

# **Unsupervised Learning**



#### K-means

 defining clusters so that the total intra-cluster variation (known as total within-cluster variation) is minimized

$$W(C_k) = \sum_{x_i \in C_k} (x_i - \mu_k)^2$$

#### where:

- $x_i$  is a data point belonging to the cluster  $C_k$
- $\mu_k$  is the mean value of the points assigned to the cluster  $C_k$



### K-means

- Each observation (x\_i) is assigned to a given cluster such that the sum of squares (SS) distance of the observation to their assigned cluster centers (μk) is minimized.
- We define the total within-cluster variation as follows:

$$tot.\,withiness = \sum_{k=1}^k W(C_k) = \sum_{k=1}^k \sum_{x_i \in C_k} (x_i - \mu_k)^2$$

• The total within-cluster sum of square measures the compactness (i.e goodness) of the clustering and we want it to be as small as possible.



## **Algorithm**

- Specify the number of clusters (K) to be created (by the analyst)
- Select randomly k objects from the data set as the initial cluster centers or means
- Assigns each observation to their closest centroid, based on the Euclidean distance between the object and the centroid
- For each of the k clusters update the cluster centroid by calculating the new mean values of all the data points in the cluster. The centroid of a Kth cluster is a vector of length *p* containing the means of all variables for the observations in the kth cluster; *p* is the number of variables.
- Iteratively minimize the total within sum of square (Eq. 7). That is, iterate steps 3 and 4 until the cluster assignments stop changing or the maximum number of iterations is reached. By default, the R software uses 10 as the default value for the maximum number of iterations.

## Output

The output of kmeans is a list with several bits of information. The most important being:

- **cluster**: A vector of integers (from 1:k) indicating the cluster to which each point is allocated.
- centers: A matrix of cluster centers.
- totss: The total sum of squares.
- withinss: Vector of within-cluster sum of squares, one component per cluster.
- tot.withinss : Total within-cluster sum of squares, i.e. sum(withinss).
- betweenss: The between-cluster sum of squares, i.e. \$totss-tot.withinss\$.
- size: The number of points in each cluster.



# Script

Check the R script provided with this lecture



# Other examples



- K-means clustering with Twitter Data
- http://rstudio-pubsstatic.s3.amazonaws.com/5983\_af66eca6775f4528a72b8e243 a6ecf2d.html

