

# Recommender Systems

## Evaluating recommender systems

Mining of Massive Datasets  
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# Evaluation

**movies**

**users**

1	3	4			
	3	5			5
		4	5		5
		3			
		3			
2			2		2
				5	
	2	1			1
	3			3	
1					

# Evaluation

**movies**

**users**

1	3	4			
	3	5			5
		4	5		5
		3			
		3			
2			?		?
				?	
	2	1			?
	3			?	
1					

**Test Data Set**

# Evaluating Predictions

- Compare predictions against withheld known ratings (test set  $T$ )
- Root-mean-square error (RMSE)

$$\sqrt{\frac{\sum_{(x,i) \in T} (r_{xi} - r_{xi}^*)^2}{N}}$$

where  $N = |T|$

$r_{xi}$  is the predicted rating

$r_{xi}^*$  is the actual rating

# Problems with Error Measures

- **Narrow focus on accuracy sometimes misses the point**
  - Prediction Diversity
  - Prediction Context
  - Order of predictions
- **In practice, we care only to predict high ratings**
  - RMSE might penalize a method that does well for high ratings and badly for others
  - Alternative: precision at top k
    - Percentage of predictions in the user's top k withheld ratings