







### Unsupervised Learning: Clustering



#### Things you will learn after this Session



#### **Unsupervised Learning: Clustering**

- What is Clustering?
- Use Case of Clustering
- Types of Clustering



#### What is Clustering?

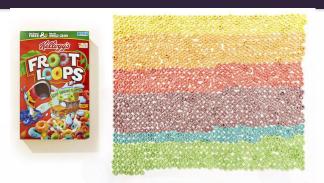
"Clustering is the process of dividing the datasets into groups, consisting of similar data-points"

- Points in the same group are as similar as possible
- Points in different group are as dissimilar as possible





#### **Example of Clustering**



**Example 1**: Cluster of different colors of FROOT LOOPS



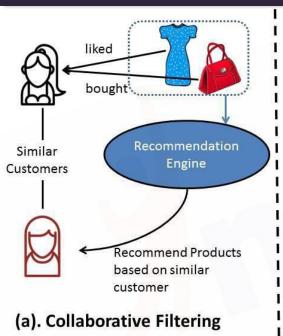
**Example 2:** Cluster of different colors of Fruits

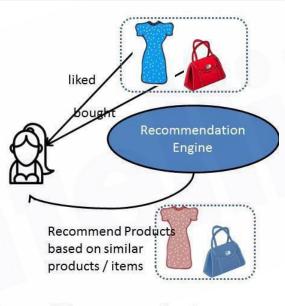


**Example 3:** Cluster of different types of Garbage



#### **Use-Case of Clustering**









(b). Content Filtering



#### Where is it used?

## amazon

## NETFLIX





**Exclusive Clustering** 

**Overlapping Clustering** 

**Hierarchical Clustering** 



**Exclusive Clustering** 

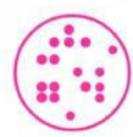
**Overlapping Clustering** 

**Hierarchical Clustering** 

#### **Exclusive Clustering**

- Each data object can only exist in one cluster
- For Example: K-Means Clustering







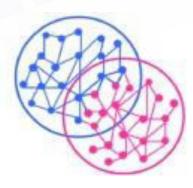
**Exclusive Clustering** 

**Overlapping Clustering** 

**Hierarchical Clustering** 

#### **Overlapping Clustering**

- Allows data objects to be grouped in 2 or more clusters
- For Example: Fuzzy/ C-Means Clustering
- In Fuzzy clustering every data object belongs to every cluster



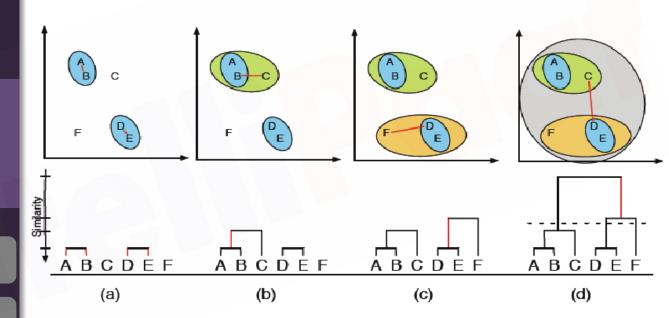


**Exclusive Clustering** 

**Overlapping Clustering** 

**Hierarchical Clustering** 

#### **Hierarchical Clustering**







### **Understanding K – Means Clustering**



#### Things you will learn after this Session



#### **Understanding K – Means Clustering**

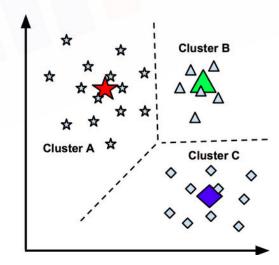
- What is K Means Clustering?
- Where can you use it?
- Step by step calculation of K-Means Clustering Algorithm



# What is K-Means Clustering?

"K-Means is a clustering algorithm which focuses on grouping similar elements or data points into a cluster."

**NOTE:** 'K' in K-Means represent the number of clusters





# What is K-Means Clustering?



Pile of Laundry



#### **Business Application of K-Means**

- Behavioural Segmentation
- Inventory Categorization

- Sorting sensor measurements
- Detecting bots or anomalies

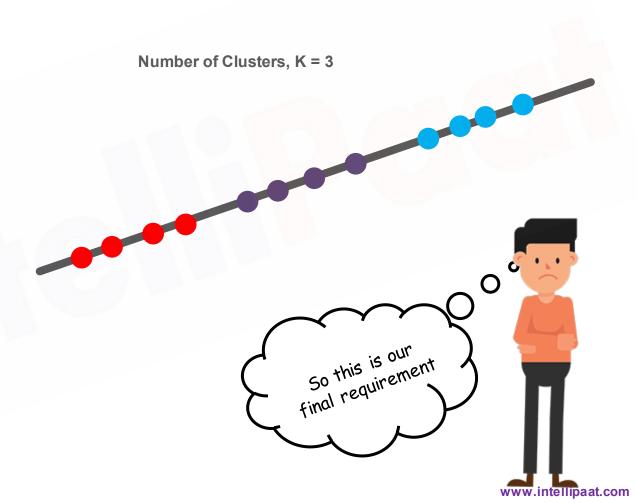






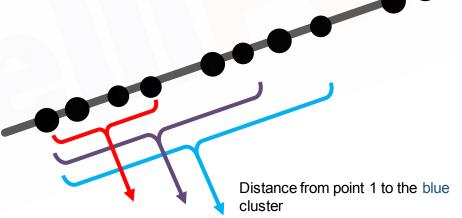
Number of Clusters = 3







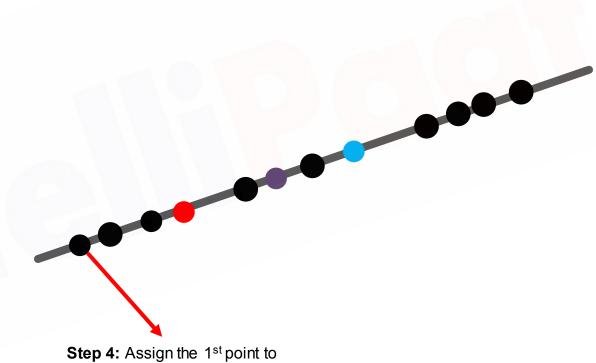
- Step 1: Select the number of clusters to be identified, i.e select a value for K =3 in this case
- Step 2: Randomly select 3 distinct data point
- Step 3: Measure the distance between the 1st point and selected 3 clusters



Distance from point 1 to the red cluster

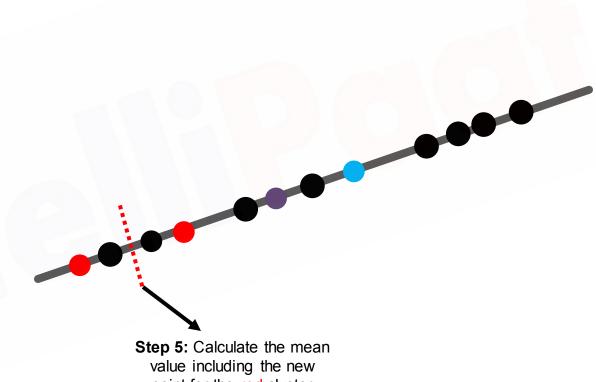
Distance from point 1 to the purple cluster





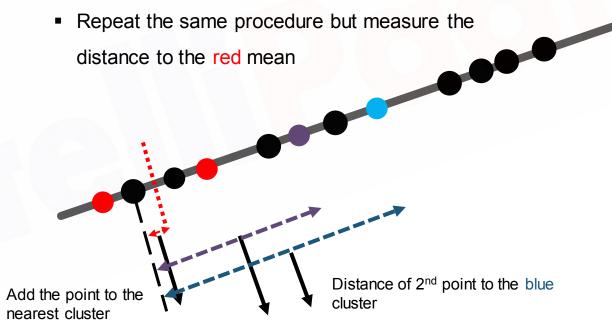
**Step 4:** Assign the 1<sup>st</sup> point to nearest cluster (red in this case).







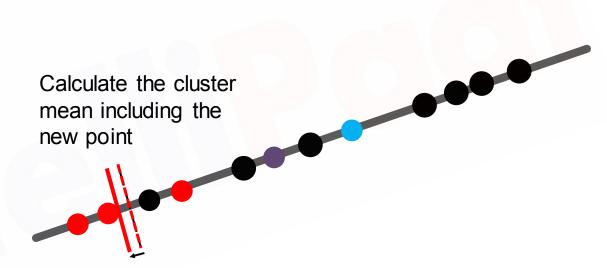
### Find to which cluster does point 2 belongs to, how?



Distance of 2<sup>nd</sup> point to the red cluster

Distance of 2<sup>nd</sup> point to the purple cluster

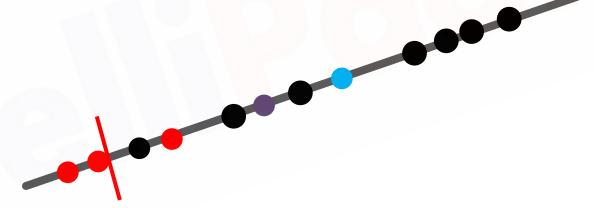




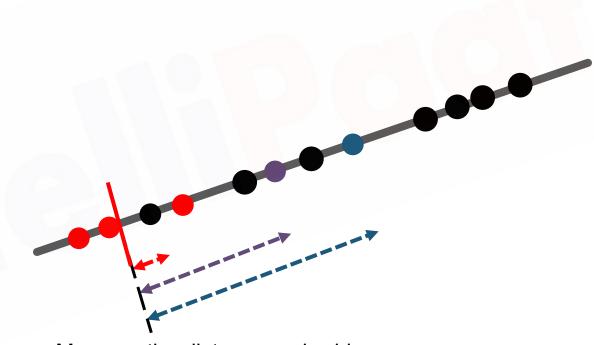


#### Find to which cluster does point 3 belongs to, how?

 Repeat the same procedure but measure the distance from the new red mean

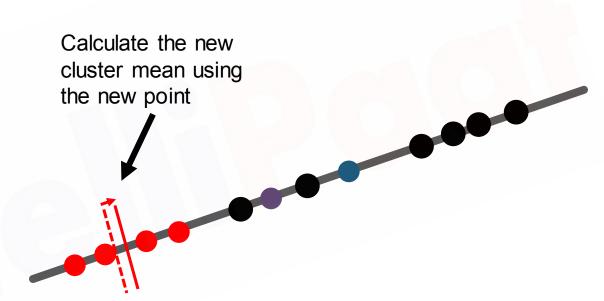






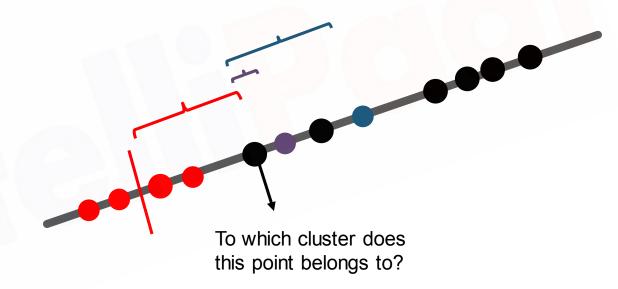
Measure the distance and add the 3<sup>rd</sup> point to the cluster(red) having the minimum distance







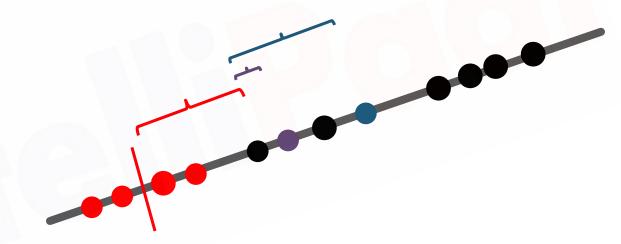
- Measure the distance
- Assign the point to the nearest cluster
- Calculate the cluster mean using the new point



REPEAT THE STEPS AGAIN...

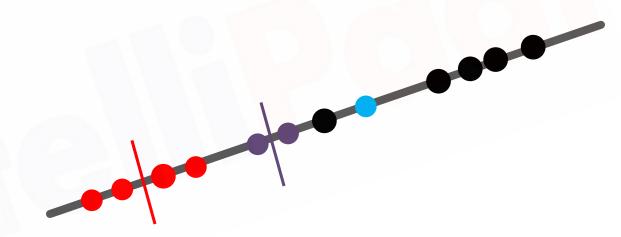


- Measure the distance
- Assign the point to the nearest cluster
- Calculate the cluster mean using the new point



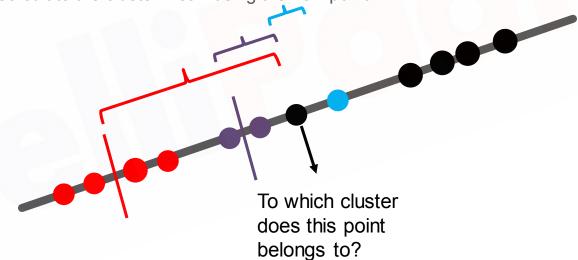


- Measure the distance
- Assign the point to the nearest cluster
- Calculate the cluster mean using the new point





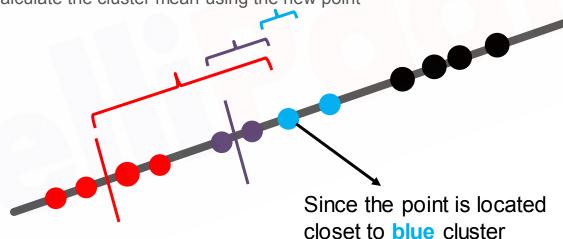
- Measure the distance from the cluster mean (centroids)
- Assign the point to the nearest cluster
- Calculate the cluster mean using the new point



REPEAT THE SAME STEPS UNTILL ALL THE CLUSTERS ARE ASSIGNED...

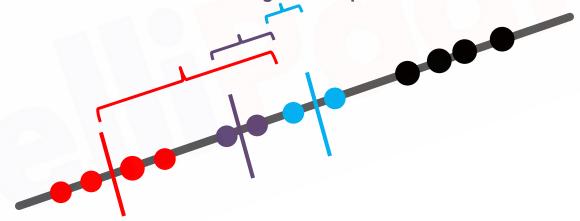


- Measure the distance from the cluster mean (centroids)
- Assign the point to the nearest cluster
- Calculate the cluster mean using the new point

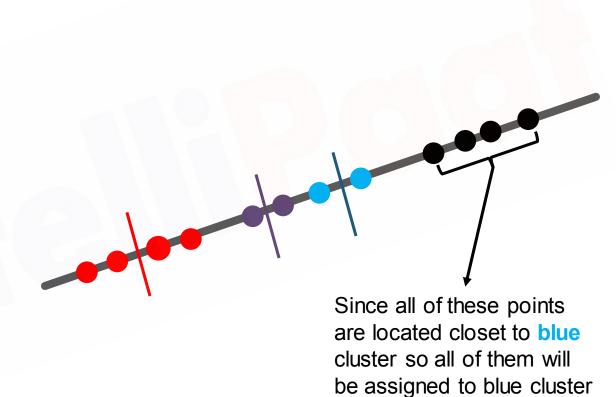




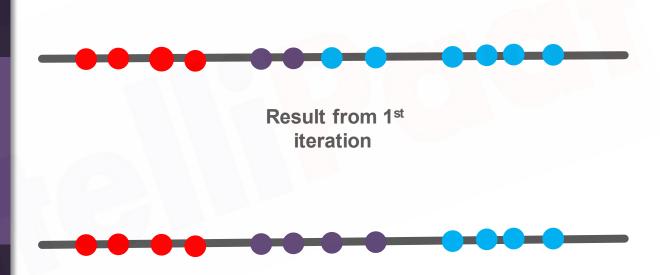
- Measure the distance from the cluster mean (centroids)
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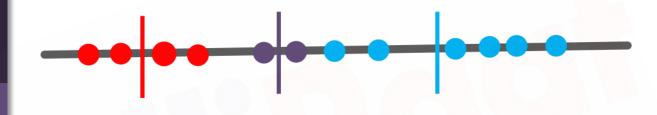






Original/Expected Result





#### Total variation within the cluster

According to the K-Means Algorithm it iterates over again and again unless and until the data points within each cluster stops changing



**Iteration 2:** Again we will start from the scratch. But this time we will select different initial random point (as compared to the 1st iteration)



- Step 1: Select the number of clusters to be identified, i.e. K =3 in this case
- Step 2: Randomly select 3 distinct data point
- Step 3: Measure the distance between the 1st point and selected 3 clusters

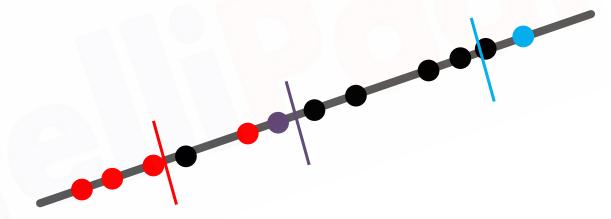


Algorithm picks 3 initial clusters and adds the remaining points to the cluster with the nearest mean, and again recalculating the mean each time a new point is added to the cluster





Algorithm picks 3 initial clusters and adds the remaining points to the cluster with the nearest mean, and again recalculating the mean each time a new point is added to the cluster



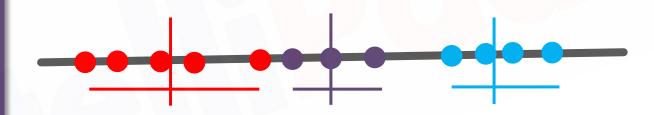


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Total variation within the cluster

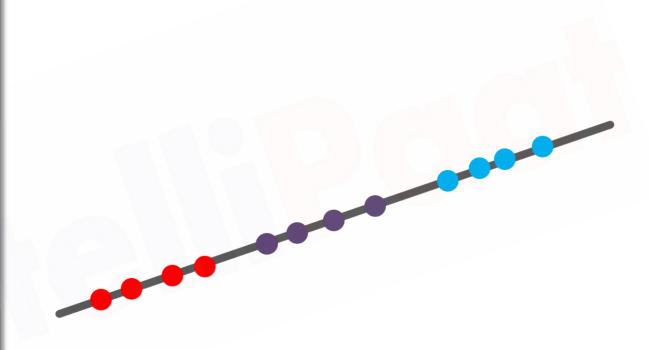


**Iteration 3:** Again we will start from the scratch and select different initial random point (as compared to 1<sup>st</sup> and 2<sup>nd</sup> iteration)



Pick 3 initial clusters





Cluster the remaining points

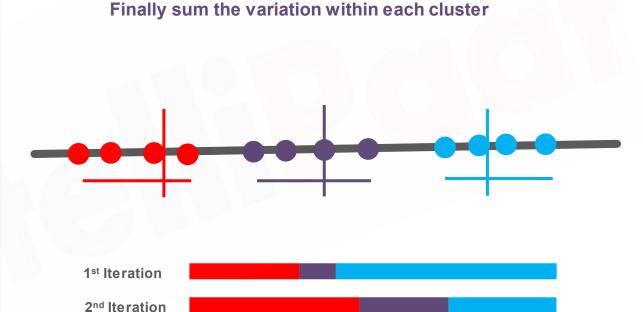


Finally sum the variation within each cluster



Total variation within the cluster





3rd Iteration



# But how to find the value of 'K'?



#### How to find the value of 'K'?

In the previous scenario k = 3 was known, but what-if we don't know the exact value of k?





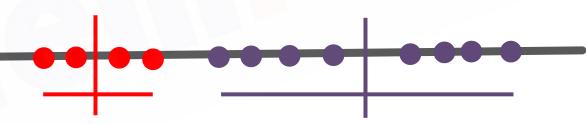
For finding the value of k, you will use hit and trail method, starting from K = 1



K=1 is the worst case scenario, even you cross-verify it with its total variation(all red)



Now try with K = 2



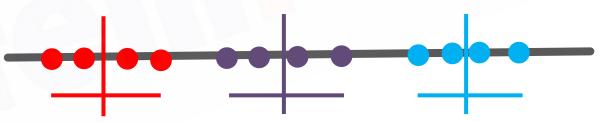
K=2 is still better then K=1 (Total Variation)

K = 1

K = 2







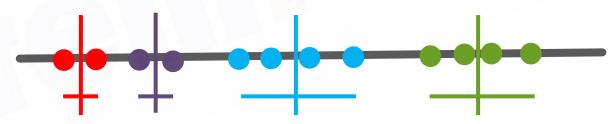
K=3 is still better then K=2 (Total Variation)

```
K = 1
K = 2
K = 3
```



#### Now try with K = 4

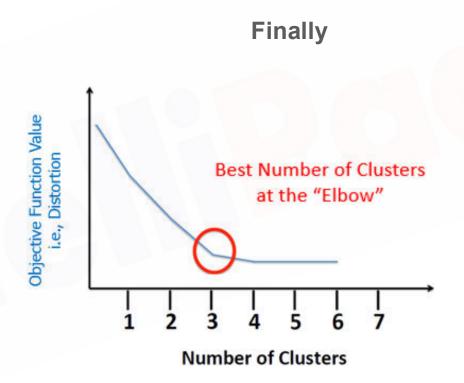
- Every time you increase the cluster the variation decreases
- If no. of clusters = no. of data points then in that case the variation = 0



K=4 is still better then K=3 (Total Variation)

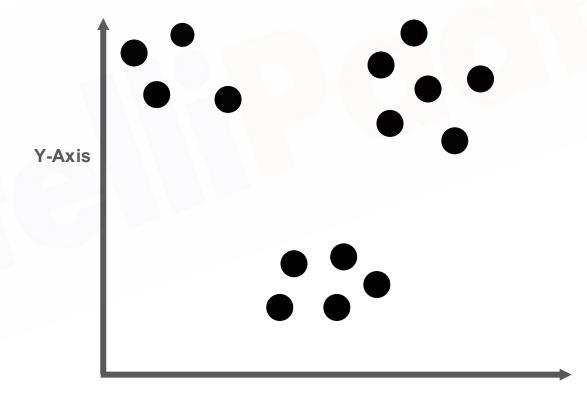






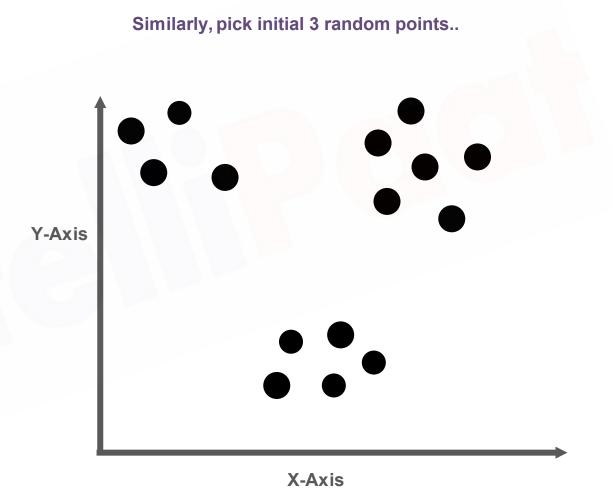


Now what if we have our data plotted on the X and Y axis



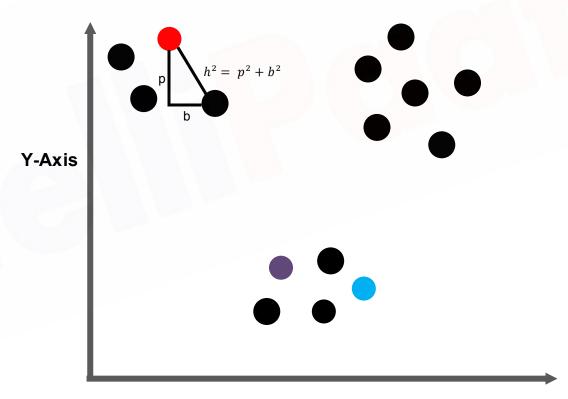
X-Axis





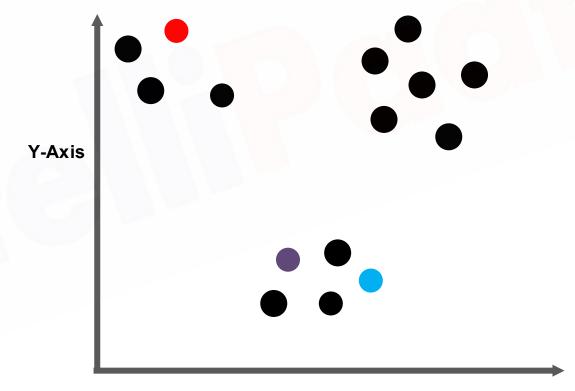


We will be using the Euclidean distance (in 2D its same as that of a Pythagorean Theorem)



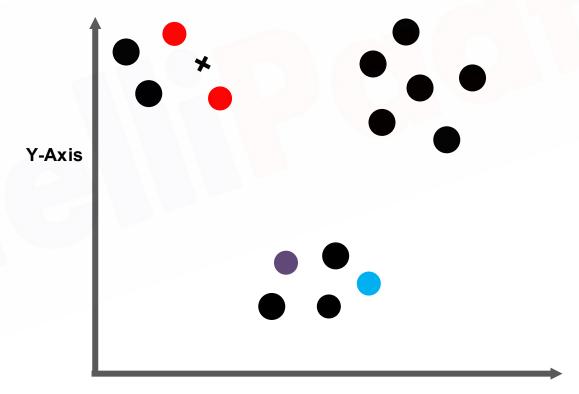






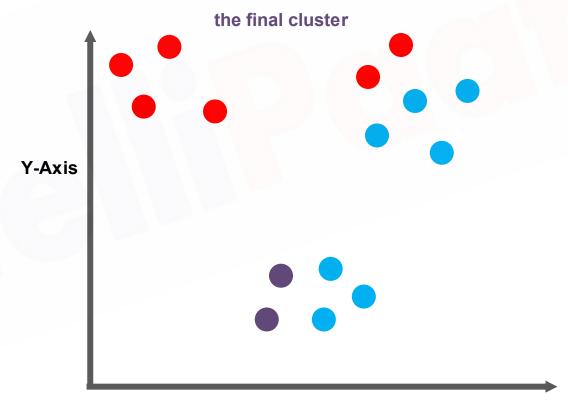


### Finally calculate the centroid (mean of cluster) including the new point





Finally in first iteration you get something like this...again you have to iterate this process to get





#### **Summarizing the K-Means Algorithm**

randomly chose k examples as initial centroids while true:
 create k clusters by assigning each
 example to closest centroid
 compute k new centroids by averaging
 examples in each cluster
 if centroids don't change:
 break





#### K-Means Clustering: Demo



#### Things you will learn after this Session



#### K-Means Clustering: Demo

- K Means Clustering using Python
- K Means Clustering using sklearn

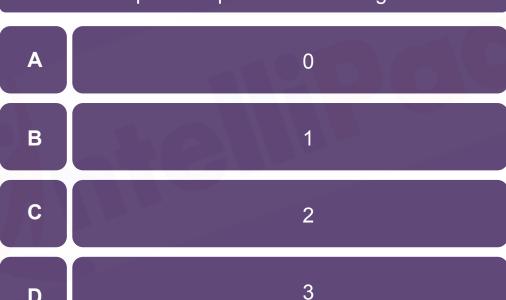






### Quiz 1

What is the minimum no. of variables/ features required to perform clustering?







#### Answer 1

What is the minimum no. of variables/ features required to perform clustering?







### Quiz 2

In which of the following cases will K-Means clustering fail to give good results?

A Data points with outliers

B Data points with different densities

C Data points with non-convex shapes

D All of the above





#### Answer 2

In which of the following cases will K-Means clustering fail to give good results?

A Data points with outliers

B Data points with different densities

Data points with non-convex shapes

D All of the above





#### Quiz 3

Assume, you want to cluster 7 observations into 3 clusters using K-Means clustering algorithm. After first iteration clusters, C1, C2, C3 has following observations:

**A** C1: (4,4), C2: (2,2), C3: (7,7)

**B** C1: (6,6), C2: (4,4), C3: (9,9)

C1: (2,2), C2: (0,0), C3: (5,5)

**D** None of these

C1: {(2,2), (4,4), (6,6)}

C2: {(0,4), (4,0)}

C3: {(5,5), (9,9)}

What will be the cluster centroids if you want to proceed for second iteration?





#### Answer 3

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iteration?





### Quiz 4

Customer segmentation is an example of A Classification В Clustering Association None of the above D





#### Answer 4

Customer segmentation is an example of A Classification В Clustering Association None of the above D





### Quiz 5

In K-Means, K stands for \_\_\_\_\_

A Data sets

B Number of clusters

**C** Error function





#### Answer 5

In K-Means, K stands for \_\_\_ A Data sets В Number of clusters **Error function** 







#### www.intellipaat.com



India: +91-7847955955

US: 1-800-216-8930 (TOLL FREE)

sales@intellipaat.com