

Due to high number of stops in the bus route using dynamic programming would lead to very long computational time as the number of sub-problems grows exponentially with the number of stops. Hence the stops were classified into 3 major clusters. So that the dynamic programming can be performed in each small cluster and with reduced complexity.

## 1.0 Dividing the stops into 3 different clusters

### 1.10 K-means clustering algorithm

K-means clustering algorithm, "It is an iterative algorithm that divides the unlabeled dataset into  $k$  different clusters in such a way that each dataset belongs only one group that has similar properties."<sup>1</sup> Distance based measurements are used to identify the similarities between the data points.

The algorithm involves defining the value of " $k$ " the number of clusters to be formed by the user. After number of clusters is decided the algorithm randomly selects " $k$ " number of centroids. Using the Euclidean distance formula each data set is associated with a cluster. This process of associating the data set with a cluster is repeated until optimum solution is found.

## 2.0 Process of k-means algorithm

1. Each stop was given a co-ordinate, this was done by the co-ordinate plotting system of Google Maps.

| Stops | Co-ordinates |             |
|-------|--------------|-------------|
|       | X            | Y           |
| 1     | 22.28822779  | 70.7602492  |
| 2     | 22.29037206  | 70.78024775 |
| 3     | 22.28906167  | 70.77968985 |
| 4     | 22.28691738  | 70.77999026 |
| 5     | 22.28648058  | 70.78153521 |
| 6     | 22.28635036  | 70.78251657 |
| 7     | 22.28703269  | 70.78407489 |
| 8     | 22.28743179  | 70.7855219  |
| 9     | 22.28632461  | 70.78504884 |
| 10    | 22.28598988  | 70.78617584 |
| 11    | 22.28535904  | 70.78716371 |
| 12    | 22.28481832  | 70.78557756 |
| 13    | 22.28395573  | 70.78460361 |
| 14    | 22.28367249  | 70.78447839 |
| 15    | 22.28297727  | 70.78432534 |

Table 1: Coordinates of stops

2. 3 random points (C1, C2, C3) were selected to be set as centroids.

| C1          |             | C2          |             | C3          |             |
|-------------|-------------|-------------|-------------|-------------|-------------|
| X           | Y           | X           | Y           | X           | Y           |
| 22.28815022 | 70.78148298 | 22.28659521 | 70.78433731 | 22.28498171 | 70.78434266 |

Table 2: Iteration 1

3. Distances of each point from the centroids were measured using the euclidian distance formula :  $\sqrt{(x_1 - x_2)^2 + (y_1 - y_2)^2}$ . Each point was assigned to the centroid closest to it.

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<sup>1</sup><https://www.javatpoint.com/k-means-clustering-algorithm-in-machine-learning>

| Stops | Co-ordinates |             | Distances   |             |             | Cluster |
|-------|--------------|-------------|-------------|-------------|-------------|---------|
|       | X            | Y           | C1          | C2          | C3          |         |
| 1     | 22.28822779  | 70.7602492  | 0.021233922 | 0.024143369 | 0.02431115  | C1      |
| 2     | 22.29037206  | 70.78024775 | 0.002542119 | 0.005566785 | 0.006769352 | C1      |
| 3     | 22.28906167  | 70.77968985 | 0.002011484 | 0.0052614   | 0.006188274 | C1      |
| 4     | 22.28691738  | 70.77999026 | 0.001936002 | 0.004358973 | 0.004763428 | C1      |
| 5     | 22.28648058  | 70.78153521 | 0.001670457 | 0.002804441 | 0.003182513 | C1      |
| 6     | 22.28635036  | 70.78251657 | 0.002075527 | 0.001837123 | 0.002282058 | C2      |
| 7     | 22.28703269  | 70.78407489 | 0.002822568 | 0.00051015  | 0.002068381 | C2      |
| 8     | 22.28743179  | 70.7855219  | 0.004102325 | 0.001450223 | 0.002719095 | C2      |
| 9     | 22.28632461  | 70.78504884 | 0.004006025 | 0.000761254 | 0.001517253 | C2      |
| 10    | 22.28598988  | 70.78617584 | 0.005166241 | 0.001935624 | 0.002092115 | C2      |
| 11    | 22.28535904  | 70.78716371 | 0.006329405 | 0.003084908 | 0.002846167 | C3      |
| 12    | 22.28481832  | 70.78557756 | 0.005278936 | 0.002166926 | 0.001245661 | C3      |
| 13    | 22.28395573  | 70.78460361 | 0.005228008 | 0.002652876 | 0.00105865  | C3      |
| 14    | 22.28367249  | 70.78447839 | 0.005387254 | 0.002926118 | 0.00131624  | C3      |
| 15    | 22.28297727  | 70.78432534 | 0.005902408 | 0.003617958 | 0.002004522 | C3      |

Table 3: k-means iteration - 1

- The new centroids were calculated. The x co-ordinate of new centroid is the average of all the x co-ordinates of stops assigned to that particular centroid. The y co-ordinate of new centroid is the average of all the y co-ordinates of stops assigned to that particular centroid. This was done using 'Average' function in Microsoft Excel spread sheet.

| C1         |             | C2          |             | C3          |             |
|------------|-------------|-------------|-------------|-------------|-------------|
| X          | Y           | X           | Y           | X           | Y           |
| 22.2882119 | 70.77634245 | 22.28662586 | 70.78466761 | 22.28415657 | 70.78522972 |

Table 4: Iteration 2

- Now the distance of each stop from new centroids is calculated using the Euclidean distance formula. Each point is assigned to the centroid closest to it.
- The new cluster is compared to the old cluster. If there is no change, the cluster is optimum. If there is a change, steps 4 and 5 needs to be repeated.

The calculations of all other iterations are given in appendix. The final solution provided by the k-means algorithms is shown in the table 5

| Stops | Stops       |             | Distances   |             |             | Cluster |
|-------|-------------|-------------|-------------|-------------|-------------|---------|
|       | X           | Y           | C1          | C2          | C3          |         |
| 1     | 22.28822779 | 70.7602492  | 0           | 0.020550456 | 0.025142554 | C1      |
| 2     | 22.29037206 | 70.78024775 | 0.020113177 | 0.002594227 | 0.007112953 | C2      |
| 3     | 22.28906167 | 70.77968985 | 0.019458527 | 0.001650661 | 0.006695994 | C2      |
| 4     | 22.28691738 | 70.77999026 | 0.019784502 | 0.001222177 | 0.005477639 | C2      |
| 5     | 22.28648058 | 70.78153521 | 0.021357598 | 0.001544286 | 0.003872961 | C2      |
| 6     | 22.28635036 | 70.78251657 | 0.02234638  | 0.002273538 | 0.002904877 | C2      |
| 7     | 22.28703269 | 70.78407489 | 0.023855649 | 0.003376031 | 0.002089117 | C3      |
| 8     | 22.28743179 | 70.7855219  | 0.025285239 | 0.004743268 | 0.002168419 | C3      |
| 9     | 22.28632461 | 70.78504884 | 0.024872565 | 0.004513629 | 0.001053776 | C3      |
| 10    | 22.28598988 | 70.78617584 | 0.026023051 | 0.005687986 | 0.001188738 | C3      |
| 11    | 22.28535904 | 70.78716371 | 0.027066964 | 0.006832716 | 0.001946231 | C3      |
| 12    | 22.28481832 | 70.78557756 | 0.025556807 | 0.005654459 | 0.000588304 | C3      |
| 13    | 22.28395573 | 70.78460361 | 0.024726258 | 0.005436739 | 0.001464445 | C3      |
| 14    | 22.28367249 | 70.78447839 | 0.024653688 | 0.005558663 | 0.001774091 | C3      |
| 15    | 22.28297727 | 70.78432534 | 0.024642006 | 0.006005665 | 0.002474357 | C3      |

Table 5: k-means iteration - 7