# CS-4053 Recommender System

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Lecture 12: Evaluation Metrics for Recommender Systems

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#### **Evaluation Measures**

- $\square$  **P@k** (Precision@k)
  - Of the top **k** relevant items that were recommended, the no. of items that are actually relevant to the user
- □ AP@k (Average Precision@k)
  - $\Box$  For a single user, the mean of **Precision@i** for **i=1, 2, 3, ..., k**
- ☐ MAP@k (Mean Average Precision@k)
  - ☐ The mean of **AP@k** over all users

## **Evaluation Measures: Formulae**

Precision

$$P = \frac{True\ Positive}{True\ Positive + False\ Positive}$$

☐ Precision@k

$$P@k = \frac{True\ Positive\ in\ subset\ k}{True\ Positive\ in\ subset\ k + False\ Positive\ in\ subset\ k}$$

☐ Average Precision@k

$$AP@k = \frac{1}{m} \sum_{k=1}^{n} P@k \text{ if } k^{th} \text{ item is relevant}$$

Where m is no. of possible relevant items in system and n is no. of items considered

■ Mean Average Precision

$$MAP = \frac{\sum_{k=1}^{K} AP@k}{K}$$

## **Evaluation Measures: Intuitive**

#### Precision

$$P = \frac{\text{# of items recommended that are relevant}}{\text{# of all items that can possibly be relevant}}$$

Precision@k

$$P@k = \frac{\text{# of items recommended that are relevant}}{\text{# of items that were recommended i.e., k}}$$

☐ Average Precision@k

$$AP@k = \frac{1}{\# \ of \ all \ possible \ relevant \ items} \ (P@1 \ if \ 1^{st} \ items \ is \ relevant + P@2 \ if \ 2^{nd} \ item \ is \ relevant + \cdots + P@k \ if \ k^{th} \ item \ is \ relevant)$$

■ Mean Average Precision

$$MAP = \frac{Sum \ of \ AP@k \ for \ k = 1, 2, ..., up to \ K \ items \ that \ are \ recommended}{K}$$