App Store Data Challenge

By: Jason Yang

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Introduction



Jason Yang

Data Science Manager – Urgently Roadside

1 year: ranking & pricing model deployment
 Data Scientist – InMarket Media

• 3 years: audience segmentation, propensity models, incremental lift, campaign analytics

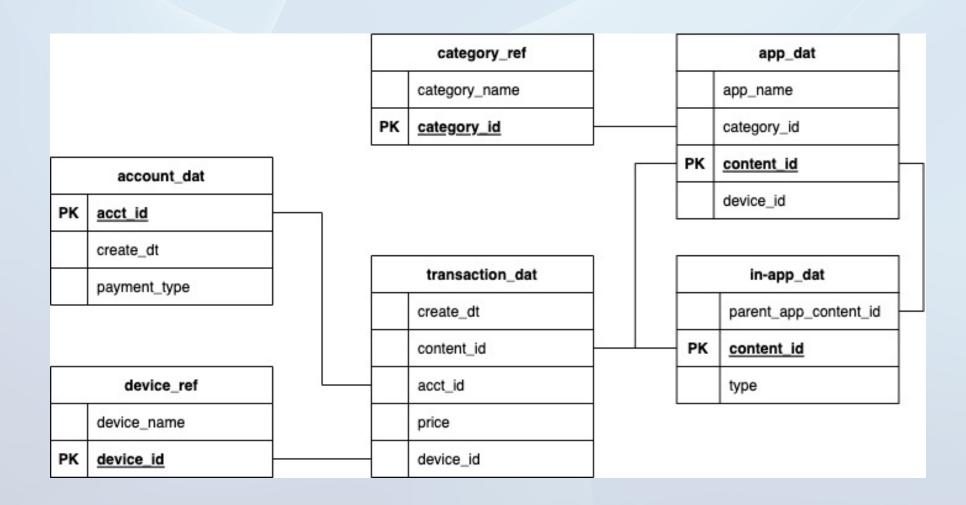
Product Support Engineer – OSIsoft (AVEVA)

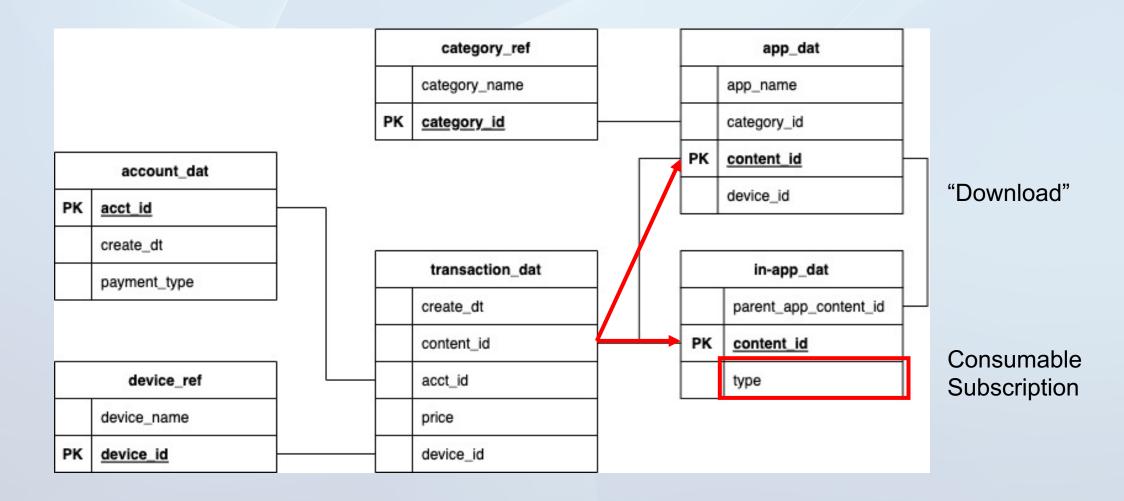
• 2 years: time-series database tech support

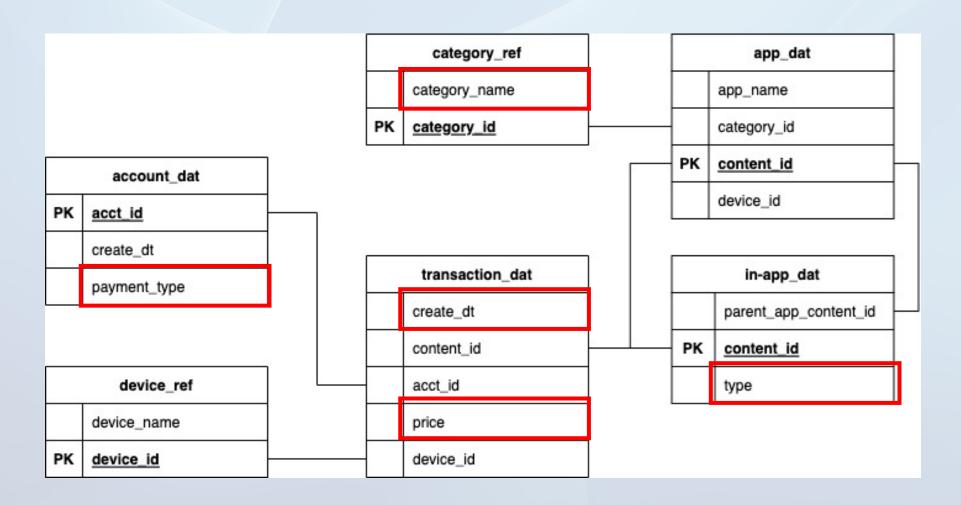
Hobbies: marathon, tennis

Executive Summary

- Background on data
- Recommendation: Opportunity to lower or eliminate the cost barrier to PMOF apps, especially for Games category
- July 4th increased consumable transaction by 12.1%
- Data quality: "unknown" payment type & data gap
- Extra
 - PMOF & Free only account creations
 - Unsupervised account clustering

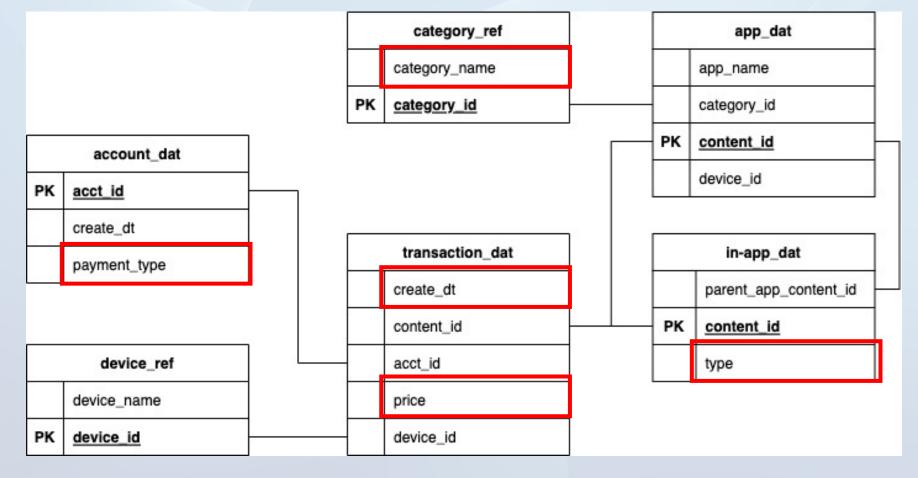






Entertainment
Games
Photos & Videos
Social Networking
Utilities

Free only PMOF "unknown"



Assumptions

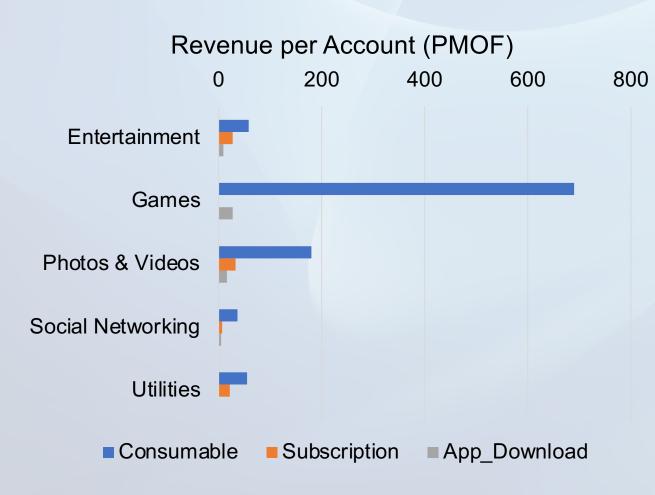
- Real App Store data from June 2016 to September 2016
- Apple Arcade (2019) subscription not available
- "Price == 0" app transactions by PMOF accounts are part of a pilot project
 - Term: "free app download"

Objective: Increase access to great apps and content at an affordable price

Why?

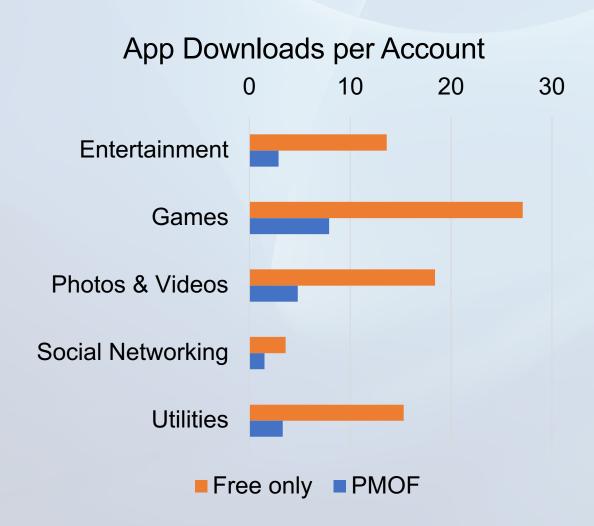
- Great user experience
- Support developers to create great apps

Pay to Win



- Users are paying a lot of money in Games apps
- Pay-to-Win mechanisms:
 - Tasks take a long time
 - Pay-only content
 - Unable to make progress
- Impossible to without paying
- Great content, but not affordable

Free, But Not as Good?

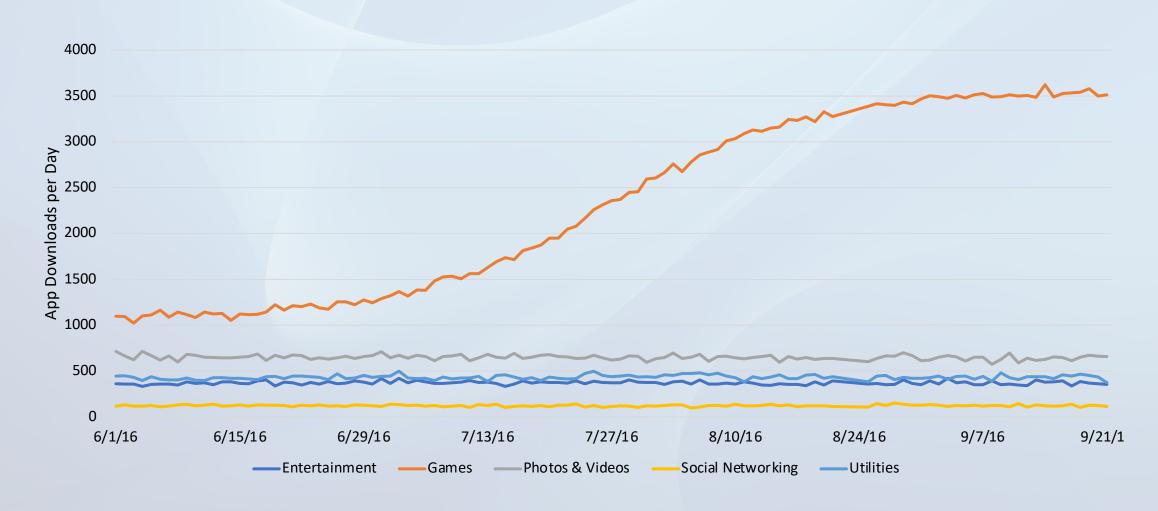


- Free accounts download at least 2x more apps than PMOF accounts
- Potential bad experiences:
 - Lots of Ads
 - Unsupported App (no revenue)
 - Bad App
- Affordable, but mediocre

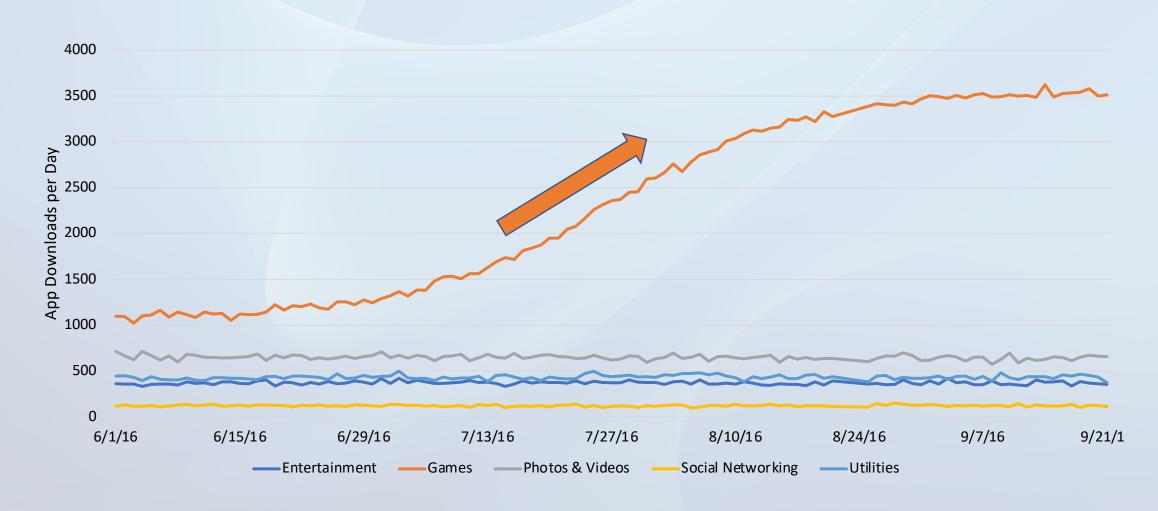
Pilot Project

- Remove the download cost barrier to 13 Games apps for PMOF accounts
- Why? Cost limits both developers and users. Removing the download cost will help us observe the potential of paid apps
- Create an environment to
 - Access great apps at an affordable price
 - Support developers to create great apps

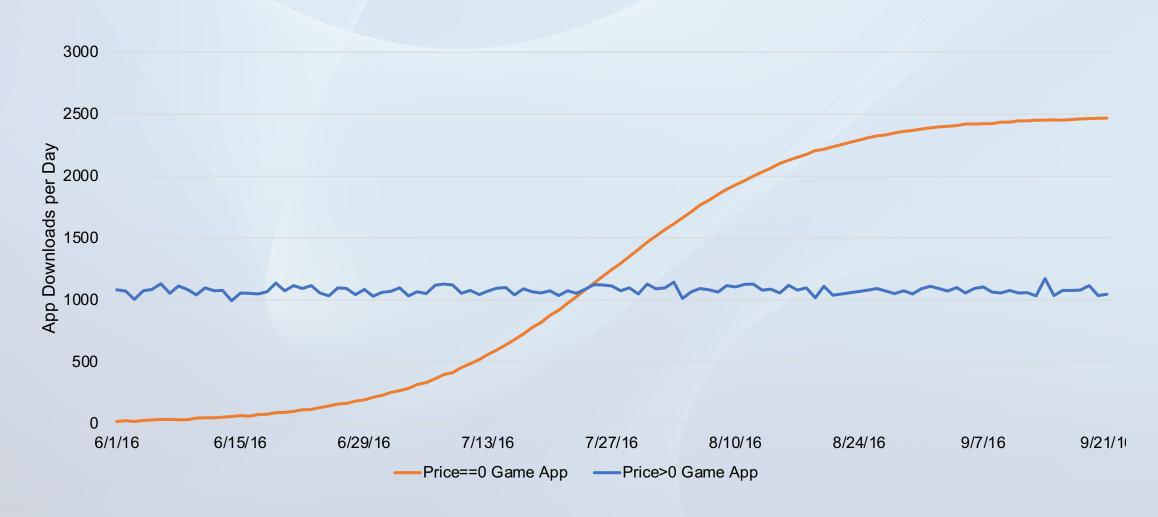
Daily Downloads Time Series (PMOF)



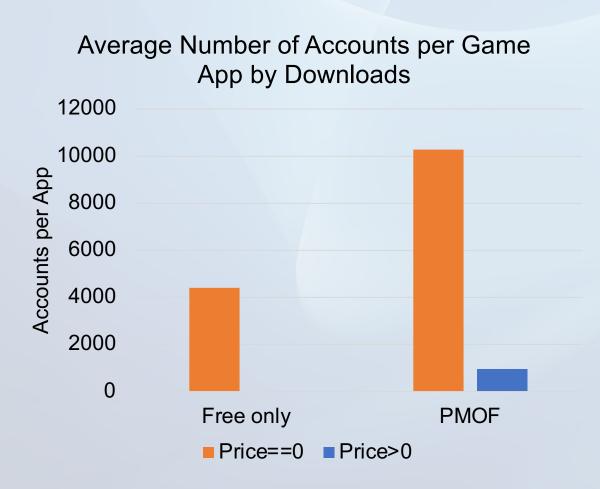
Daily Downloads Time Series (PMOF)



Game App Daily Downloads (PMOF)



Game App Comparison



 A PMOF app without cost barrier has 10x more accounts

 Lowering cost barrier to PMOF apps can increase usage to be above Free only apps

Takeaway 1

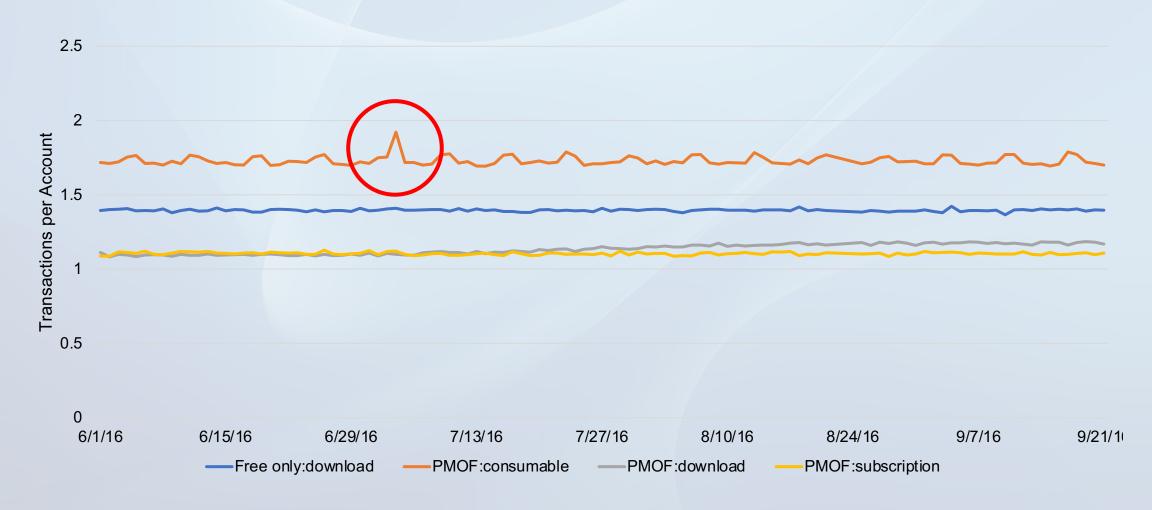
- Objective: Great apps deliver great content at an affordable price
- PMOF apps have great content with high usage cost
- Free only apps have mediocre content

Recommendation

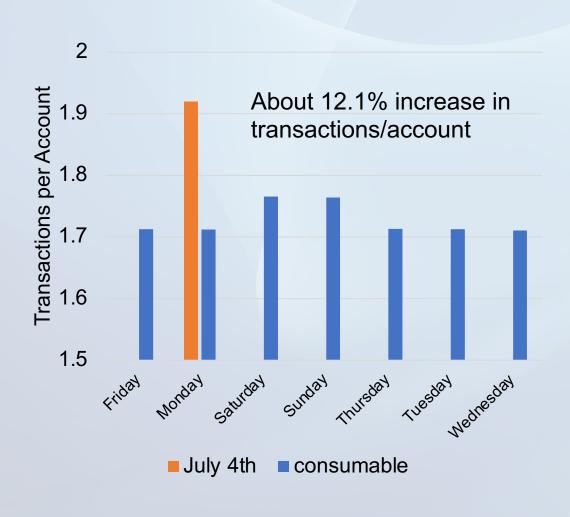
 Lower or eliminate the cost barrier to PMOF apps, especially for Games category

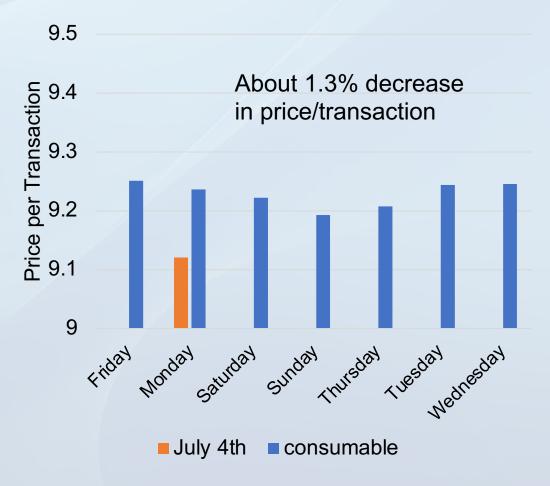
July 4th Spike

July 4th - Only Holiday Spike



Consumable Transactions (PMOF)





Takeaway 2

- We observed a spike in consumable transactions on July 4th.
- No other spikes in other holidays
- Does not appear to be due to pricing discounts

Recommendation

 Inconclusive. Need to find other variables to explain the spike on July 4th

Data Quality Issues

- 25 acct_id's without payment_type
- data gap on 2016-08-22 to 2016-08-24

| n_acct |
|--------|
| 14993 |
| 14982 |
| 25 |
| |

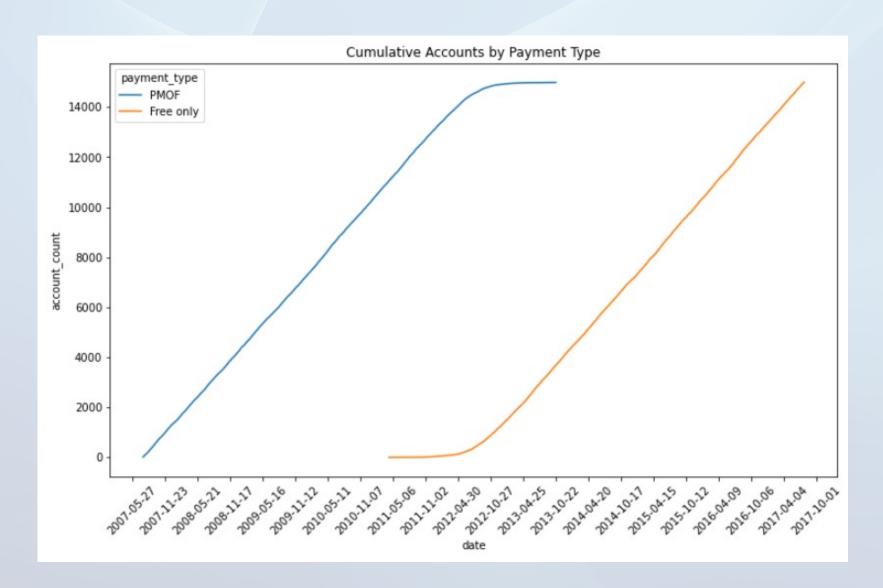
| | create_dt_transaction | n_transactions |
|----|-----------------------|----------------|
| 79 | 2016-08-19 | 16146 |
| 80 | 2016-08-20 | 17011 |
| 81 | 2016-08-21 | 17424 |
| 82 | 2016-08-25 | 16184 |
| 83 | 2016-08-26 | 16245 |
| 84 | 2016-08-27 | 17304 |

Future Analysis

I want to do a deeper analysis with more data including:

- App usage metrics like crashes, duration, and rating
 - Better define what a "good" app
- Account attributes like age and demographics
 - Audience segmentations for accounts

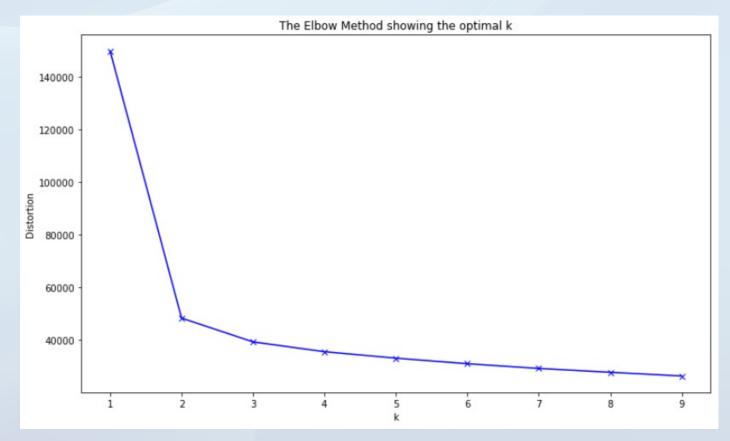
Extra: Account Creation



Extra: Account Clustering

| | pred_k | payment_type | acct_cnt |
|---|--------|--------------|----------|
| 0 | 0 | Free only | 28 |
| 1 | 0 | PMOF | 14982 |
| 2 | 1 | Free only | 14965 |

| category_name acct_id | Entertainment | Games | Photos & Videos | Social Networking | Utilities |
|--------------------------|---------------|-------|-----------------|-------------------|-----------|
| 00028709c8d435ff | 10.0 | 27.0 | 19.0 | 1.0 | 14.0 |
| 0005a4d77127fde7 | 6.0 | 16.0 | 3.0 | 0.0 | 1.0 |
| 0005c296f2605c08 | 4.0 | 17.0 | 4.0 | 1.0 | 1.0 |
| 00082ad3dc50a70d | 15.0 | 30.0 | 17.0 | 3.0 | 11.0 |
| 00085ff73786df4d | 3.0 | 14.0 | 2.0 | 2.0 | 2.0 |



Questions & Answers

Thank you