

Association Rule Learning

Apriori Intuition

ARL - What is it all about ?

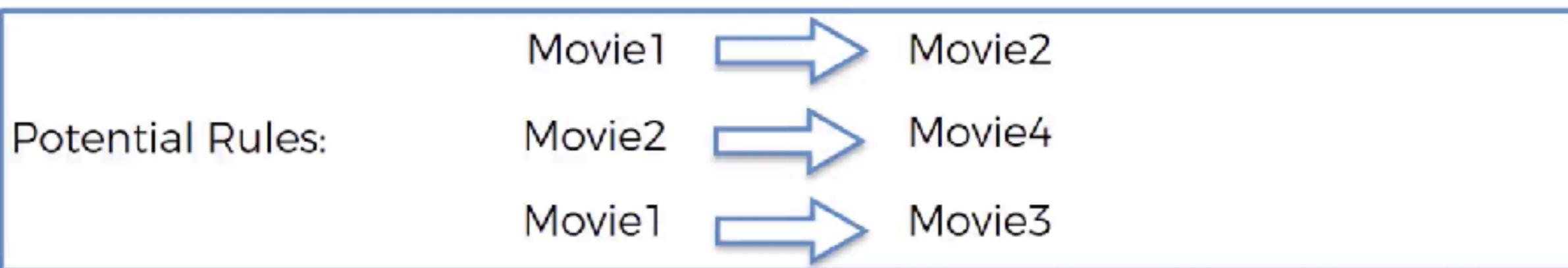


ARL - What is it all about ?

People who bought also bought ...

ARL - Movie Recommendation

User ID	Movies liked
46578	Movie1, Movie2, Movie3, Movie4
98989	Movie1, Movie2
71527	Movie1, Movie2, Movie4
78981	Movie1, Movie2
89192	Movie2, Movie4
61557	Movie1, Movie3



ARL - Market Basket Optimisation

Transaction ID	Products purchased
46578	Burgers, French Fries, Vegetables
98989	Burgers, French Fries, Ketchup
71527	Vegetables, Fruits
78981	Pasta, Fruits, Butter, Vegetables
89192	Burgers, Pasta, French Fries
61557	Fruits, Orange Juice, Vegetables
87923	Burgers, French Fries, Ketchup, Mayo

Potential Rules:

Burgers → French Fries

Vegetables → Fruits

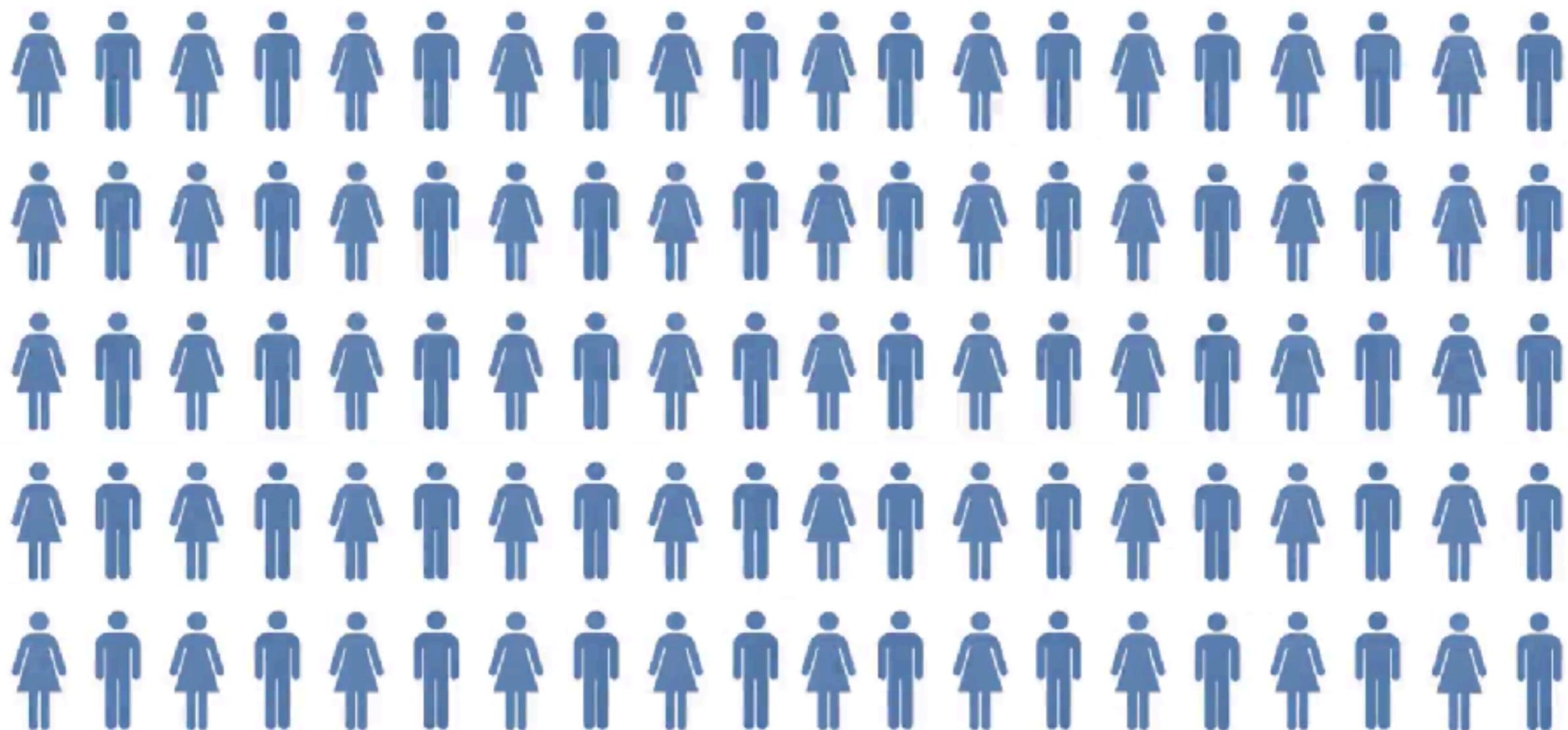
Burgers, French Fries → Ketchup

Apriori - Support

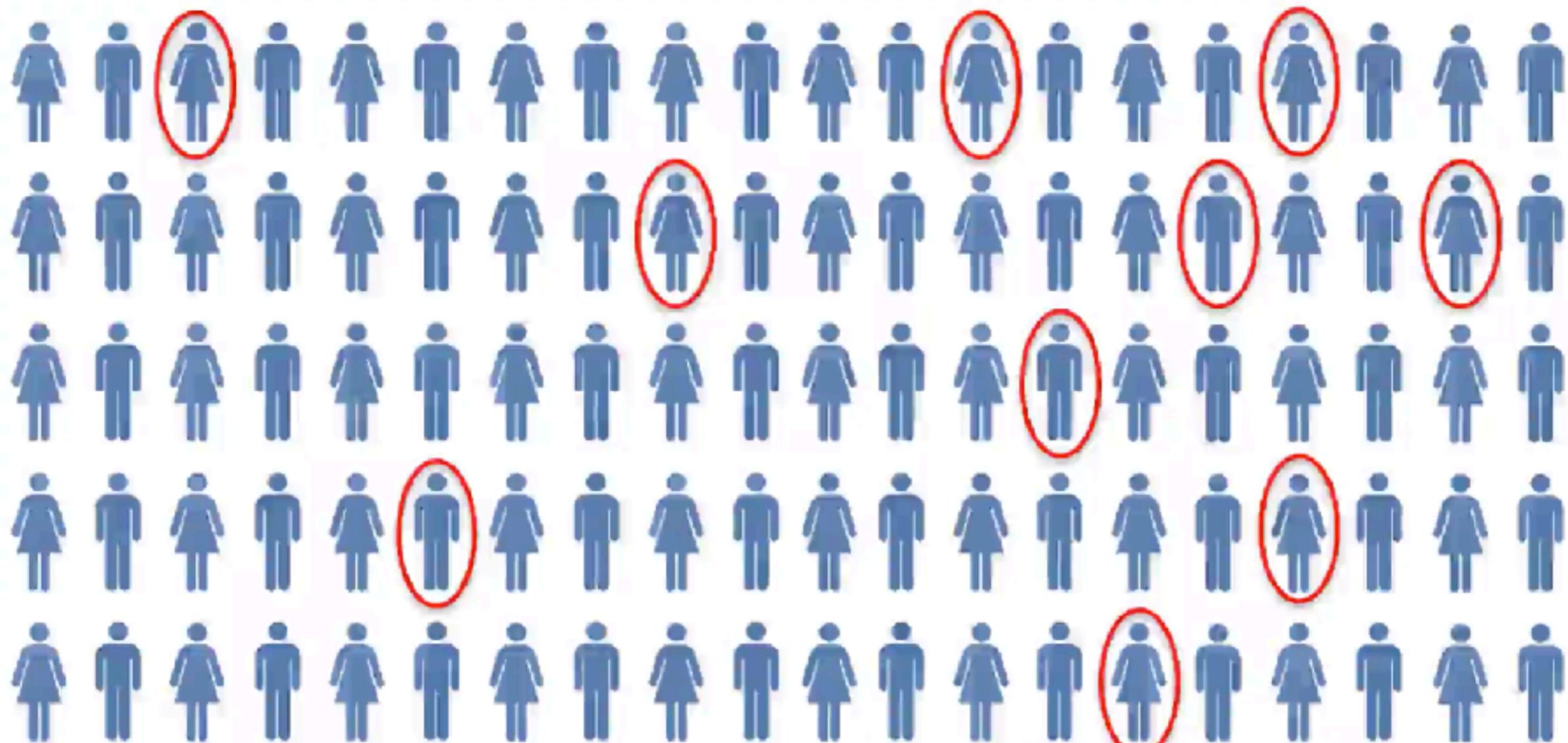
Movie Recommendation: $\text{support}(\mathbf{M}) = \frac{\# \text{ user watchlists containing } \mathbf{M}}{\# \text{ user watchlists}}$

Market Basket Optimisation: $\text{support}(\mathbf{I}) = \frac{\# \text{ transactions containing } \mathbf{I}}{\# \text{ transactions}}$

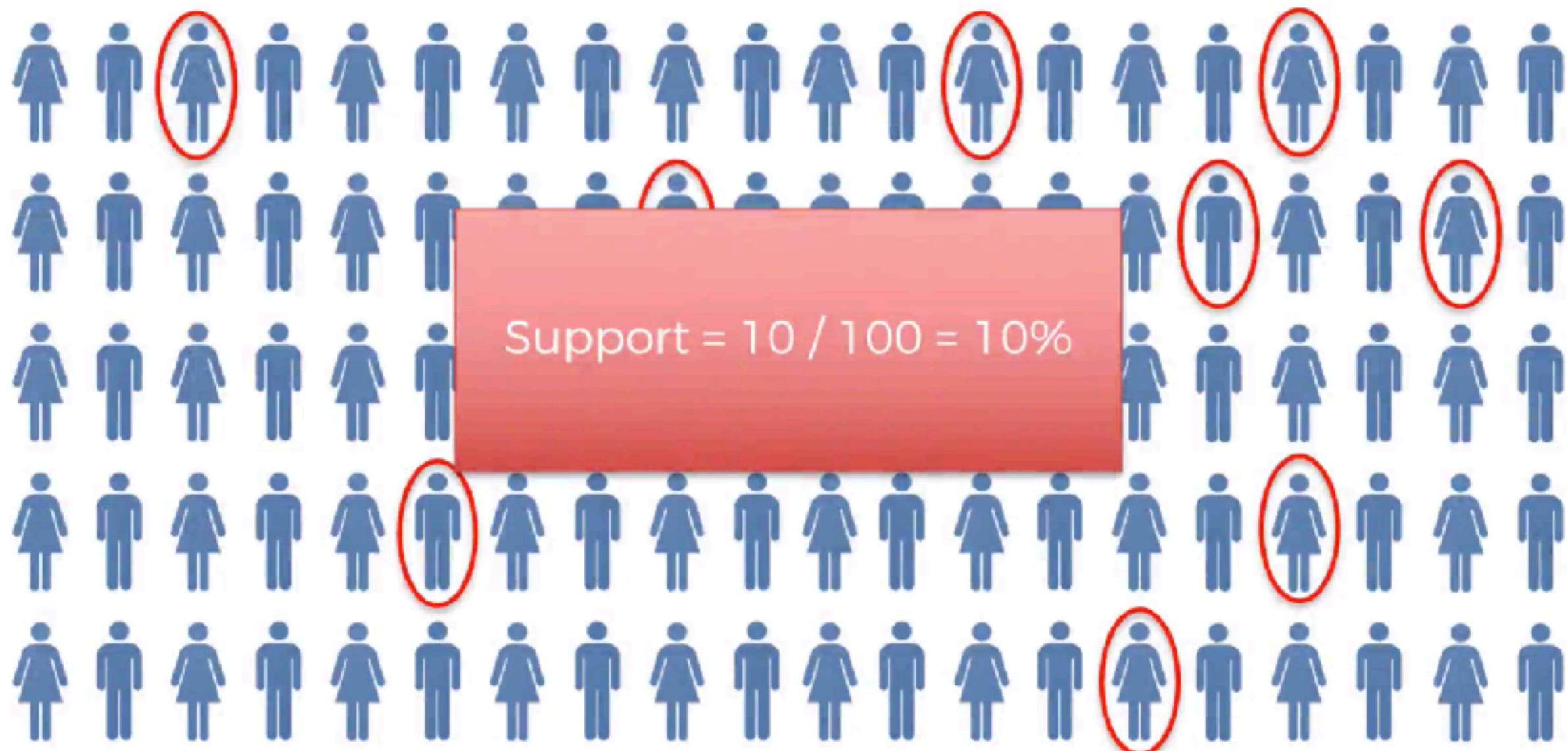
Apriori - Support



Apriori - Support



Apriori - Support



Apriori - Confidence

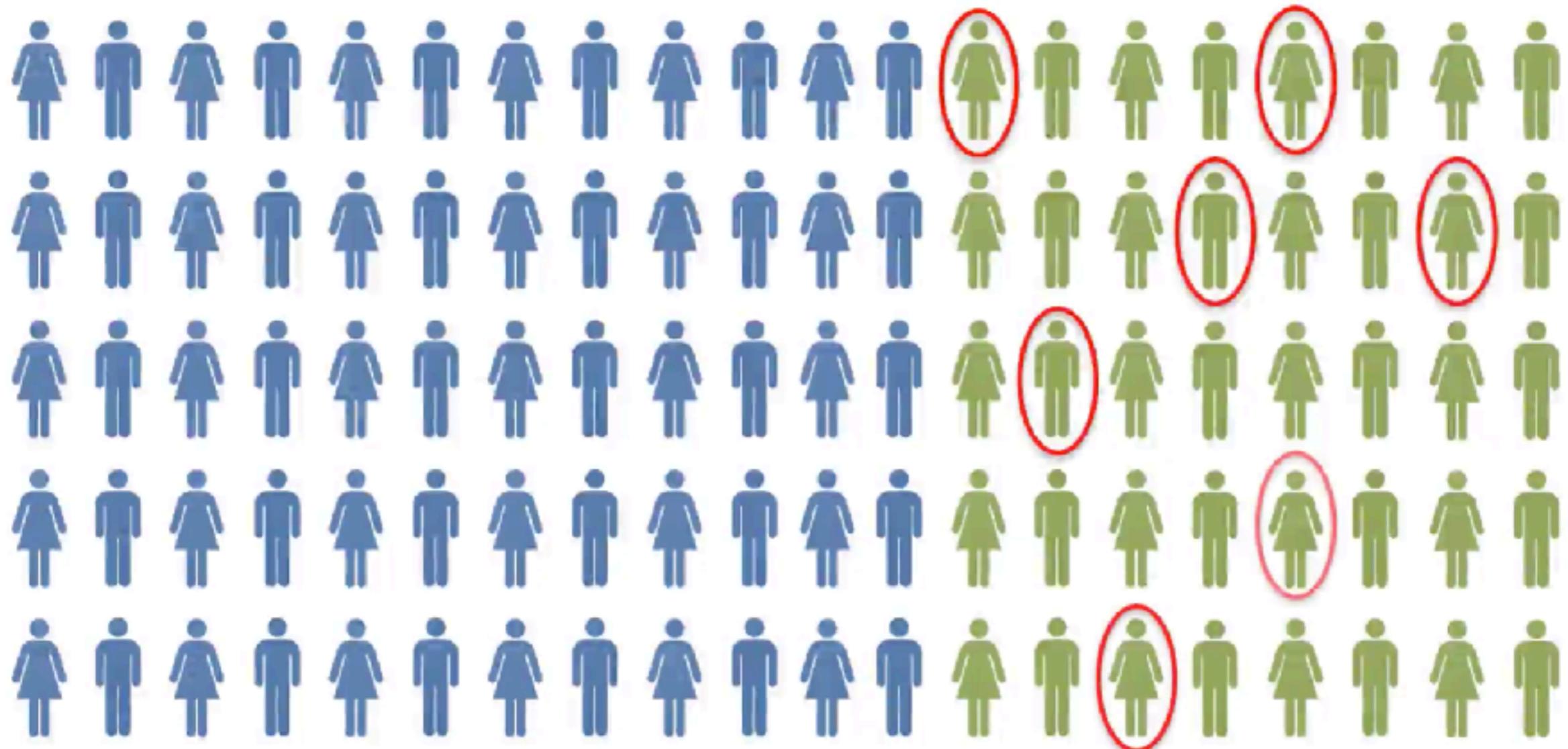
Movie Recommendation: $\text{confidence}(\mathbf{M}_1 \rightarrow \mathbf{M}_2) = \frac{\# \text{ user watchlists containing } \mathbf{M}_1 \text{ and } \mathbf{M}_2}{\# \text{ user watchlists containing } \mathbf{M}_1}$

Market Basket Optimisation: $\text{confidence}(\mathbf{l}_1 \rightarrow \mathbf{l}_2) = \frac{\# \text{ transactions containing } \mathbf{l}_1 \text{ and } \mathbf{l}_2}{\# \text{ transactions containing } \mathbf{l}_1}$

Apriori - Confidence



Apriori - Confidence



Apriori - Confidence



Apriori - Lift

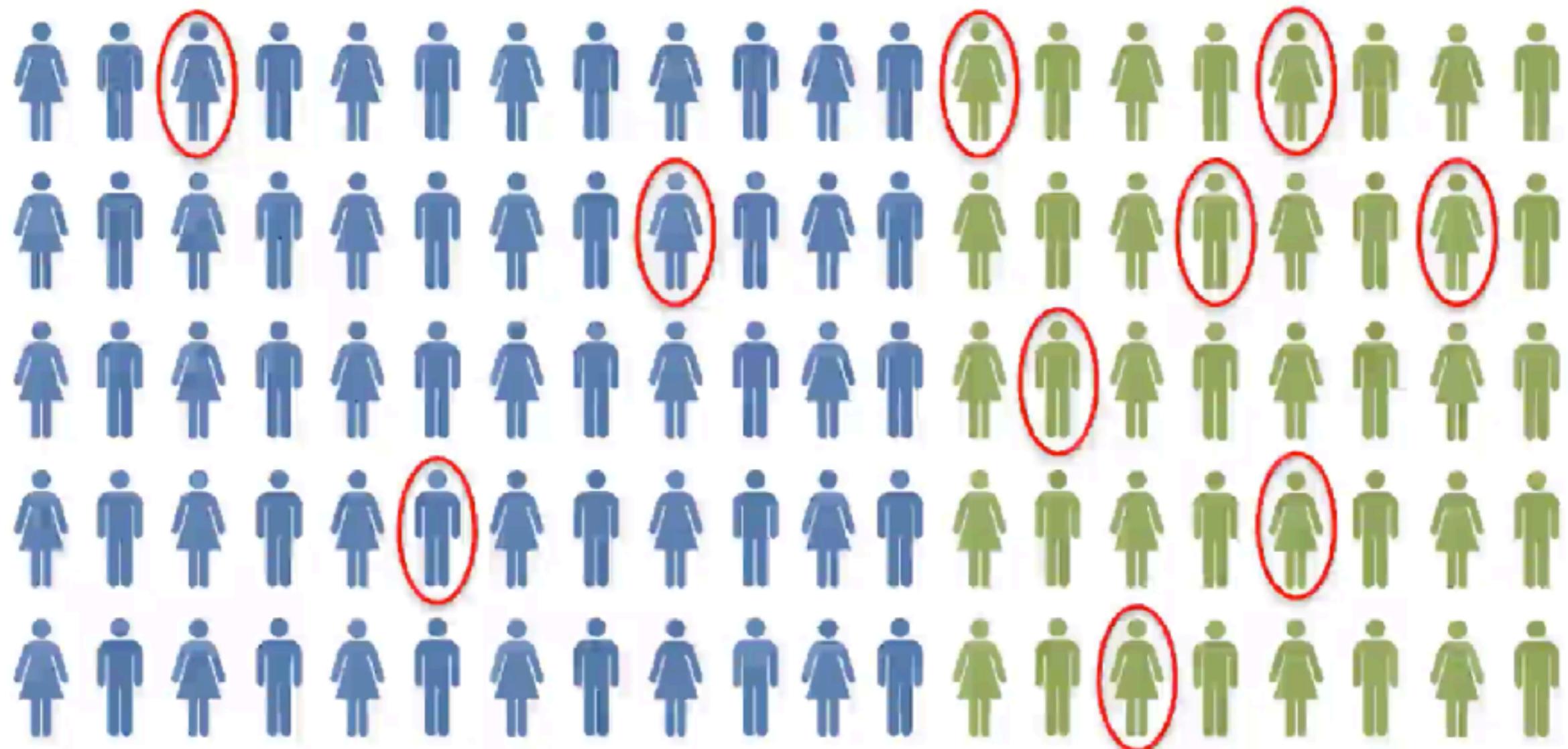
Movie Recommendation:

$$\text{lift}(\mathcal{M}_1 \rightarrow \mathcal{M}_2) = \frac{\text{confidence}(\mathcal{M}_1 \rightarrow \mathcal{M}_2)}{\text{support}(\mathcal{M}_2)}$$

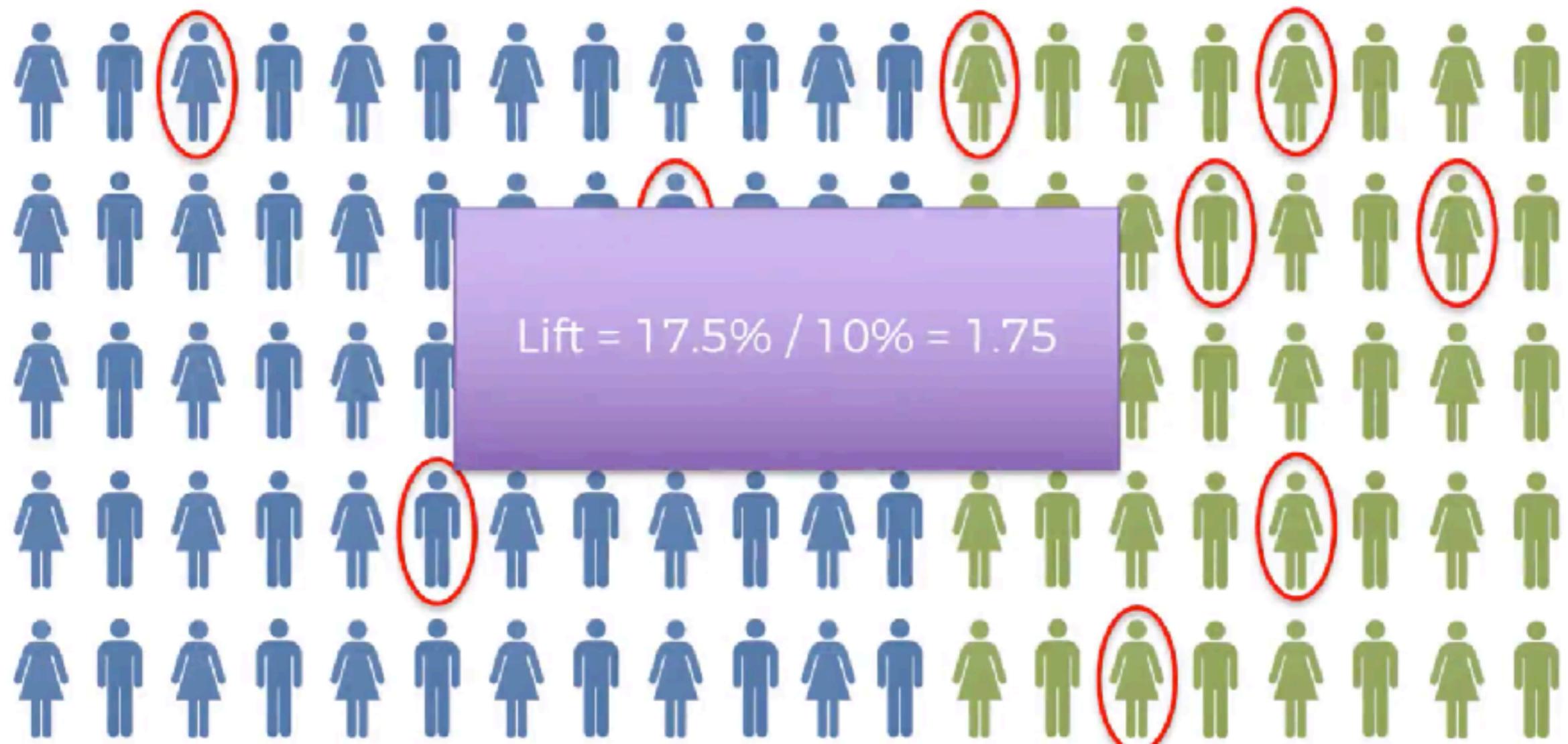
Market Basket Optimisation:

$$\text{lift}(I_1 \rightarrow I_2) = \frac{\text{confidence}(I_1 \rightarrow I_2)}{\text{support}(I_2)}$$

Apriori - Lift



Apriori - Lift



Apriori - Algorithm

Step 1: Set a minimum support and confidence



Step 2: Take all the subsets in transactions having higher support than minimum support



Step 3: Take all the rules of these subsets having higher confidence than minimum confidence



Step 4: Sort the rules by decreasing lift