

# Quiz #9: Recommendation Systems

Name: GRADER

ID: \_\_\_\_\_

- 1) (4pts) Using item-based CF (N=2) and the Pearson correlation, calculate the rating prediction of item 3 for user 1 using average ratings based on all ratings

$$w_{i,j} = \frac{\sum_{u \in U} (r_{u,i} - \bar{r}_i)(r_{u,j} - \bar{r}_j)}{\sqrt{\sum_{u \in U} (r_{u,i} - \bar{r}_i)^2} \sqrt{\sum_{u \in U} (r_{u,j} - \bar{r}_j)^2}} \quad P_{u,i} = \frac{\sum_{n \in N} r_{u,n} w_{i,n}}{\sum_{n \in N} |w_{i,n}|}$$

	I1	I2	I3	I4
U1	2	1		3
U2	3	?	5	2
U3		4	2	3
U4	5	3	1	

avg 10/3 8/3 8/3 8/3

$$\{U_2, U_4\} \rightarrow w_{1,3} = \frac{(3 - 10/3)(5 - 8/3) + (5 - 10/3)(1 - 8/3)}{\sqrt{(3 - 10/3)^2 + (5 - 10/3)^2} \times \sqrt{(5 - 8/3)^2 + (1 - 8/3)^2}} \approx -0.73$$

$$\{U_3, U_4\} \rightarrow w_{2,3} = \frac{(4 - 8/3)(2 - 8/3) + (3 - 8/3)(1 - 8/3)}{\sqrt{(4 - 8/3)^2 + (3 - 8/3)^2} \times \sqrt{(2 - 8/3)^2 + (1 - 8/3)^2}} \approx -0.59$$

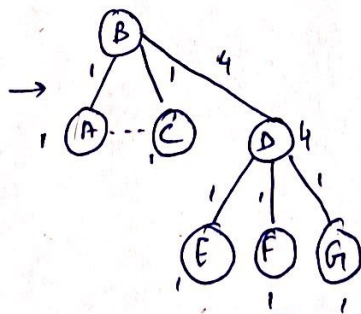
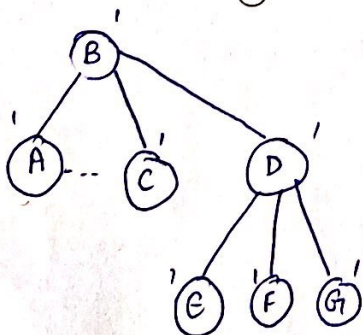
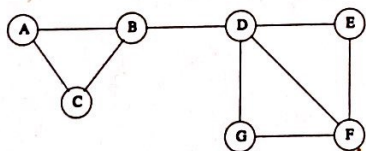
$$\{U_2, U_3\} \rightarrow w_{4,3} = \frac{(5 - 8/3)(2 - 8/3) + (2 - 8/3)(3 - 8/3)}{\sqrt{(5 - 8/3)^2 + (2 - 8/3)^2} \times \sqrt{(2 - 8/3)^2 + (3 - 8/3)^2}} \approx -0.98$$

- 2) (2pts) Briefly explain the difference between feature augmentation and meta-level hybrid using examples.

**Feature augmentation** - generates a new feature for each item by using the recommendation logic of the contributing domain. eg:- content-based model over the training data & then using that model to generate ratings for unrated items.

**Meta-level** - model learned by one recommender as input for another. example - restaurant recommender that uses naive bayes techniques to build models of user pref in a content-based way.

- 3) (4 pts) For node B, use the Girvan-Newman algorithm to calculate the betweenness of each edge (do this for node B ONLY). You need to show the steps of your calculation.



- 1) Perform a BFS of the graph starting node B

- 2) Label each node by number of shortest paths that each from the root.

- 3) Each node other than the root gets credit of 1.

- 4) Each node that is not the leaf gets credit = 1 + sum of credit of edges.

- 5) Credit is shared for node with more than 1 parent.

[1 POINT]

[1 POINT]

N=2  
Choose top 2 Pearson Correlations  $w_{13}, w_{23}$

$$P_{U1,I3} = \text{[1 POINT]}$$

$$= \frac{w_{13} \times r_{11} + w_{23} \times r_{12}}{|w_{13}| + |w_{23}|}$$

$$= \frac{-0.73 \times 2 + (-0.59) \times 1}{|-0.73| + |-0.59|}$$

$$\approx -1.55$$