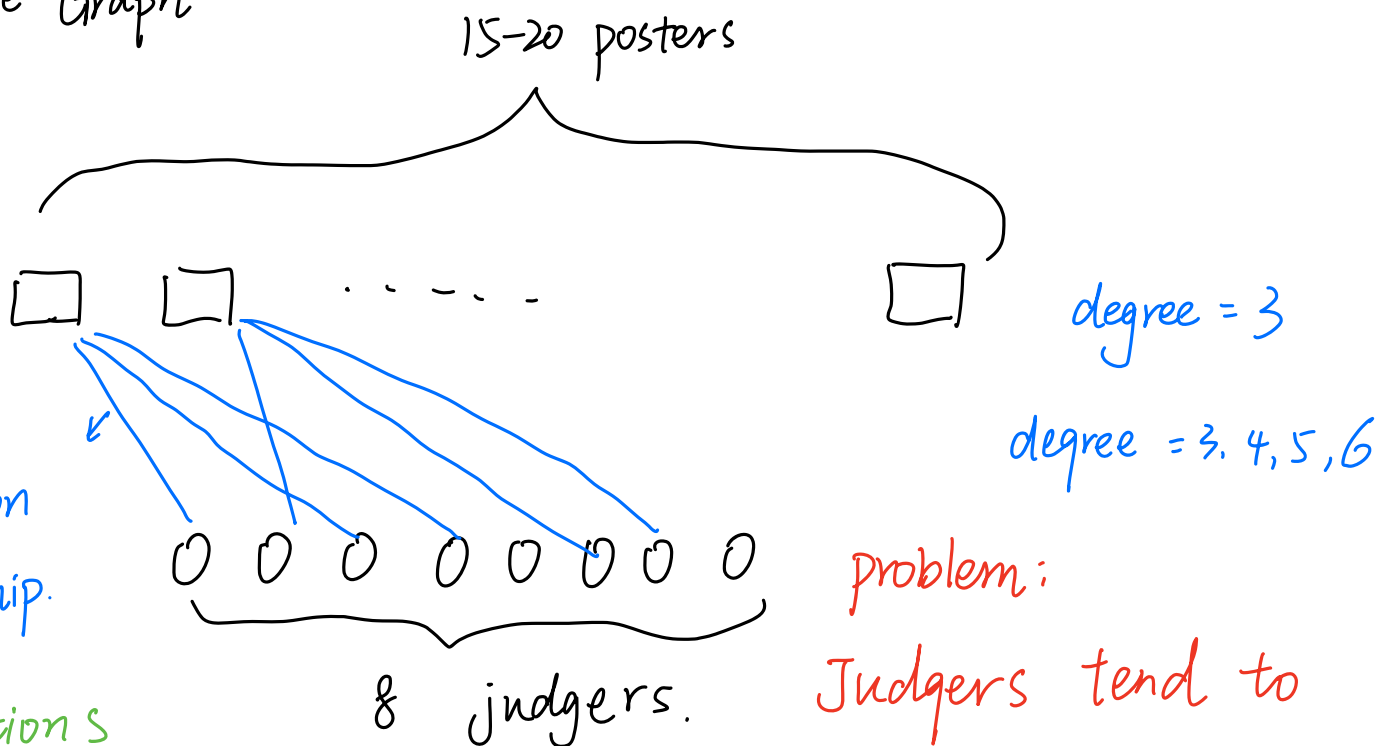
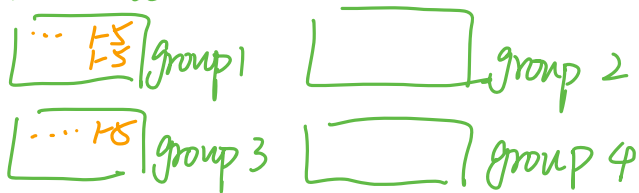


# Bipartite Graph



14 Questions



Judgement Matrix  $X$  (for each Question).

Z-score Normalization

$$z = \frac{(X - \text{mean})}{\text{standard deviation}}$$

	Posters														
	1	2	...	...	...	...	...	...	...	...	...	...	...	...	15.
judgers	1	3	0	4	2	...	...	...	...	...	...	...	...	...	0.
	2	2		3											
	3														
	4														
	5														
	6														
	7														
	8														

$$\rightarrow \mu_{1,61} \rightarrow z_1 = \begin{pmatrix} z_{11} \\ z_{12} \\ \vdots \\ z_{1,15} \end{pmatrix}^T$$

$$\rightarrow \mu_{2,62} \rightarrow z_2$$

$$\rightarrow \mu_{3,63} \rightarrow z_3$$

predictive  
Translation property

sparse Matrix

$$\rightarrow \mu_{8,68} \rightarrow z_8$$

$\Rightarrow$

$$Z = \begin{bmatrix} z_1 \\ z_2 \\ \vdots \\ z_8 \end{bmatrix} = \begin{bmatrix} z_{11} & z_{12} & \dots & z_{15} \\ \vdots & \vdots & & \vdots \\ z_{81} & z_{82} & \dots & z_{85} \end{bmatrix}_{8 \times 15}$$

Normalized Judgement Matrix

$\bar{z}_1$   $\bar{z}_2$   $\bar{z}_{15}$

$$\mu_i = \frac{\sum_j x_{ij}}{n_i} \quad \sigma_i = \sqrt{\frac{\sum_j (x_{ij} - \mu_i)^2}{n_i}}$$

$n_i$ : # of non-zero element in  $i$ th row

$$z_{ij} = \begin{cases} \frac{x_{ij} - \mu_i}{\sigma_i} & \text{if } x_{ij} \neq 0 \\ 0 & \text{if } x_{ij} = 0 \end{cases}$$

Re-scaling Normalized Scores  $\rightarrow$  Make scores lies in range  $[0, 5]$ .

Mix-Max Scaling

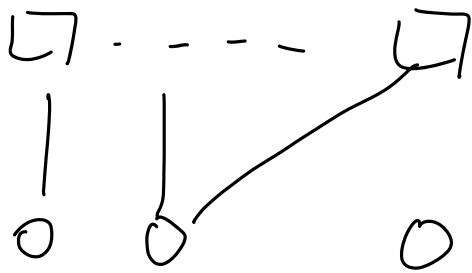
$$\text{New Score} = 1 + 4 \times \frac{\text{Normalized Score} - \text{Min Normalized Score}}{\text{Max Normalized Score} - \text{Min Normalized Score}}$$

## Inherently Bias in Nature

Cannot find a normalizing technique that make these judgements absolutely fair (achieve max fairness through modeling)

Consider extreme cases: (Number of judges for each poster)

① 1



No way to compare poster quality

② 8



Do not need to do anything

3 is somewhere in between

## Sensitivity Issue

Sample size is too small. Any fluctuation of a single data point may greatly impact the result.

Still have problem : Although judges are randomly assigned to several posters.

One may be assigned to posters that are all have high quality

$$\begin{bmatrix} x & 0 & x \\ 0 & 0 & 0 \end{bmatrix} \rightarrow \begin{bmatrix} x & x & x & x \\ x & x & x & x \end{bmatrix}$$

Any way to make imputation? sparse matrix  $\rightarrow$  full-value matrix  
predict the unknown scores?

Hypothesis Testing: The scoring habits of judges are statistically significant?

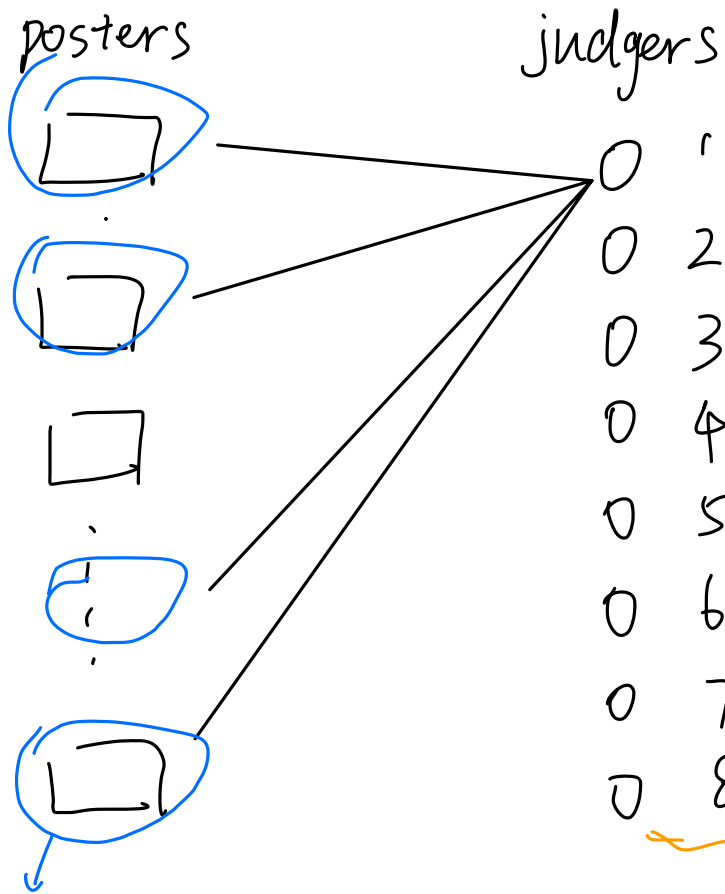
## Mixed Effect Model

$$Y_{ij} = \beta_0 + a_i + b_j + \varepsilon_{ij}$$

$\swarrow$  score<sub>ij</sub>       $\downarrow$  overall average score       $\downarrow$  random effect for judges       $\downarrow$  random effect for posters       $\rightarrow$  error residual (variance that are not explained by judges and posters)

Point estimate  $\Rightarrow$  Confidence Interval Estimate

# Algorithm Way



Reorder the position of posters  
for each iteration

iteration →

	0	2	07
	0	1	05
Iteration	:	4	
(one loop)	:	5	:
	:	:	:
	:	:	:
	:	:	:
	:	:	:

Different  
permutation  
of judges.