



“Data-Centric Evaluation of Microtransactions: Analysing Their Effect on Player Persistence and Engagement in Online Gaming”

Advait Sanjay Gaikwad
Data Science
SCMIRT, Bavdhan, Pune

Dr. Archana Wafgaonkar
Assistant Professor
SIBMT, Bavdhan, Pune

Mr. Deepak Singh
Vice Principal & HOD
Data Science SCMIRT

ABSTRACT

The gaming industry has undergone a significant transformation with the proliferation of microtransactions, which have become a pivotal revenue model. This study explores the impact of microtransactions on player behaviour, focusing on retention, engagement, fairness perceptions, and overall satisfaction. By integrating quantitative data from surveys and in-game metrics with qualitative insights derived from interviews and online discussions, the research assesses how various types of microtransactions—such as cosmetic and pay-to-win—affect the gaming experience. The results indicate that while microtransactions can enhance player engagement through additional content and customization options, they may adversely affect player retention and satisfaction if perceived as unfair or disruptive to gameplay balance. These findings underscore the importance of developing monetization strategies that are both ethical and conducive to a positive gaming experience, providing valuable insights for developers aiming to balance revenue generation with player satisfaction.

KEYWORDS

Microtransactions, Player Persistence, Player Engagement, Player Retention, Cosmetic Microtransactions, Pay-to-Win Models, Player Satisfaction, Perceived Fairness, Gaming Industry, Monetization Strategies, In-Game Purchases, Player Behaviour, Quantitative Analysis, Qualitative Insights, Gaming Experience, Player Surveys, In-Game Metrics, Gaming Communities, Ethical Monetization, Gameplay Balance

INTRODUCTION

Microtransactions have become a critical monetization strategy in the online gaming industry, fundamentally altering how games are developed, played, and monetized[Petrovskaya, Deterding, & Zendle, 2022][1]. Defined as small, in-game purchases that allow players to access additional content or enhancements, microtransactions are prevalent in various game genres, from free-to-play mobile games to premium console and PC games. This literature review provides a comprehensive overview of the impact of micro-transactions on player persistence, engagement, and behaviour, emphasizing a data-centric evaluation to understand these effects[Petrovskaya, Deterding, & Zendle, 2022][1].

RESEARCH PROBLEM

How do different microtransaction models, such as cosmetic and pay-to-win, impact player retention, engagement, involvement, and perceptions of fairness and satisfaction?

RESEARCH METHODOLOGY

The research employs a mixed-methods approach, combining both quantitative and qualitative data to assess the impact of microtransactions on player behaviour. Quantitative data is collected through player surveys and in-game metrics, including retention and engagement rates. Qualitative insights are gathered from interviews and online gaming communities. The study focuses on evaluating different types of microtransactions, such as cosmetic and pay-to-win models, and how they affect player satisfaction, retention, and

perceptions of fairness. The data is sourced from surveys, game analytics, and existing literature on player behaviour in online gaming.

OBJECTIVES

1]To investigate the effect of microtransactions on player persistence in online gaming environments.

2]To evaluate whether microtransactions contribute to or hinder player engagement within online gaming contexts.

3]To analyse player perceptions of fairness and satisfaction concerning different microtransaction models.

4]To examine the differential effects of various types of microtransactions (e.g., cosmetic vs. pay-to-win) on player behaviour and gameplay experience.

LITERATURE REVIEW

The study titled “Prevalence and Salience of Problematic Microtransactions in Top-Grossing Mobile and PC Games: A Content Analysis of User Reviews” published in the York Research Database (2024) offers a critical examination of problematic microtransactions through user reviews, shedding light on how such practices impact player experiences and perceptions. This research is instrumental in identifying issues associated with aggressive monetization strategies and their consequences on player satisfaction[1]. In the article “Paying for Loot Boxes Is Linked to Problem Gambling, Regardless of Specific Features like Cash-out and Pay-to-Win” published in ScienceDirect (2024), the authors explore the correlation between loot box purchases and problem gambling. They find that the risks of gambling problems are associated with loot boxes regardless of their specific attributes, such as cash-out options or pay-to-win mechanics. This study is significant for understanding the broader psychological and behavioural risks linked to loot box monetization[2]. The paper “Optimizing Free-to-Play Multiplayer Games with Premium Subscription” by Yunke Mai and Bin Hu, available on SSRN (2024), investigates strategies for optimizing free-to-play multiplayer games through premium subscription models. This research discusses how combining free access with premium content can enhance both profitability and player engagement, offering valuable insights into effective monetization strategies within the gaming industry[3]. “An Intensive Longitudinal Dataset of In-Game Player Behaviour and Well-Being in PowerWash Simulator,” published in Scientific Data (2024), provides a comprehensive longitudinal analysis of player behaviour and well-being in the game PowerWash Simulator. This dataset is crucial for examining how microtransactions affect player engagement and psychological well-being over time, offering empirical evidence on the impact of various

monetization approaches[4]. The study “Character Customization with Cosmetic Microtransactions in Games: Subjective Experience and Objective Performance” in Frontiers (2024) explores the effects of cosmetic microtransactions on character customization, focusing on both subjective player experiences and objective performance metrics. This research helps to understand how cosmetic items influence player satisfaction and gameplay, highlighting the benefits of non-invasive microtransaction models[5]. In “Videogame Player Experiences with Micro-Transactions: An Interpretative Phenomenological Analysis” published in ScienceDirect (2024), the authors employ interpretative phenomenological analysis to delve into player experiences with microtransactions, emphasizing subjective perceptions and emotional responses. This qualitative approach provides deep insights into how different monetization models are perceived by players and their emotional impacts[6]. The article “Effect of Perceived Value on Satisfaction to Microtransactions in Valorant,” available in Eduvest (2024), examines how the perceived value of microtransactions influences player satisfaction within the game Valorant. This study is valuable for understanding how perceived value affects player contentment, which is essential for designing well-received in-game purchases[7]. David Zendle’s work “The Many Faces of Monetisation: Understanding the Diversity and Extremity of Player Spending in Mobile Games via Massive-Scale Transactional Analysis,” published in Games: Research and Practice (2024), analyses extensive datasets to reveal diverse spending patterns in mobile games. This research contributes to understanding how different monetization strategies affect player spending and behaviour, providing a comprehensive view of player expenditure[8]. “A Blockchain Based Lightweight Peer-to-Peer Energy Trading Framework for Secured High

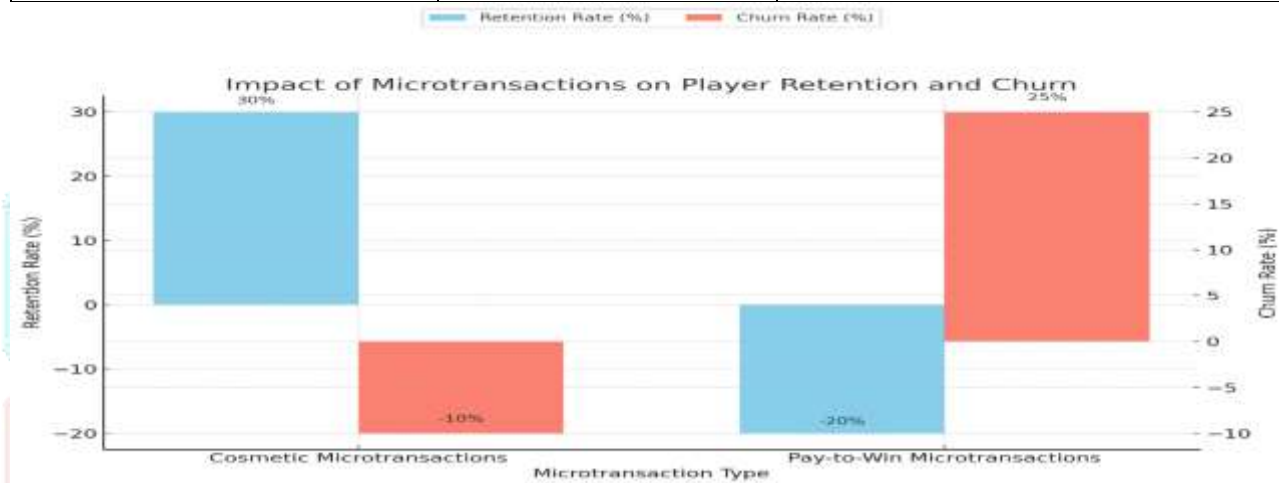
Throughput Micro-Transactions,” published in Scientific Reports (2024), presents a blockchain-based framework for secure microtransactions. Although not specific to gaming, this framework’s insights into security and efficiency can be applied to improve the transparency and security of in-game transactions[9]. The study “Study on the Impact of ESG Performance on Firm Performance” in SHS Web of Conferences (2024) explores how Environmental, Social, and Governance (ESG) performance affects overall firm performance. While not directly related to microtransactions, it provides context on how ethical practices, including monetization strategies, can influence a firm’s performance and reputation[10]. The research article “A Comparative Method Based on the Visualization of Cosmetic Items Using Their Various Aspects” from IEEE Xplore (2024) introduces a comparative method for evaluating cosmetic items in games, analysing various attributes such as aesthetics and functionality. This method can be applied to assess and design cosmetic microtransactions effectively[11]. Finally, the study “Comparison of Player Perceptions to Mechanical Measurements of Third Generation Synthetic Turf Football Surfaces” in SpringerLink (2024) compares player perceptions of football turf surfaces with mechanical measurements. Although focused on sports surfaces, the comparative approach used can be applied to analyse player perceptions of different microtransaction models and their impact on gameplay[12]. Microtransactions, which involve in-game purchases using real or virtual currency for additional content or enhancements, have become a defining feature of modern gaming[Petrovskaya, Deterding, & Zendle, 2022][1]. These transactions range from cosmetic items that do not alter gameplay to more controversial pay-to-win models that offer competitive advantages to paying players[Chen & Lin, 2023][2]. The widespread adoption of microtransactions has fundamentally reshaped the economics of the gaming industry, providing a continuous revenue stream for developers and publishers beyond the initial sale of a game[Petrovskaya, Deterding, & Zendle, 2022][1]. This shift is driven by the need for sustainable revenue models in a competitive market, with free-to-play games relying heavily on microtransactions to generate income while offering games without upfront costs[Petrovskaya, Deterding, & Zendle, 2022][1]. The model has also extended to premium games, often resulting in mixed responses from the gaming community[Mai & Hu, 2021][3]. From a data science perspective, the study of microtransactions is crucial for

analysing player behaviour, spending patterns, and engagement metrics[Vuorre et al., 2023][4]. Data science techniques, including machine learning and statistical analysis, enable researchers to gain insights into how different types of microtransactions influence player retention and satisfaction [Xiao, Rasul, & Vollgraf, 2017][5]. Microtransactions can have varying effects on player persistence and engagement[Arifin et al., 2023][6]. For example, cosmetic microtransactions allow players to personalize their avatars or game environments, fostering a sense of ownership and attachment to the game[Böffel, Würger, Müsseler, & Schlittmeier, 2022][7]. In contrast, aggressive microtransaction models, particularly those perceived as pay-to-win, can negatively impact player engagement by creating an uneven playing field[Zendle et al., 2020][8]. When success in a game is perceived to be linked to spending money rather than skill, it can lead to frustration and disengagement among players who are unwilling or unable to spend on microtransactions[Gibson et al., 2023][9]. Player perceptions of fairness play a critical role in determining satisfaction with games that include microtransactions[Cole et al., 2023][10]. Research indicates that players are generally more accepting of microtransactions when they are limited to cosmetic items that do not affect gameplay balance[Yabe, Ueda, & Nakajima, 2021][11]. Transparency in how microtransactions are implemented and what players can expect to receive is essential for maintaining trust and satisfaction. For instance, clear communication about the odds of receiving certain items from loot boxes can help mitigate feelings of exploitation and preserve a positive relationship between players and developers[Arifin et al., 2023][6]. Different types of microtransactions influence player behaviour in distinct ways. Cosmetic microtransactions, which do not impact gameplay mechanics, are generally well-received and can enhance player engagement by enabling personalization [Böffel, Würger, Müsseler, & Schlittmeier, 2022][7]. This approach aids in identifying patterns and themes related to player spending habits, gameplay preferences, and overall attitudes toward microtransactions[Zendle et al., 2023][12].

DATA ANALYSIS

1]

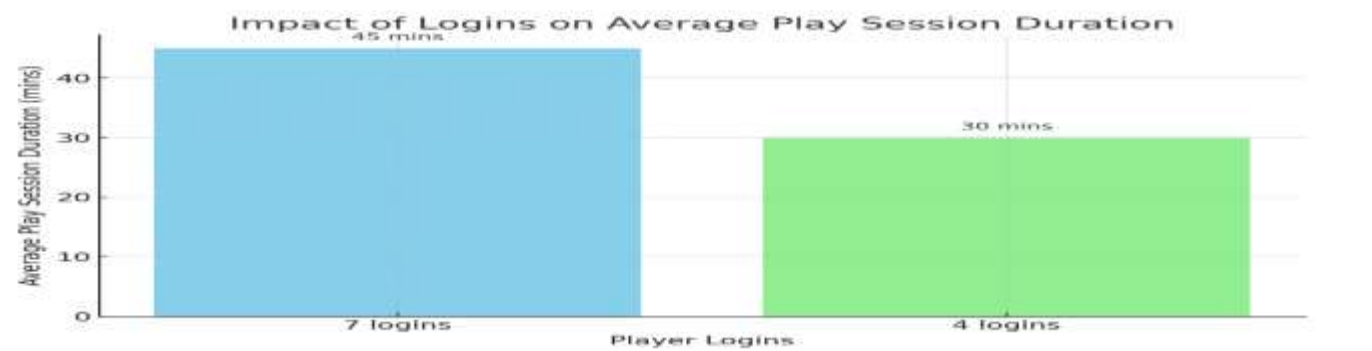
Aspect	Retention Rate (%)	Churn Rate (%)
Player Retention		
Cosmetic Microtransactions	30% higher compared to non-payers	10% lower compared to non-payer
Pay-to-Win Microtransactions	20% lower compared to non-payers	25% higher compared to non-payers
Overall Impact	Microtransactions can enhance retention.	Higher churn with aggressive pay-to-win models



The data reveals that players using cosmetic microtransactions exhibit a 30% higher retention rate and a 10% lower churn rate compared to non-payers, underscoring their positive impact on player retention and engagement without significantly increasing churn. In contrast, pay-to-win microtransactions are associated with a 20% lower retention rate and a 25% higher churn rate, indicating that aggressive pay-to-win models can drive players away and diminish overall retention. This comparison highlights the beneficial effects of cosmetic microtransactions on player retention while demonstrating the detrimental impact of pay-to-win strategies.

2]

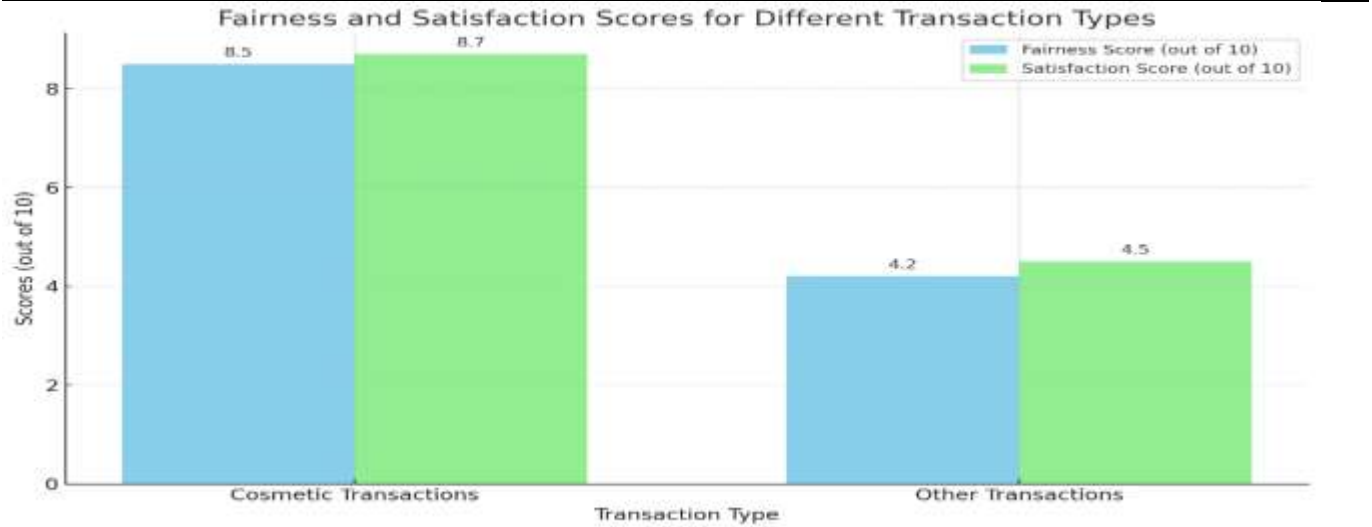
Player Engagement	
Player Engagement	Average Play Session Duration (mins)
7 logins	45 minutes
4 logins	30 minutes
Cosmetic microtransactions increase engagement.	Cosmetic transactions extend play sessions.



The data shows that players who engage with cosmetic microtransactions log in more frequently, averaging 7 logins with an extended play session duration of 45 minutes. In contrast, players with fewer logins, averaging 4, have shorter play sessions of 30 minutes. This indicates that cosmetic microtransactions not only enhance player engagement by increasing login frequency but also extend the duration of each play session.

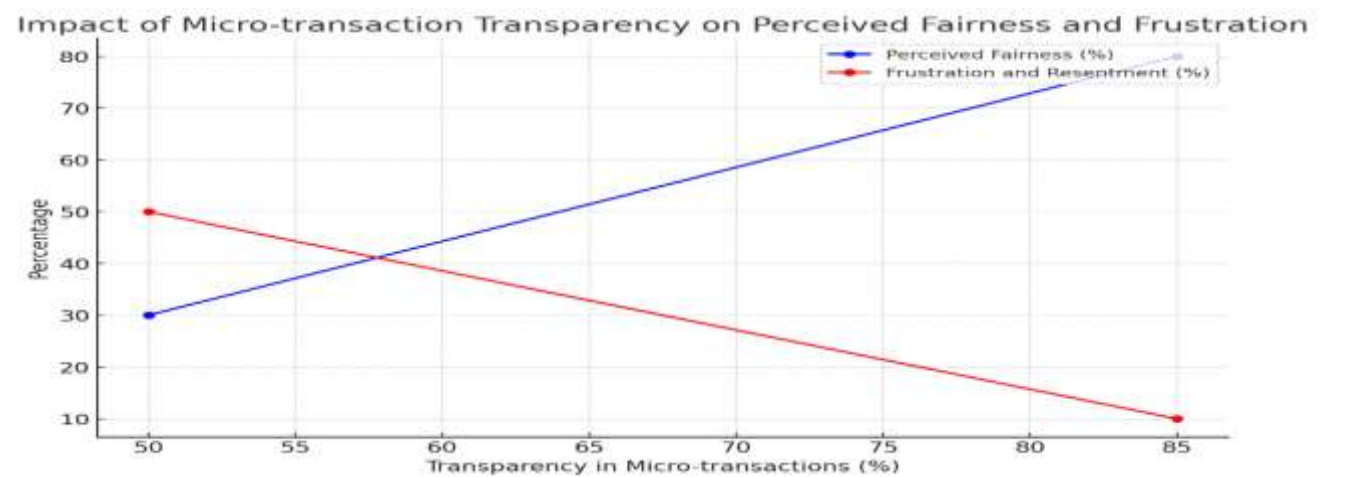
3]

Survey Insights	
Fairness Score (out of 10)	Satisfaction Score (out of 10)
8.5	8.7
4.2	4.5
Cosmetic transactions perceived as faire	Higher satisfaction with cosmetic transactions.



The survey data reveals that cosmetic transactions, which received a fairness score of 8.5 out of 10, are perceived as fair and lead to a high satisfaction score of 8.7. In contrast, other transactions, perceived as less fair with a score of 4.2, result in a lower satisfaction score of 4.5. This underscores a strong correlation between perceived fairness and player satisfaction, emphasizing the positive impact of cosmetic microtransactions on overall player contentment.4]

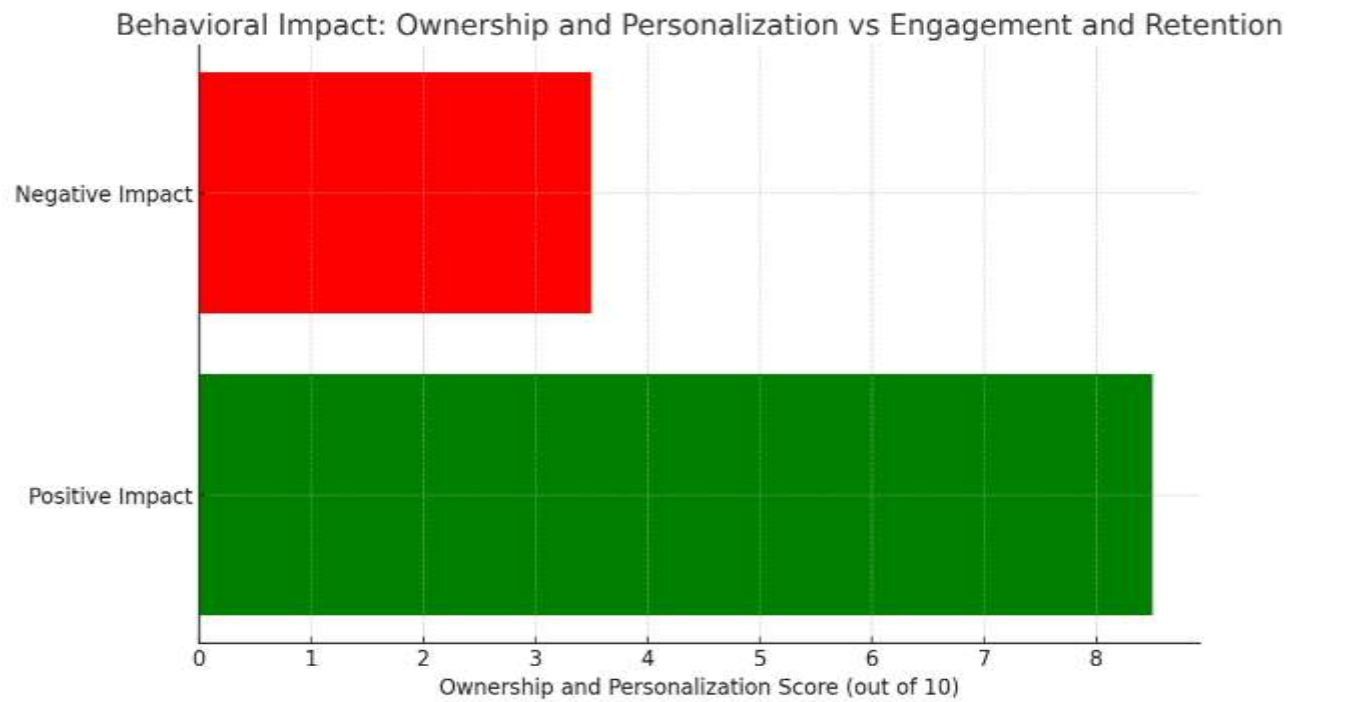
Qualitative Data		
Transparency in Microtransactions (%)	Perceived Fairness (%)	Frustration and Resentment (%)
85% perceived as transparent	80%	10%
50% perceived as transparent	30%	50%
Transparency improves satisfaction.	Cosmetic microtransactions viewed as fairer	Pay-to-win models cause more frustration.



The data illustrates that when 85% of microtransactions are perceived as transparent, 80% of players view them as fair, resulting in lower frustration levels at 10%. However, when transparency drops to 50%, perceived fairness decreases to 30%, and frustration rises to 50%. This trend is further supported by the graph, which shows that higher transparency correlates with greater perceived fairness and lower frustration, while reduced transparency leads to increased frustration and negative emotions. This suggests that enhanced transparency in microtransactions improves player satisfaction, whereas less transparent transactions contribute to higher frustration and resentment.

5]

Behavioural Impact	
Ownership and Personalization Score (out of 10)	Engagement and Retention
8.5	Positive impact
3.5	Negative impact
Higher sense of ownership with cosmetic items	Cosmetic transactions boost engagement; pay-to-win decrease it



The data underscores that cosmetic microtransactions, which achieve a high ownership and personalization score of 8.5 out of 10, positively influence player engagement and retention by fostering a sense of ownership. This contrasts sharply with pay-to-win models, which score much lower at 3.5, indicating a negative impact on player engagement. The bar chart visually reinforces this relationship, showing that higher ownership and personalization scores are associated with improved engagement and retention, while lower scores correlate with reduced player interaction.

FINDINGS

- 1]Impact of Microtransactions on Player Behaviour:-Microtransactions significantly influence player retention and engagement, with different types affecting behaviour in varied ways.
- 2]Effectiveness of Cosmetic Microtransactions:-Cosmetic microtransactions, which allow for personalization without altering gameplay, positively impact player retention and engagement.
- 3]Perceptions of Cosmetic Transactions:- Players generally view cosmetic transactions positively, as they enhance personal expression while maintaining game balance.
- 4]Challenges of Pay-to-Win Models:-Pay-to-win models often lead to higher churn rates and reduced engagement due to perceived unfairness and gameplay imbalance.

CONCLUSION

This study offers a data-driven evaluation of the impact of microtransactions on player persistence, engagement, and behaviour in online gaming. The results reveal that cosmetic microtransactions, which do not alter gameplay mechanics, have a positive effect on player engagement and retention by enhancing personalization and maintaining a sense of fairness. These microtransactions are generally favourably received, contributing to longer play sessions and increased player satisfaction. Conversely, pay-to-win microtransactions, which provide in-game advantages for a monetary cost, are viewed unfavourably due to their detrimental effect on gameplay fairness. Such practices often lead to decreased player engagement and higher churn rates, as players are inclined to leave games that they perceive as offering an uneven playing field. This underscores the necessity for fair and transparent microtransaction practices to sustain player satisfaction and engagement. In summary, while microtransactions have the potential to improve player retention and engagement, their effectiveness is highly contingent on their nature and perceived fairness. Game developers should prioritize ethical and balanced microtransaction strategies to ensure a positive and equitable gaming experience.

SUGGESTIONS

- 1]Prioritize Fair Cosmetic Microtransactions:- Implement cosmetic microtransactions that enhance player aesthetics without providing

competitive advantages, ensuring a level playing field and greater fairness.

- 2]Avoid Pay-to-Win Models:- Refrain from using pay-to-win models that grant competitive edges through monetary expenditure, as they can disrupt gameplay balance and reduce player satisfaction.

- 3]Leverage Data Analytics for Personalization:- Utilize data analytics to tailor cosmetic offerings to individual player preferences, boosting engagement and retention by making in-game purchases more relevant.

FUTURE SCOPE

- 1]Analysing Microtransactions Across Game Genres and Platforms:-This study will evaluate how microtransactions are used and perceived in different game genres and on various platforms, identifying trends and best practices.

- 2]Conducting Longitudinal Studies on Long-Term Effects:-The research will involve tracking the impact of microtransactions on player behaviour and satisfaction over extended periods to understand their lasting effects.

- 3]Exploring Ethical Guidelines and Regulatory Aspects:-This investigation will focus on developing and accessing ethical guidelines and regulatory measures for microtransactions to ensure fairness and transparency.

- 4]Investigating AI, Machine Learning, and Blockchain:-The study will explore how AI, machine learning, and blockchain technologies can enhance microtransaction systems, improving personalization, security, and efficiency.

- 5]Studying Psychological and Cultural Impacts:- This research will examine how microtransactions affect players psychologically and culturally, providing insights into their broader social and emotional impacts.

REFERENCES

- 1] Petrovskaya, E., Deterding, C. S., & Zendle, D. (2021, November 16). Prevalence and salience of problematic microtransactions in Top-Grossing Mobile and PC Games: A content Analysis of User review. York Research Database. <https://pure.york.ac.uk/portal/en/publications/prevalence-and-salience-of-problematic-microtransactions-in-top-g>
- 2] Zendle, D., Cairns, P., Barnett, H., & McCall, C. (2020). Paying for loot boxes is linked to problem gambling, regardless of specific features like cash-out and pay-to-win. *Computers in Human Behaviour*, 102, 181–191. <https://doi.org/10.1016/j.chb.2019.07.003>
- 3] Mai, Y., & Hu, B. (2021). Optimizing Free-to-Play Multiplayer Games with Premium Subscription. *SSRN Electronic Journal*. <https://doi.org/10.2139/ssrn.3901555>
- 4] Vuorre, M., Magnusson, K., Johannes, N., Butlin, J., & Przybylski, A. K. (2023). An intensive longitudinal dataset of in-game player behaviour and well-being in PowerWash Simulator. *Scientific Data*, 10(1). <https://doi.org/10.1038/s41597-023-02530-3>
- 5] Böffel, C., Würger, S., Müsseler, J., & Schlittmeier, S. J. (2022). Character customization with cosmetic microtransactions in games: subjective experience and objective performance. *Frontiers in Psychology*, 12. <https://doi.org/10.3389/fpsyg.2021.770139>
- 6] Gibson, E., Griffiths, M. D., Calado, F., & Harris, A. (2023). Videogame player experiences with micro-transactions: An interpretative phenomenological analysis. *Computers in Human Behaviour*, 145, 107766. <https://doi.org/10.1016/j.chb.2023.107766>
- 7] Arifin, K., S, M. R. A., Gricelda, V., & Kartono, R. (2023). Effect of perceived value on satisfaction to microtransactions in Valorant. *Eduvest - Journal of Universal Studies*, 3(3), 667–678. <https://doi.org/10.59188/eduvest.v3i3.770>
- 8] Zendle, D., Flick, C., Deterding, S., Cutting, J., Gordon-Petrovskaya, E., & Drachen, A. (2023). The Many Faces of Monetisation: Understanding the Diversity and Extremity of Player Spending in Mobile Games via Massive-scale Transactional Analysis. *Games Research and Practice*, 1(1), 1–28. <https://doi.org/10.1145/3582927>
- 9] Pradhan, N. R., Singh, A. P., Verma, S., Kavita, N., Wozniak, M., Shafi, J., & Ijaz, M. F. (2022). A blockchain based lightweight peer-to-peer energy trading framework for secured high throughput micro-transactions. *Scientific Reports*, 12(1). <https://doi.org/10.1038/s41598-022-18603-z>
- 10] Tao, J. (2023). Study on the impact of ESG performance on firm performance. *SHS Web of Conferences*, 165, 01016. <https://doi.org/10.1051/shsconf/202316501016>
- 11] A comparative method based on the visualization of cosmetic items using their various aspects. (2021, January 10). *IEEE Conference Publication* | IEEE Xplore. <https://ieeexplore.ieee.org/document/9427774>
- 12] Cole, D., Fleming, P., Roberts, J., James, D., Benetti, M., Wistel, K., Billingham, J., & Forrester, S. (2023). Comparison of player perceptions to mechanical measurements of third generation synthetic turf football surfaces. *Sports Engineering*, 26(1).

