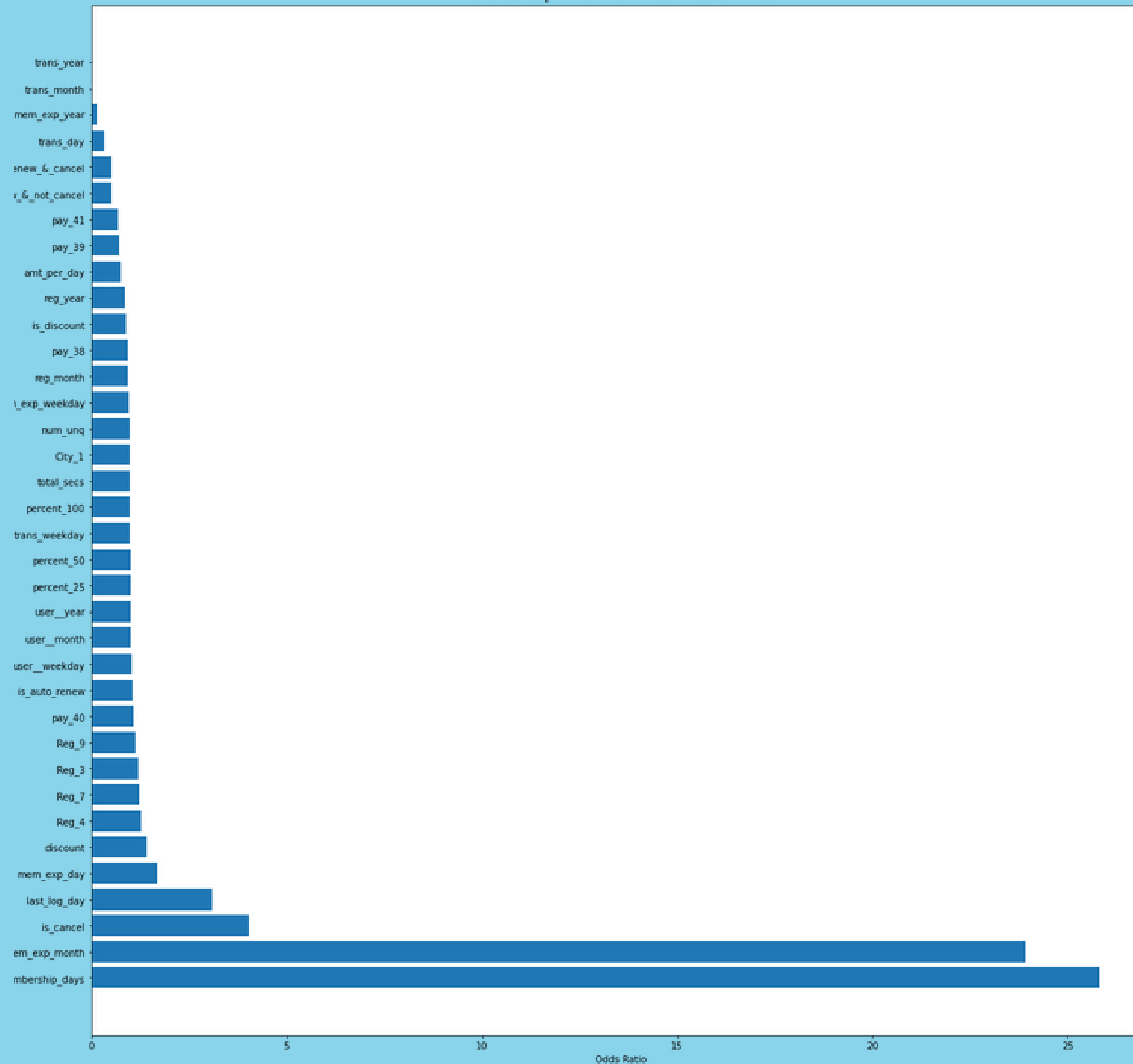
Music is the color for the world
and everything in it

<https://www.kaggle.com/competitions/kkbox-churn-prediction-challenge/data>

Logistic Model Odds Ratio

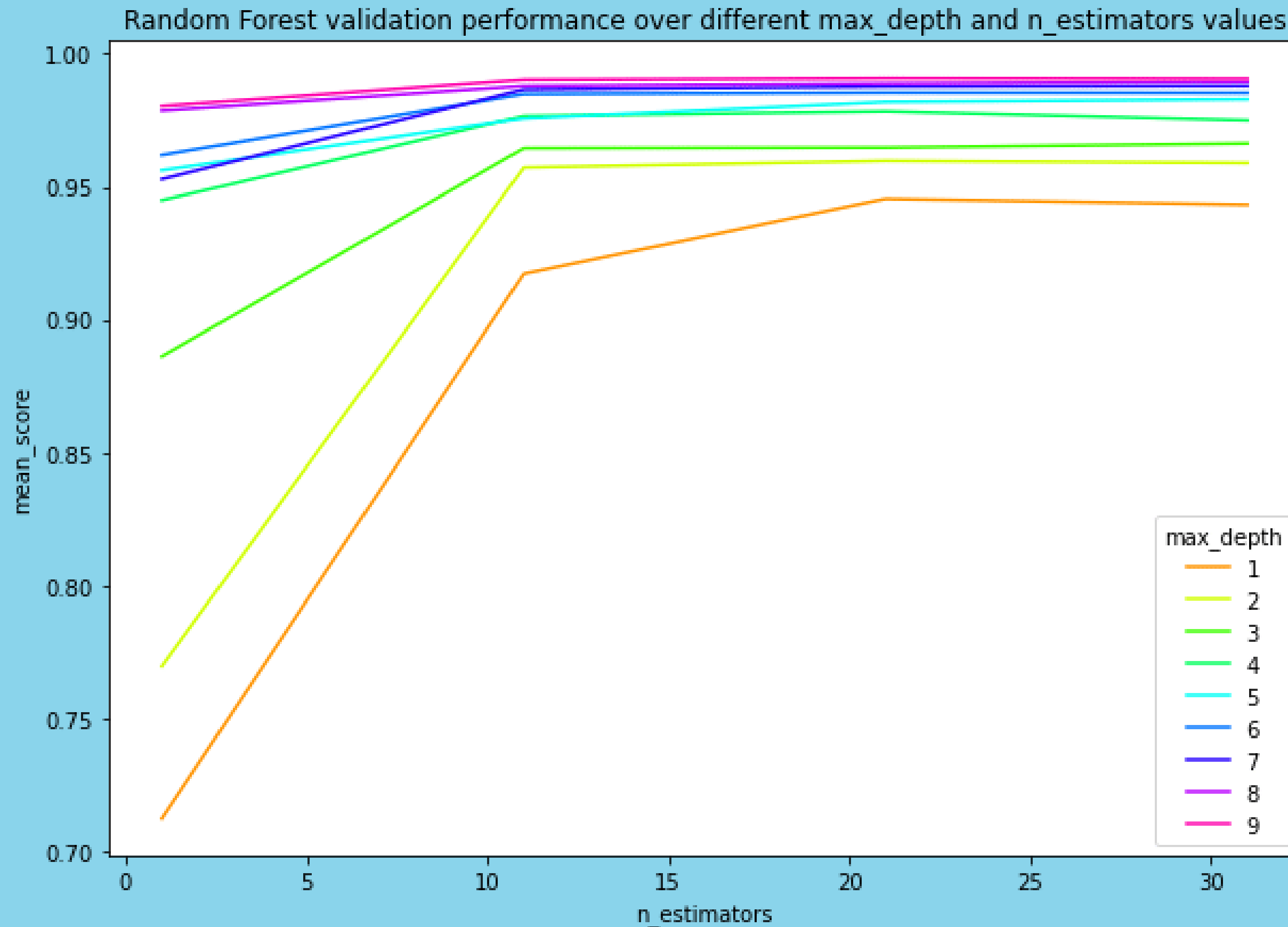
- **Membership Duration**
- Membership Expiration Month
- Cancellation
- Last Log Day

Final Downsampled Odds Ratio on Data with All Features



Random Forest Model Hyperparameter Optimization

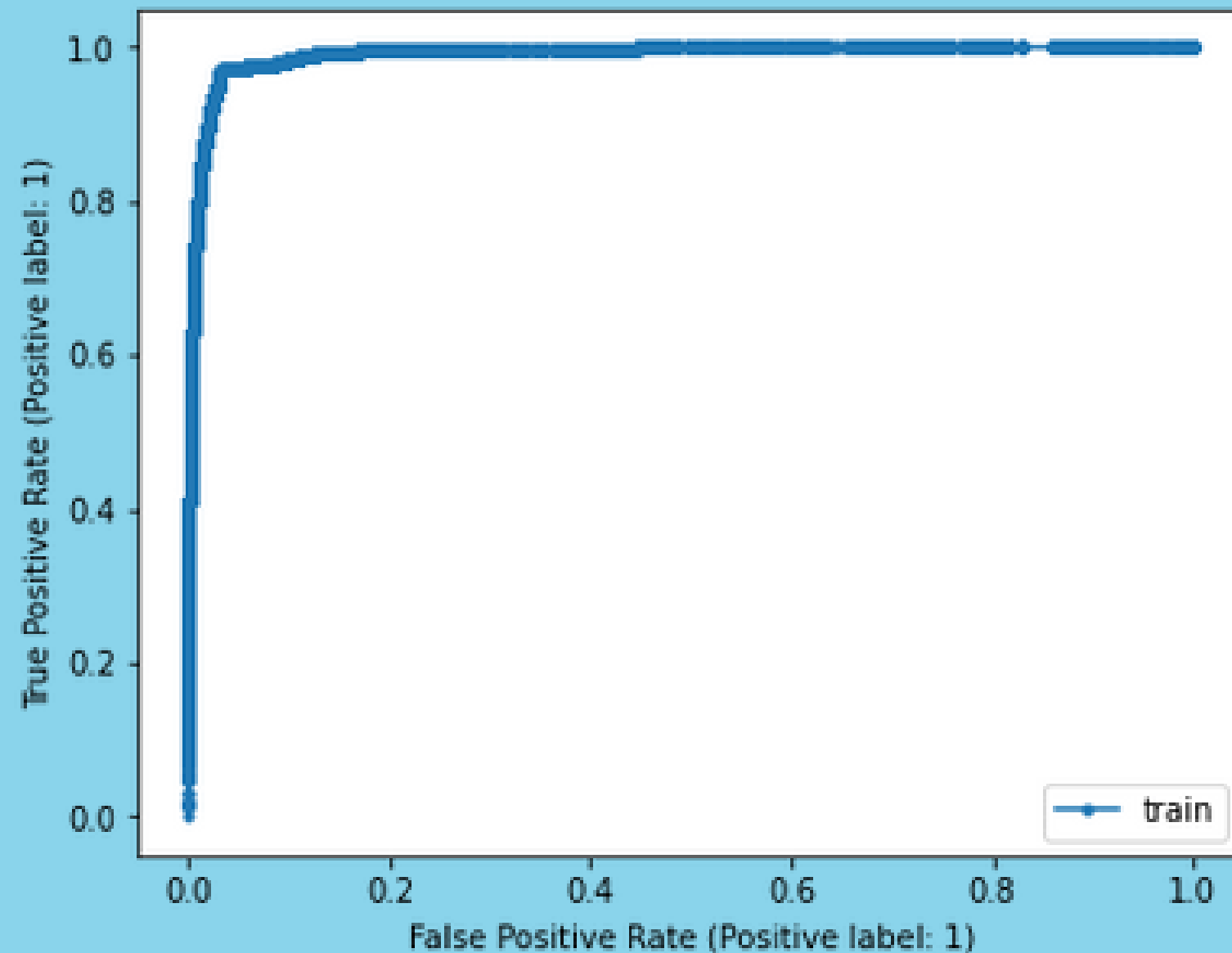
08



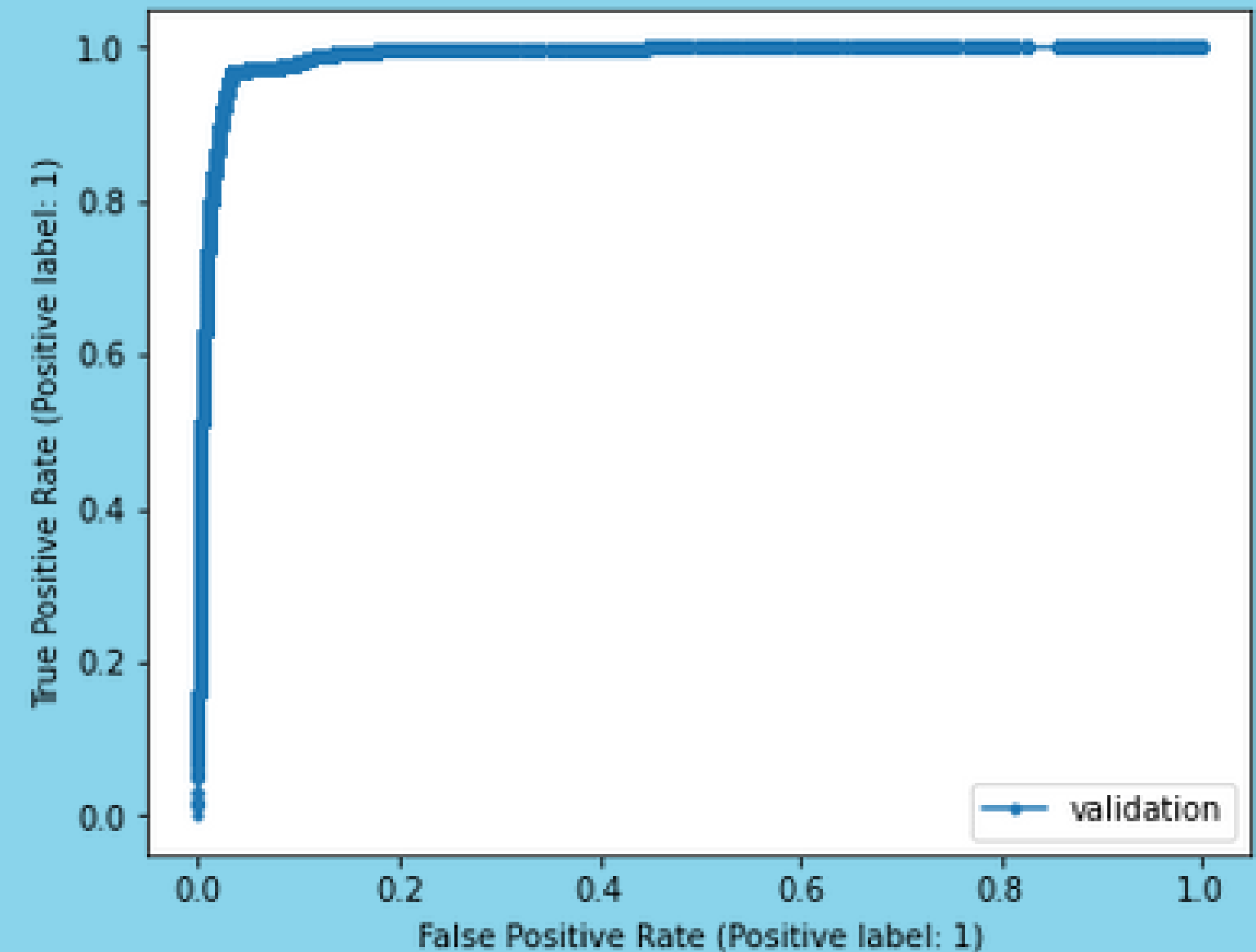
- Max depth 9
- 10 estimators

Random Forest Model: ROC-AUC Curve

09



Train AUC Score: 0.99



Validation AUC Score: 0.99