

Q8. Input:- $x_1, x_2, \dots, x_N \in \mathbb{R}^n$,
Initial list of K cluster representatives
 z_1, z_2, \dots, z_K .

Output:- cluster assignment c_1, c_2, \dots, c_N .

(a) cluster assignment based on cluster representatives.
for each x_i ($i=1, 2, \dots, N$), we need to find
 $\|x_i - z_1\|_2, \|x_i - z_2\|_2, \dots, \|x_i - z_K\|_2$

For computing $\|x_i - z_1\|_2$, no. of subtractions = n ,
norm $\approx 2n$, and there are K such computations.
This amounts to $(3nK)$.

Then, we also need to find the minimum among all K , that involves K computations.

So, cluster assignment for one x_i takes $(3n+1)K$ operations, and we have N such elements. So, total ~~computation~~ computational complexity = $\boxed{(3n+1)KN}$.

Ignoring the $+1$ and the constant factor of 3 , we can say this is $\boxed{O(nKN)}$, considering the big-O notation.

(b) update cluster representatives.

For all $j = 1, 2, \dots, K$

$$\text{do } z_j = \frac{1}{|G_j|} \sum_{i \in G_j} x_i$$

The number of additions will be around $N-k$, but as $k \ll N$, we can say no. of additions $\approx N$

Each addition requires n operations.

So, computations for addition = nN (dividing an n -length vector takes n operations)

After that, number of divisions = $k * n = kn$

So, total computational complexity for this step = $\boxed{nN + kn} = \boxed{O(n(N+k))}$

(c) Combining step 1 and 2, we can say that complexity = $nKN + nN + kn$

As $k \ll N$, and considering big-O notation, we can write, complexity $\approx O(nKN)$.

So, in 10 iterations, no. of computations $\approx \boxed{10nKN}$.

However, if we want a more exact and rigorous bound, we can calculate that using:-

$$\underbrace{[(3n+1)KN]}_{\text{step 1}} + \underbrace{[(N-k)n + kn]}_{\substack{\text{no. of additions} \\ \text{(exact)}}} \times 10 \quad \text{no. of divisions}$$

$$= (3nKN + KN + Nn) \times 10$$