## **Lecture 8 Clustering Aggregation**

- Clustering: a group of clusters output by some clustering algorithm
- Cluster: A group of points
- Goals of clustering Aggregation
  - Compare clusterings
  - o Combine the information from multiple clusterings to make a new clustering
- Disagreement Distance
  - o Given two clustering's P and C (For two partitions P and C of the dataset)
  - o  $D(P,C) = \sum_{x,y} Ip, c(x,y)$  where
  - $\circ$  Ip, c(x, y) =

1 if P and C disagree which cluster x and y belong to and 0 otherwise

o Formally,

0

$$I_{C,P}(x,y) = \begin{cases} 1 & \text{if } C(x) = C(y) \text{ and } P(x) \neq P(y) \\ & \text{OR} \\ & \text{if } C(x) \neq C(y) \text{ AND } P(x) = P(y) \\ 0 & \text{otherwise} \end{cases}$$

- Disagreement distance is a measure of how different two clusterings of a set of data points are, counting the number of disagreeing object pairs between
- o P(x) is the cluster index in partition P that contains object x
- o C(x) is the cluster index in partition C that contains object x
- Comparing rows in table not cols
- N choose k pairs

$$\bullet \quad \frac{n}{k} = \frac{n!}{k!(n-k)!}$$

## **Object Cluster in C Cluster in P**

- x1
   1

   x2
   1

   x3
   2

   x4
   3

   x5
   3
  - $\bullet \quad (x1, x2):$ 
    - o P: same  $(1 \neq 2) \rightarrow$  different
    - C: same  $(1 = 1) \rightarrow \text{same} \rightarrow \text{Disagree} \rightarrow 1$
  - (x1, x3):
    - $\circ$  P: same (1 = 1)
    - $\circ$  C: different  $(1 \neq 2) \rightarrow$ **Disagree**  $\rightarrow 1$
  - (x1, x4):
    - o P: different
    - $\circ$  C: different  $\rightarrow$  Agree  $\rightarrow$  0

- (x1, x5):
  - o P: different
  - o C: different  $\rightarrow$  Agree  $\rightarrow$  0
- $\bullet \quad (x2, x3):$ 
  - o P: different  $(2 \neq 1)$
  - C: different  $(1 \neq 2) \rightarrow Agree \rightarrow 0$
- (x2, x4):
  - o P: different
  - o C: different  $\rightarrow$  Agree  $\rightarrow$  0
- (x2, x5):
  - o P: different
  - o C: different  $\rightarrow$  Agree  $\rightarrow$  0
- (x3, x4):
  - o P: different
  - o C: different  $\rightarrow$  Agree  $\rightarrow$  0
- (x3, x5):
  - o P: different
  - $\circ$  C: different  $\rightarrow$  Agree  $\rightarrow$  0
- (x4, x5):
  - $\circ$  P: different  $(3 \neq 4)$
  - $\circ$  C: same  $(3 = 3) \rightarrow$  Disagree  $\rightarrow 1$

So the total disagreement distance:

$$\circ$$
 D(P,C)=1+1+1=3

- Aggregate Clustering
  - Can identify best number of clusters
  - o Can handle and detect outliers
  - o Combining clusterings can produce better results
  - Preserves privacy
  - o Problem is in NP Hard