

1) Compare User-based collaborative filtering and Item-based collaborative filtering.

Ans:-

Feature	User based collaborative filtering	Item based collaborative filtering
① Concept	Recommends items by finding similar items	Recommends items by finding similar items.
② Similarity Basis	Based on user behaviour	Based on item interactions
③ Computational Cost	High (as user similarity changes dynamically)	Lower (item similarities are more stable)
④ Cold Start problem	Struggles with new users	Struggles with new items
⑤ Personalization	Highly personalized as it depends on user preferences	Less personalized as it generalized item similarities
⑥ Scalability	Less scalable for larger user base	More scalable as item similarities can be precomputed
⑦ Data Sparsity	Struggles when user interactions are sparse	Performs better in sparse datasets
⑧ Dynamic Adaption	Changes as new user interactions are recorded	More stable as item relationships change slowly.
⑨ Best use-case	When user preferences change frequently & data is rich	When items remain consistent & users interact sparsely

2) Write about strengths and weaknesses of neighbourhood methods.

Ans: ① User-based collaborative filtering

This approach finds users with similar behaviour and recommends items based on their preferences.

• Strengths :

① Highly Personalized :

Since recommendations are based on user similarity, they are tailored to individual tastes.

② Great for dynamic preferences :

Works well when user behaviour frequently changes.

③ Easier to understand and interpret :-

If a person enjoys the same TV show as you, their preferences can guide you new recommendations.

• Weakness :

① Scalability issues :

As the number of users increases, computing similarities among them becomes expensive.

② Cold-start problem (users) :-

A new user with no interaction history won't get good recommendations.

Frequent Recalculation needed

Since user preferences change over time, similarity calculations must be updated regularly.

(ii) Item-based collaborative filtering

This method finds similar items based on how users have interacted with them.

• Strengths

① More scalable

Item similarities are relatively stable, so recommendation can be precomputed and stored.

② Handles sparse data better

Even if user interact with few items, strong item relationships can still generate useful recommendations.

③ Cold start is less of an issue (for users)

Even new users can receive recommendations based on items they view or interact with.

• Weakness:-

① Cold start problem (for item)

A brand new item with no interactions won't be recommended effectively.

② Less personalized

Since recommendations are based on item similarity based rather than user specific preferences, they might not feel highly tailored.

③ Fail with unique preferences

Users with niche preferences may not get useful recommendations.