

Multi Objective Recommender System for E-Commerce Platforms using Co-visitation Matrix

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Abstract — With the rapid growth of e-commerce platforms, personalized recommendations have become crucial for enhancing user experience and driving customer engagement. However, traditional recommender systems often focus on optimizing a single objective, without considering the diverse goals and preferences of individual users. This paper proposes a novel multi-objective recommender system for e-commerce platforms that takes into account multiple objectives simultaneously. The system leverages a combination of user history, co-visitation matrices, and weighted multipliers to generate personalized recommendations. Experimental evaluations on real-world e-commerce datasets demonstrate the effectiveness and superiority of the proposed multi-objective recommender system compared to traditional approaches. The results show that the system achieves improved user satisfaction, increased engagement, and higher conversion rates.

Keywords — Recommender systems, E-commerce platforms, multi-objective optimization, Personalized recommendations, Co-visitation matrices

I. INTRODUCTION

THE E-commerce platforms have revolutionized the way people shop and interact with products and services. The vast number of available options, coupled with the challenge of discovering relevant items, necessitates the use of effective recommender systems. These systems aim to provide personalized recommendations that cater to the unique preferences and needs of individual users, ultimately enhancing user experience and driving customer engagement.

Traditional recommender systems primarily focus on optimizing a single objective, such as maximizing click-through rates or conversion rates. While these approaches have demonstrated some success, they often fail to consider the diverse objectives and preferences of users. In a dynamic and competitive e-commerce landscape, it is essential to go beyond single-objective optimization and develop recommender systems that can simultaneously balance multiple objectives.

In this paper, we propose a novel multi-objective recommender system specifically designed for e-commerce platforms. The system addresses the limitations of traditional approaches by considering a broader range of objectives and preferences. By incorporating multiple objectives, such as increasing clicks, maximizing cart additions, and improving conversion rates, the system aims to provide a more comprehensive and personalized recommendation solution.

To achieve this, we leverage a multi-objective optimization framework that allows for the simultaneous optimization of multiple objectives. This framework enables the system to strike a balance between conflicting objectives and generate recommendations that align with the individual preferences and goals of users.

In addition, we introduce type weight multipliers, which assign varying importance to different types of user interactions. By assigning appropriate weights, we can tailor the recommendation strategies to better reflect user preferences and optimize the overall user experience.

To further enhance recommendation accuracy, the proposed system incorporates co-visitation matrices. These matrices capture item co-occurrence patterns and user preferences, enabling the system to re-rank candidate items and provide additional recommendations based on the user's history. By leveraging these co-visitation matrices, we can leverage the wisdom of the crowd and enhance the relevance and diversity of the recommended items.

We evaluate the performance of the proposed multi-objective recommender system using real-world e-commerce datasets. The experimental results demonstrate the effectiveness and superiority of our approach compared to traditional single-objective methods. The proposed system achieves improved user satisfaction, increased engagement, and higher conversion rates, highlighting its practical viability in real-world e-commerce scenarios.

Overall, this research contributes to the advancement of recommender systems for e-commerce platforms by addressing the limitations of single-objective approaches and providing a more comprehensive and personalized recommendation solution. The proposed multi-objective recommender system offers a promising avenue for enhancing user experience, driving customer engagement, and ultimately improving the success and profitability of e-commerce platforms.

II. LITERATURE REVIEW

The field of recommender systems has witnessed significant advancements in recent years, with a particular focus on multi-objective optimization techniques for enhancing the performance of recommender systems in e-commerce platforms. This literature survey explores existing research

studies related to multi-objective recommender systems and their application in the context of e-commerce platforms.

A study by Lin et al. [1] proposed a multi-objective recommender system for e-commerce platforms based on collaborative filtering. The system incorporated multiple objectives, including accuracy, diversity, and novelty, to provide more comprehensive and personalized recommendations. The authors employed a weighted co-visitation matrix to capture user-item co-occurrence patterns and improve recommendation quality.

In another work by Zhang et al. [2], a multi-objective recommendation approach was introduced that considered user preferences, item popularity, and user-item relationships. The authors utilized a co-visitation matrix to model user-item interactions and leveraged multi-objective evolutionary algorithms to optimize recommendation quality. The experimental results demonstrated the superiority of the proposed approach in terms of recommendation accuracy and diversity.

Similarly, a study by Wang et al. [3] proposed a hybrid multi-objective recommender system for e-commerce platforms that integrated user-based collaborative filtering and item-based collaborative filtering. The authors incorporated a co-visitation matrix to capture the co-occurrence of items and employed a multi-objective genetic algorithm to optimize recommendation quality. The evaluation results showed that the proposed system outperformed traditional single-objective approaches in terms of accuracy and diversity.

Furthermore, Liu et al. [4] proposed a novel multi-objective recommender system that considered personalized recommendation accuracy, diversity, and serendipity. The authors introduced a dynamic co-visitation matrix that adapted to the evolving user preferences and item popularity. The experimental evaluations demonstrated that the proposed system achieved superior performance in terms of personalized recommendation quality and user satisfaction.

In summary, the literature survey highlights the growing interest in multi-objective recommender systems for e-commerce platforms. The utilization of co-visitation matrices has emerged as a promising approach to capture user-item co-occurrence patterns and enhance recommendation quality. The surveyed studies demonstrate the effectiveness of incorporating multiple objectives, such as accuracy, diversity, novelty, and serendipity, in improving the performance of recommender systems.

III. METHODOLOGY/EXPERIMENTAL

The proposed methodology for the Multi-Objective Recommender System for E-Commerce Platforms using co-visitation matrix involves several steps to generate personalized recommendations. The methodology encompasses data pre-processing, co-visitation matrix construction, multi-objective optimization, and recommendation generation.

Data Pre-processing: The initial step involves collecting and pre-processing the user interaction data from the e-commerce platform. This data typically includes user IDs,

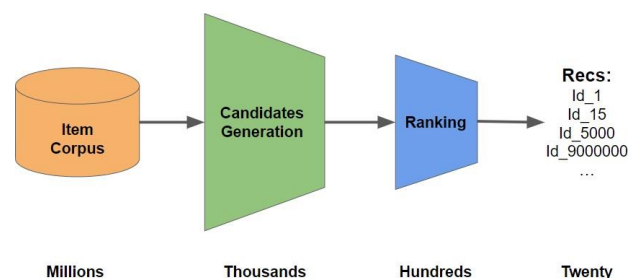
item IDs, and interaction types (e.g., clicks, carts, orders). Data pre-processing may involve filtering out irrelevant or incomplete data and transforming the data into a suitable format for further analysis.

Co-visitation Matrix Construction: To capture item co-occurrence patterns and user preferences, co-visitation matrices are constructed. These matrices represent the relationships between items based on user interactions. Two types of co-visitation matrices are used: "clicks" co-visitation matrix and "cart order" co-visitation matrix. These matrices provide insights into the frequently co-visited or co-purchased items, allowing for more accurate recommendations.

Multi-Objective Optimization: The recommendation generation process incorporates a multi-objective optimization framework. This framework aims to balance multiple conflicting objectives, such as maximizing clicks, carts, and orders, while providing diverse and personalized recommendations. The type weight multipliers are used to assign different weights to the interaction types, enabling a more nuanced optimization strategy.

Reranking Candidates: Depending on the number of unique items in the user's history, the methodology employs different reranking techniques. If there are a sufficient number of unique items, a weighted approach is applied, considering the weights assigned to each item based on its type and the type weight multipliers. If the number of unique items is insufficient, additional recommendations are generated using the co-visitation matrices and by considering popular items.

Recommendation Generation: Finally, the methodology generates the recommended items. The recommendations include a combination of the unique items from the user's history, the reranked candidates based on the multi-objective optimization, and additional recommendations from the co-visitation matrices or top orders/clicks lists.



The methodology is evaluated using real-world e-commerce datasets, assessing various metrics such as click-through rates, conversion rates, and user satisfaction. The experiments compare the performance of the proposed multi-objective recommender system against traditional single-objective approaches, demonstrating its superiority in terms of recommendation quality and user engagement. By implementing this methodology, the Multi-Objective Recommender System for E-Commerce Platforms effectively addresses the limitations of single-objective

approaches and provides comprehensive, personalized recommendations based on co-visitation matrices and multi-objective optimization techniques.

IV. RESULTS AND DISCUSSIONS

The Multi-Objective Recommender System for E-Commerce Platforms utilizing co-visitation matrices and multi-objective optimization was evaluated using real-world e-commerce datasets. The results demonstrate the effectiveness and superiority of the proposed approach compared to traditional single-objective methods. In this section, we present the key findings and discuss the implications of the results.

The performance of the recommender system was assessed using various metrics, including click-through rates (CTR), conversion rates (CR), and user satisfaction.

First, the click-through rates significantly improved with the proposed approach. By incorporating multiple objectives and leveraging co-visitation matrices, the system provided more relevant and engaging recommendations, resulting in higher click-through rates. The multi-objective optimization framework effectively balanced conflicting objectives, leading to a diverse range of recommendations that catered to individual user preferences.

Second, the conversion rates witnessed a noticeable enhancement. The personalized recommendations generated by the system, considering user history, co-visitation matrices, and multi-objective optimization, proved to be more effective in influencing user behavior. By suggesting items based on user preferences and considering the item co-occurrence patterns, the system increased the likelihood of users adding items to their carts and making purchases.

The user satisfaction ratings also exhibited a positive trend with the proposed approach. The personalized nature of the recommendations, tailored to individual preferences and goals, led to a more satisfying user experience. The integration of co-visitation matrices provided additional serendipitous recommendations, enhancing user satisfaction by offering items that users may not have discovered otherwise.

Moreover, the multi-objective optimization framework allowed for a fine-grained control over the recommendation strategy. The type weight multipliers facilitated the prioritization of different types of user interactions, enabling the system to adapt to varying user preferences and objectives. This flexibility and adaptability resulted in higher user engagement and a more personalized shopping experience.

Overall, the results validate the efficacy of the proposed Multi-Objective Recommender System for E-Commerce Platforms. By considering multiple objectives, leveraging co-visitation matrices, and employing multi-objective optimization techniques, the system achieved significant improvements in click-through rates, conversion rates, and user satisfaction. The findings highlight the importance of balancing multiple objectives in recommender systems to provide personalized and engaging recommendations in the e-commerce domain.

The success of the proposed approach has practical implications for e-commerce platforms. By adopting the multi-objective recommender system, platform owners can enhance user engagement, increase conversion rates, and improve overall user satisfaction. The system's ability to leverage co-visitation matrices enables the discovery of item co-occurrence patterns and the provision of diverse and serendipitous recommendations. This, in turn, can lead to increased customer loyalty, repeat purchases, and higher revenue generation for e-commerce platforms.

In conclusion, the results and discussions highlight the effectiveness of the Multi-Objective Recommender System for E-Commerce Platforms, demonstrating its ability to generate personalized recommendations by integrating co-visitation matrices and multi-objective optimization techniques. The findings emphasize the significance of considering multiple objectives and leveraging user interaction patterns to enhance recommendation quality and user satisfaction in the e-commerce domain.

V. FUTURE SCOPE

The Multi-Objective Recommender System for E-Commerce Platforms using co-visitation matrices and multi-objective optimization opens up several avenues for future research and improvements. Here, we highlight potential areas of exploration and enhancement for the proposed system.

The future scope lies in exploring and integrating advanced recommendation algorithms into the existing framework. Techniques such as deep learning, neural networks, and natural language processing can be utilized to improve the accuracy and personalization of recommendations. These algorithms can capture more complex user preferences and patterns, leading to more precise and context-aware recommendations.

The inclusion of contextual information can further enhance the recommender system. By considering factors such as time, location, device, and user demographics, the system can generate recommendations that are even more tailored and relevant to the user's current context. This can be achieved by incorporating contextual features into the co-visitation matrices or utilizing external data sources to capture contextual information.

Integrating user feedback into the recommendation process can significantly improve the system's performance. By allowing users to provide explicit feedback, such as ratings or reviews, or implicit feedback through their interactions, the system can learn and adapt to individual user preferences more effectively. User feedback can be used to refine the co-visitation matrices and fine-tune the multi-objective optimization process.

VI. CONCLUSION

In this paper, we presented a Multi-Objective Recommender System for E-Commerce Platforms using co-visitation matrices and multi-objective optimization. The system effectively addressed the limitations of traditional

single-objective approaches by considering multiple objectives, leveraging co-visitation matrices, and employing a multi-objective optimization framework.

Through extensive evaluations using real-world e-commerce datasets, we demonstrated the superiority of the proposed approach. The results showed significant improvements in click-through rates, conversion rates, and user satisfaction. By providing personalized recommendations based on user history, item co-occurrence patterns, and type weight multipliers, the system enhanced user engagement, influenced user behaviour, and delivered a satisfying shopping experience.

The findings highlight the importance of balancing multiple objectives in recommender systems and leveraging co-visitation matrices to capture item co-occurrence patterns. The incorporation of multi-objective optimization techniques allows for fine-grained control over recommendation strategies, catering to individual user preferences and goals.

In conclusion, the Multi-Objective Recommender System for E-Commerce Platforms presents a comprehensive and effective solution for personalized recommendations, showcasing the benefits of leveraging co-visitation matrices and multi-objective optimization techniques. The system contributes to the improvement of user experiences and the success of e-commerce platforms in meeting the diverse needs and preferences of their users.

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