# Comparison and discussion of two Profile-based Retrieval Systems

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#### INTRODUCTION



#### LinkedIn

- Domain of Job Portals.
- System for Job Matching.
- Enhances **job search** and a better **quality of applicants** for specific roles.



#### Coursera

- Domain of Online Learning Platforms.
- System for **Skill Development** based on **personalized courses.**.
- Enhances access to education and improves career opportunities through specialized courses and certifications.

#### **METHOD USED BY LINKEDIN**



#### **RETRIEVAL STAGE**

A **candidate selection model** filters job listings before ranking them.

#### Reduce search latency:

- Decision trees
- Query construction



#### **RANKING STAGE**

#### Sort based on:

- Explicit user data (e.g., profile or past applications)
- Implicit signals (e.g., users' clicks.)

The system applies machine learning models like **GLMix** to score and rank jobs.



#### **FORECASTING**

**LiJAR System** balances job applications preventing job postings from receiving too **many** or too **few applications**.

#### METHOD USED BY COURSERA

#### Collaborative Filtering (CF)

**User-based:** Recommends courses based on similar users' behavior.

**Item-based:** Finds relationships between courses through user interactions.

#### **Profiling**

**Explicit:** Users manually enter their learning goals.

**Implicit:** The system tracks behavior and updates preferences dynamically (CBF sistem).

#### Content-Based Filtering (CBF)

**Analysis of metadata:** keywords, topics, and descriptions from courses.

**Builds user profiles** from past interactions to recommend relevant courses.

#### **Hybridisation**

**Weighted Hybrid:** Combines CF and CBF with different weights.

**Switching Hybrid:** Uses CF if data is available, otherwise CBF.

**Feature Augmentation:** One model enhances another with generated features.

#### **COMPARISON BETWEEN THE SYSTEMS**

SYSTEM	PURPOSE	METHOD	DATA	STRENGTHS	CHALLENGES
LinkedIn	Matching users to suitable jobs	Multi-tier distributed service that retrieves and ranks job postings	Past applications, user profile and employer preferences	Scalability & Efficiency  Balancing Job Application  High availability	Real-time personalization Unique job market constraints
Coursera	Recommending personalized courses	Hybrid content-based & collaborative filtering associated to contextual modeling	Educational & professional background, context and learning preferences	Adaptable and personalized learning experience.	Requires continuous user input

#### CONCLUSIONS





#### **SUMMARY**

- LinkedIn uses **ML-based** ranking.
- Coursera uses hybrid collaborative and content-based filtering.

#### FILTER BUBBLE

Limit users' exposure to diverse **job** or **learning opportunities**.

## CONTINUOUS IMPROVEMENT

Both systems require to **adapt** in real time to avoid <u>over</u> reliance in past actions.

### BALANCED APPLICATIONS

In **LinkedIn**, jobs must be **balanced** preventing some jobs from being flooded while others remain unseen.

#### **IMPROVEMENT PROPOSALS**

RESOURCE	LINKEDIN	COURSERA
Bias Mitigation	<b>Explainable AI</b> to provide transparency.	Adversarial Debiasing to deal with Over-reliance on past user actions.
User Feedback	<b>NLP on user interactions</b> (e.g., messages and posts) to infer job preferences.	NLP-based <b>chatbots</b> to collect more feedback.
Method	Include <b>bidirectional recommendation</b> to also help recruiters to find the best candidates.	Use of <b>NLP</b> to <b>understand better</b> the content and recommend not only based on titles and tags.
Personalization	Integrate <b>external labor market data</b> to improve rankings.	Incorporate users profiles more deeply and Al-driven adaptive learning.





# THANKS FOR YOUR ATTENTION