## Final Project Presentation

Presented by: Toni Afani

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the streaming industry.

In today's digital landscape, understanding Subscriber

behaviour is paramount for businesses, especially in

What are we talking about?

# Subscriber Segmentation and Behaviour Analysis in a Streaming Platform







hulu

### Objective

The project Subscriber Segmentation and Behavior Analysis in a Streaming Platform aimed to gain actionable insights from user data to optimize strategies, enhance user experiences, and maximize revenue.

## Methodology

Data Collection: We collected a comprehensive dataset containing user attributes, subscription details, engagement metrics, and more.

Subscriber Segmentation: We applied K-means clustering to categorize users into distinct segments based on demographic and engagement features and utilized Principal Component Analysis (PCA) to reduce the data's dimensionality.

Behaviour Analysis: Explored subscription preferences, monthly revenue, watch time, and more within each user segment.

**Cohort Analysis:** Analysed user behaviour over time, focusing on **revenue trends**, and **churn** patterns within cohorts.

**Revenue analysis:** Investigated the revenue distribution within each cluster to identify potential opportunities for **revenue optimization**.

### Data Features

**User ID** 

A unique identifier for each user in the dataset

Age

Represents the age of the user.

**Subscription Type** 

Represents the type of subscription the user has, categorized as Basic, Standard, or Premium. Device

Represents the type of device used by the user, such as Smartphone, Smart TV, Laptop, Tablet, etc.

**Monthly Revenue** 

Indicates monthly revenue generated from each user's subscription.

**Plan Duration** 

Indicates the duration of the user's subscription plan, such as 1 Month.

**Join Date** 

Represents the date when the user joined Netflix.

Gender

Specifies the gender of the user.

**Last Payment Date** 

Indicates the date of the user's last payment.

**Feature Engineering** 

User Tenure (Last Payment Date, Join Date)
Customer Lifetime Value (Monthly
Revenue User Tenure)

**Spending Score** (Monthly Revenue, Total Watch Time, Plan Duration)

Account Status (Last Payment Date)

The dataset serves as a synthetic representation and does not reflect actual Streaming Platform subscriber data.

## Subscribers Segmentation

### Subscribers Segmentation

Cluster 0: Mid Revenue, Mid Watch Time

**Cluster 1**: High Revenue, Mid-Watch Time

Cluster 2: Low Revenue, Low Watch Time

Cluster 3: High Revenue, High Watch Time

#### Principal Component Analysis Chart



### Cluster 0: Mid Revenue, Mid Watch Time

Number of Customers: 1,400 Average Age: 33 years Predominant Gender: Male Average Monthly Revenue: \$15.09 Average Spending Score: \$54.14 Average Total Watch Time: 323 mins Average User Tenure: 2 months

> Churn Rate: 100% Retention Rate: 0%



### Cluster 1: High Revenue, Mid Watch Time

Number of Customers: 2,354
Average Age: 37 years
Predominant Gender: Male
Average Monthly Revenue: \$18.64
Average Spending Score: \$68.40
Average Total Watch Time: 497 mins
Average User Tenure: 11 months

Churn Rate: 0%
Retention Rate: 100%

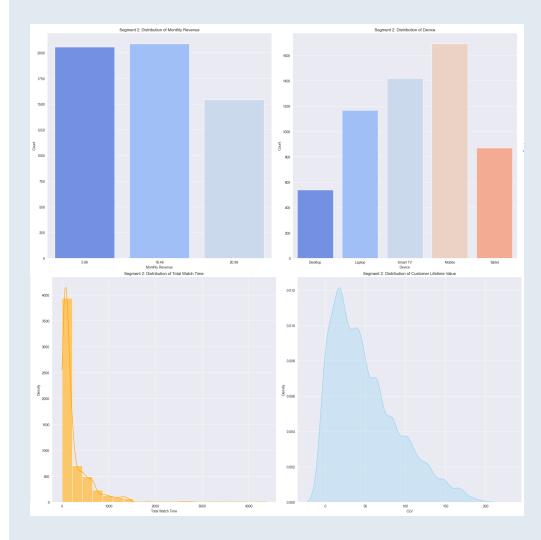


#### Cluster 2:

## Low Revenue, Low Watch Time

Number of Customers: 5,687 Average Age: 32 years Predominant Gender: Male Average Monthly Revenue: \$13.91 Average Spending Score: \$37.17 Average Total Watch Time: 247 mins Average User Tenure: 3 months

Churn Rate: 0%
Retention Rate: 100%



### Cluster 3: High Revenue, High Watch Time

Number of Customers: 559
Average Age: 38 years
Predominant Gender: Male
Average Monthly Revenue: \$18.23
Average Spending Score: \$227.80
Average Total Watch Time: 4,105 mins
Average User Tenure: 10 months

Churn Rate: 45% Retention Rate: 55%

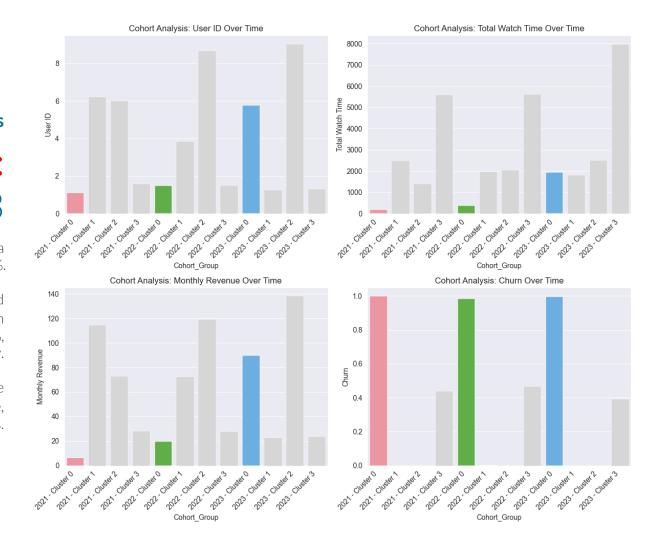


## **Cluster 0:** 2021-2023

Subscriber count surged from 19 to 1138, a remarkable growth of approximately 1178.95%.

This growth extended to Total Watch Time and Monthly Revenue, which increased by an impressive 11,155.80% and 15,506.82%, respectively.

However, there was a significant challenge during this period: a 100% churn rate, indicating substantial customer loss.

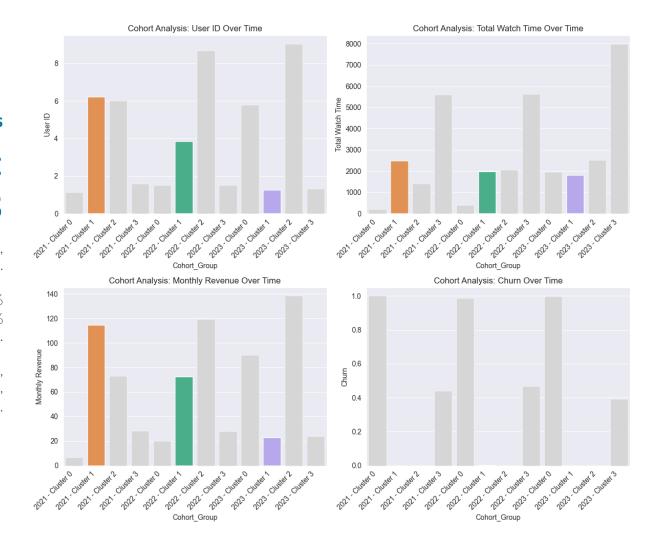


## **Cluster 1:** 2021-2023

The subscriber count dropped significantly, going from 963 to 75, a decrease of about 92%.

This decline in subscribers led to a roughly 72% reduction in Total Watch Time and a 92% decrease in Monthly Revenue.

Remarkably, during the same three-year period, the cluster achieved a 0% churn rate, demonstrating strong customer retention.

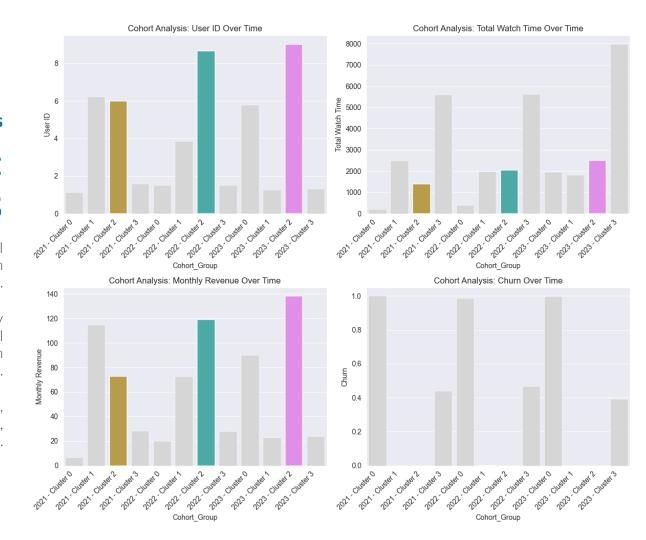


## **Cluster 2:** 2021-2023

The subscriber count showed substantial growth, rising from 931 to 1598, marking an increase of approximately 72%.

This surge in subscribers correspondingly resulted in a notable 107% boost in Total Watch Time and a significant 117% increase in Monthly Revenue.

Notably, over the same three-year timeframe, the cluster maintained a flawless 0% churn rate, showcasing exceptional customer retention.

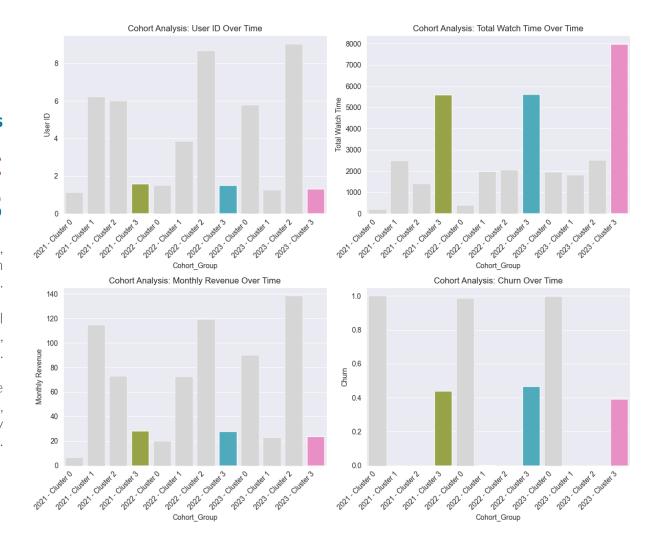


## **Cluster 3:** 2021-2023

The subscriber count saw a modest decrease, declining from 159 to 100, marking a reduction of approximately 37%.

Even with the decline in subscribers, Total Watch Time experienced a slight uptick of 10%, whereas Monthly Revenue decreased by 36%.

Meanwhile, the cluster exhibited notable growth, increasing from 17 to 30.17, representing a substantial rise of approximately 77.45% in churn rate.



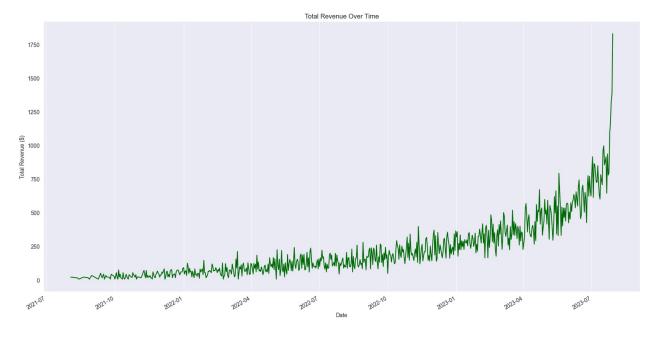
## Revenue Analysis

### **Total Revenue Trend**

#### **Revenue Growth**

Revenue has steadily increased, driven by a combination of higher subscription rates and improved user retention.

The steady increase in revenue is a positive indicator of the streaming platform's financial health and its ability to provide value to users.



### Clusters: Revenue Trend

#### Revenue Analysis Highlights

Cluster 2 played a pivotal role, contributing 51% of the total revenue, highlighting their substantial impact on the platform's financial well-being.

Meanwhile, Cluster 0 and Cluster 1 made contributions of 13.68% and 28%, respectively.

Cluster 3, on the other hand, had a more limited impact, accounting for only 7% of the platform's overall performance.



# Insights and Recommendations

### Insights



The segmentation analysis enables personalized marketing strategies for each user group, optimizing acquisition and revenue generation.



Understanding cohort trends allows the platform to refine strategies for better user retention and long-term revenue growth.



A focus on **clusters** that are performing well could further boost **revenue** and **profitability**.



However, Implementing targeted initiatives to mitigate churn is vital for securing the platform's financial health and maximizing long-term revenue.

### Recommendations

- Personalization: Invest in personalized recommendations and content for different user segments to enhance user engagement and revenue.
- Subscription Upselling: Implement strategies to encourage free users to upgrade to premium subscriptions, further enhancing revenue.
- Retention Initiatives: Develop initiatives to maintain high retention rates observed in recent cohorts, ensuring sustained revenue growth.
- Churn Management: Implement proactive churn management strategies, including user engagement campaigns, improved customer support, and content optimization, to reduce subscriber churn.

### Conclusion

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The project offers valuable insights to improve user experiences, boost revenue, and ensure the platform's long-term success.

By grasping subscriber segments, behaviour patterns, and revenue trends, the platform can make data-driven decisions that enhance subscriber satisfaction and financial performance.

Thank you for your attention, and I welcome any questions or suggestions you may have at this stage.

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Toni Afani