

Professor Houldsworth MGSC 410 Team 1



### Data Introduction

- Initial data
  - Subscriber information dataset
  - App activity data
- Merged dataset
  - Subscriber and app data merged to align to respective subscriber ID numbers
  - Allowed for cross examination
- Issues w/null values
  - E.g. Free Trial Start Date, Free Trial Expiration, Purchase Amount
  - Data cleaning
  - Data transformation



### What Makes a Customer Valuable?

## Lifetime Vs Limited Subscription

# Lifetime Subscription

**Unlimited Languages** 

\$199

One-time payment

Average Lifetime Value of \$173.21 (After discounts)

## 12 Months

\$10.50 per month

Regularly \$13.99

\$126 billed as one payment

Average LTV of \$81.40 (Multiplying average monthly payment & months Subbed)



# Preliminary Data Cleaning



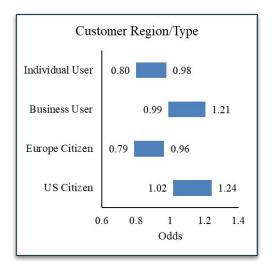
Converted All 45 Currencies to USD



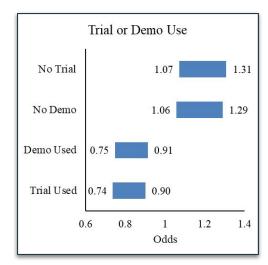
Generated Months
Subbed From Start and
Expiration Dates

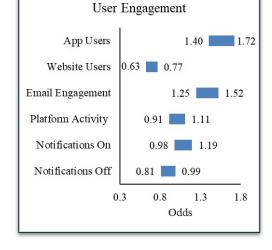


# The Makings of a Lifetime Subscriber









Individual & European Users are less likely to obtain lifetime subscriptions

App Users have 2.23 times higher odds of being a lifetime subscriber VS Website Users



### The Most Valuable Limited Subscriber





- All Languages, Notifications & Renewal On, US Citizen, 9 Months Subbed, Business User, Trial Used
- Purchase Amount =  $\sim$  \$164.80

Least Valuable

- English Language, Renewal Off, Consumer User, European Citizen,
   9 Months Subbed, Trial Not Used
- Purchase amount =  $\sim$  \$17.14



# Spotting the Cash Cow

- Engaged Customer = Great Customer?Does it even matter for Rosetta Stone?
- Engaged Customer Bases Drives...
  - 22% increase in cross-sell revenue
  - o 38% increase in upsell revenue



<sup>&</sup>quot;Research Summary: Why Live Engagement Marketing Supercharges Event Marketing." Constellation Research, Inc. Accessed May 6, 2024.

https://www.constellationr.com/blog-news/research-summary-why-live-engagement-marketing-supercharges-event-marketing.



# **Engagement Scores**

- Determines customers likely to buy additional products
  - Lifetime Customers VS Engaged
  - User type VS Engaged
  - Country/Region VS Engaged

Engaged Demographic => Extend Trial Period!

#### **User Action Weights**

CLICK	1
OPEN	1
COMPLETED COURSE	15
APP 'OTHER' ACTION	4
APP LAUNCH	2



### **Understanding Subscriber Segments at Rosetta Stone**

**Objective:** To provide a comprehensive analysis of the different subscriber segments at Rosetta Stone, identifying key characteristics and behaviors that define each group.

**Approach:** Utilizing subscriber data, we've segmented the user base into four distinct clusters based on their engagement and spending habits.

#### **Overview of Clusters:**

**Regular Engagers:** Active users with moderate spending and consistent app use.

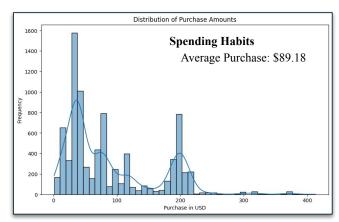
Moderate Engagers: Low engagement across all platforms.

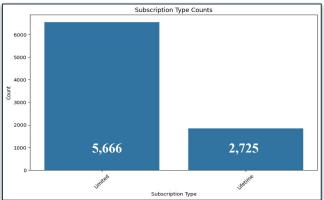
**Super Engaged Users:** High engagement in courses and app launches with significant interaction.

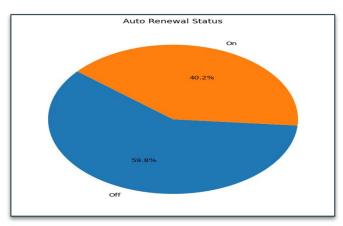
*High-Spending Users*: Major contributors to revenue with high purchase values and substantial email interaction.

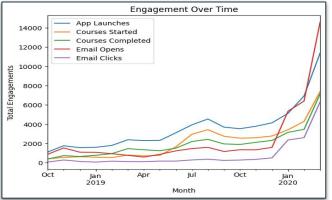


### **Cluster 0 Overview: Regular Engagers**



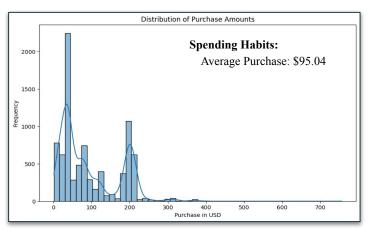


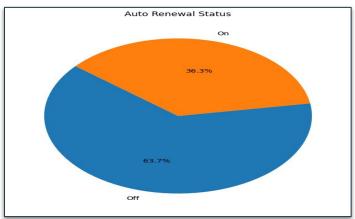


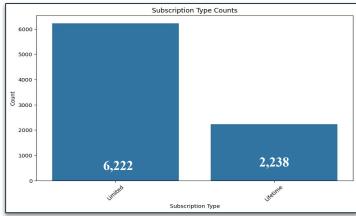


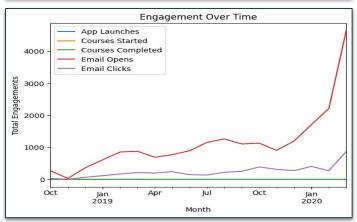
### **Cluster 1 Overview: Moderate Engagers**





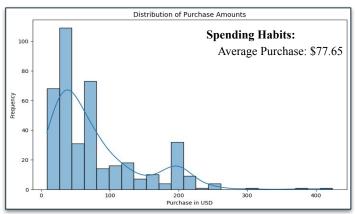


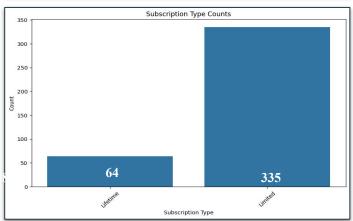


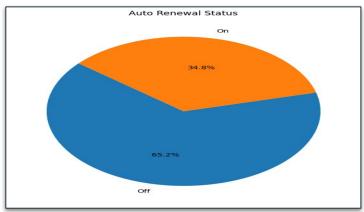


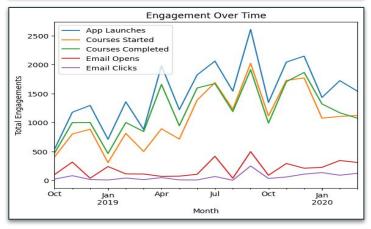
### **Cluster 3 Overview: Super Engaged Users**





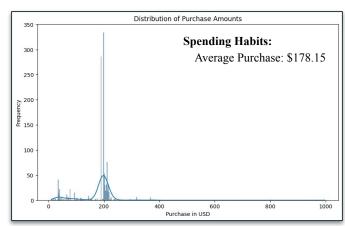


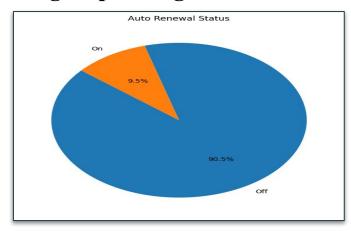


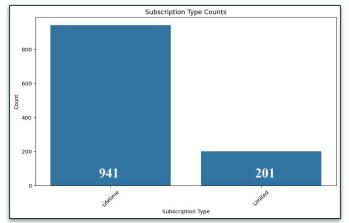


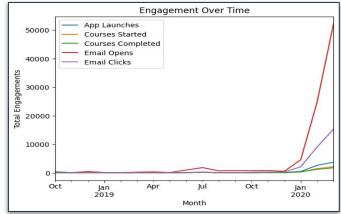
### **Cluster 4 Overview: High-Spending Users**





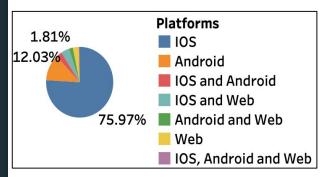


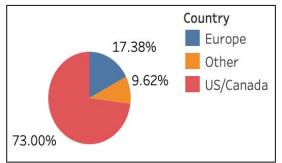


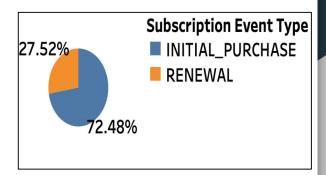


## Churned Subscriber Profiles









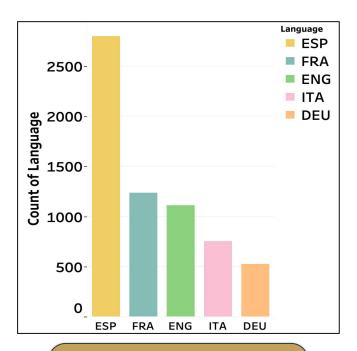
76% of Churners were solely using ios

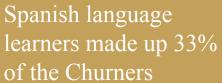
73% of Churners are from US/Canada

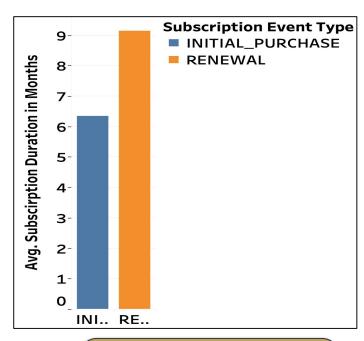
73% of Churners were first time subscribers

## Churned Subscriber Profile





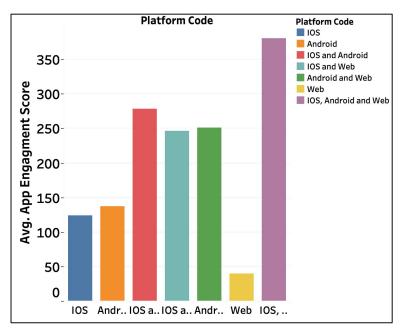




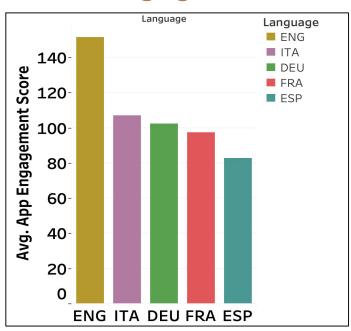
Initial Purchase buyers churned 3 months quicker than Renewals

## Potential Barriers to Deeper Subscriber Engagement









Spanish Language subscribers are one of the least engaged



## Conclusion (Additional Business Opportunities)

- LTV of Lifetime: \$173.21
- LTV of Limited: \$81.40
  - Average subscription length: 8.89 Mo
  - Average \$ per month: \$9.16
- Lifetime customers are far more valuable
  - Limited subscriber = Lifetime
     Subscriber after 19 months





### Recommended Actions

- 1. Heavily Promote Lifetime subscriptions to maximize Revenue
- 2. Extend Trial/demo periods to improve engagement for Limited Subscribers
- 3. Maximize Limited subscriptions LTV by selling to engaged demographics



# **Executive Summary**



#### **Lifetime Value**

Lifetime Subscribers offer a higher LTV than Limited but the most valuable Limited subscribers can provide a similar LTV



#### **Engagement**

Engaged customers boost conversions, loyalty, and advocacy, enhancing ROI significantly.



#### Segments

Segmented into 4
clusters: Regular,
Moderate,
Super-Engaged &
High-Spending Users



#### Churners

Sole platform users and spanish language users are the biggest churners and have the lowest engagement