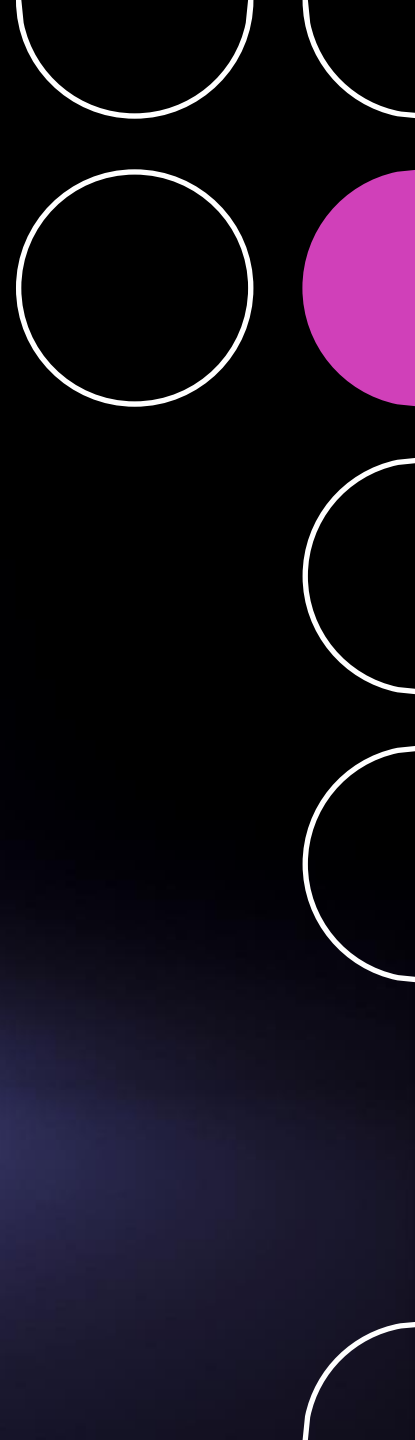


# Segmentation as Clustering

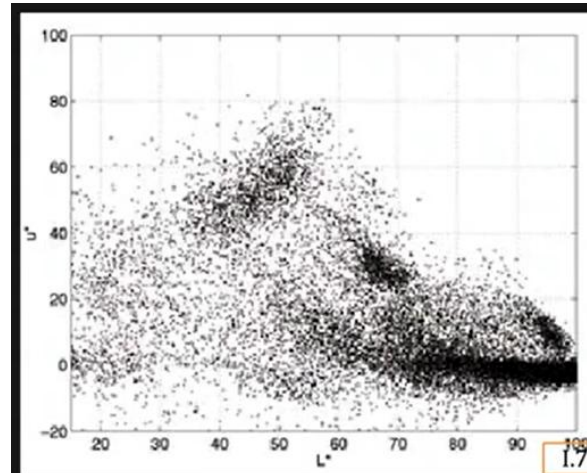
Means Shift Clustering

---

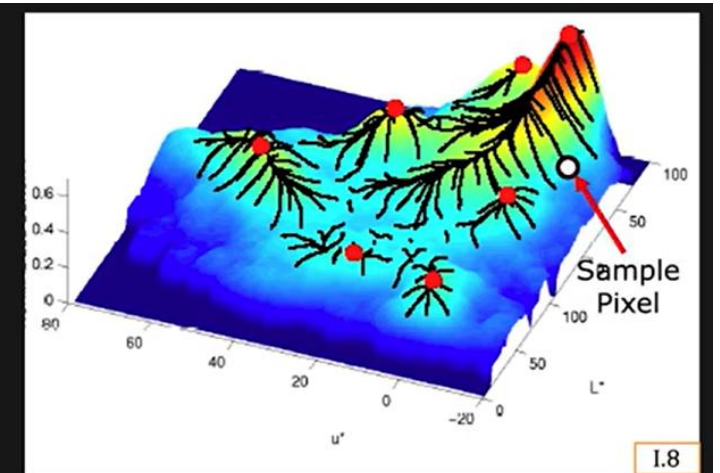


# The concept of Mean Shift

- Each hill represents a cluster.
- Peak (mode) of the hill represents “centre” of the cluster.
- Each pixel climbs the steepest hill within its neighborhood.
- Pixel is assigned to the hill (cluster) it climbs.

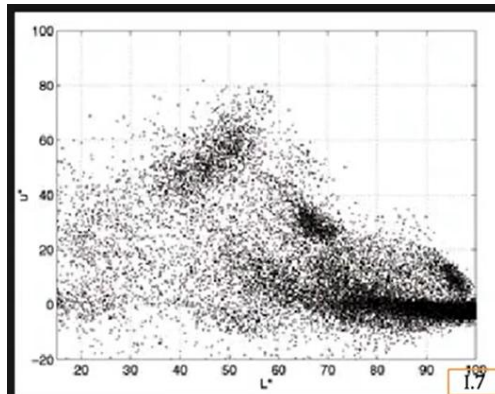


Pixel Feature Distribution

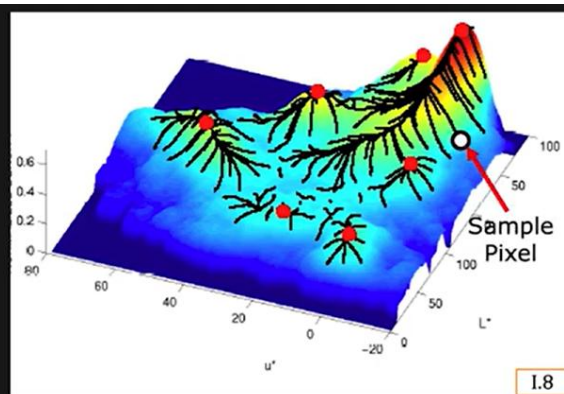


Normalized Density

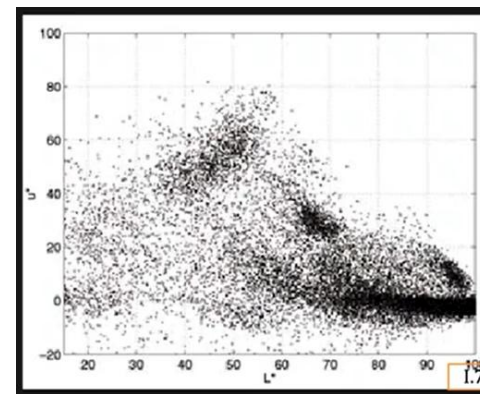
# The concept of Mean Shift



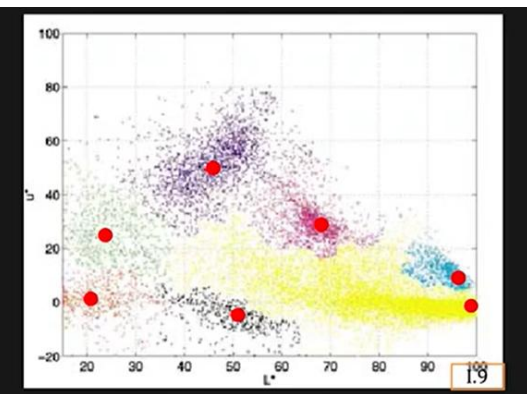
Pixel Feature Distribution



Normalized Density

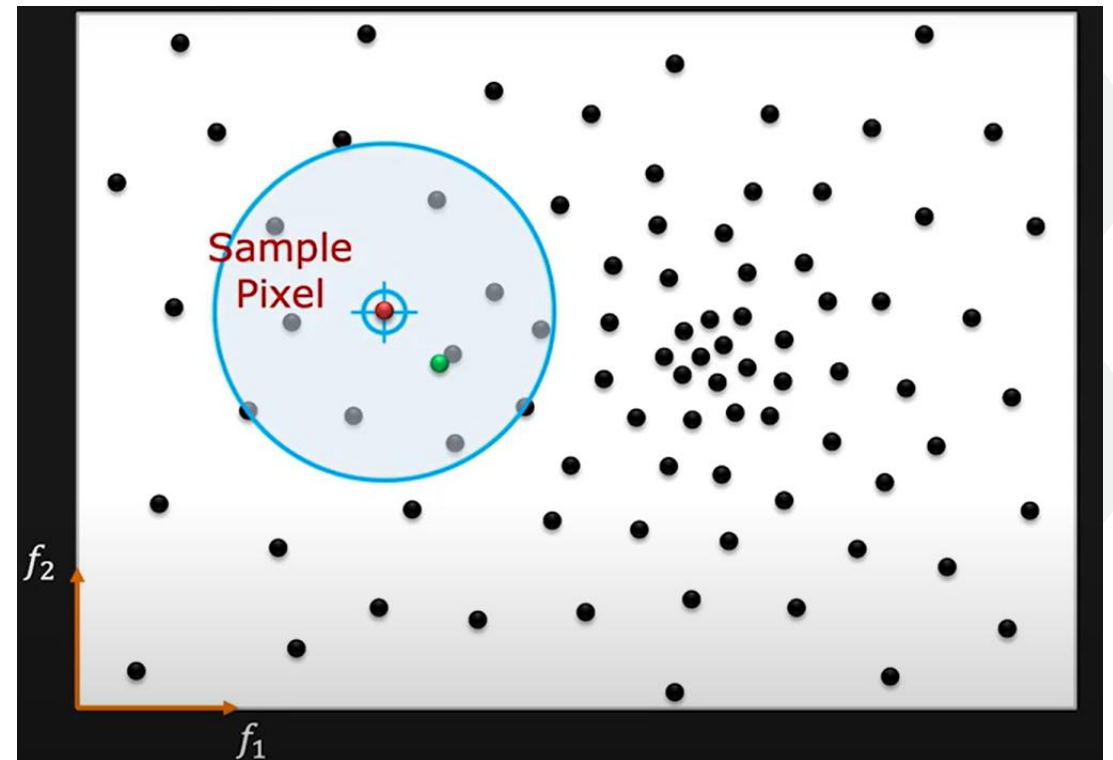
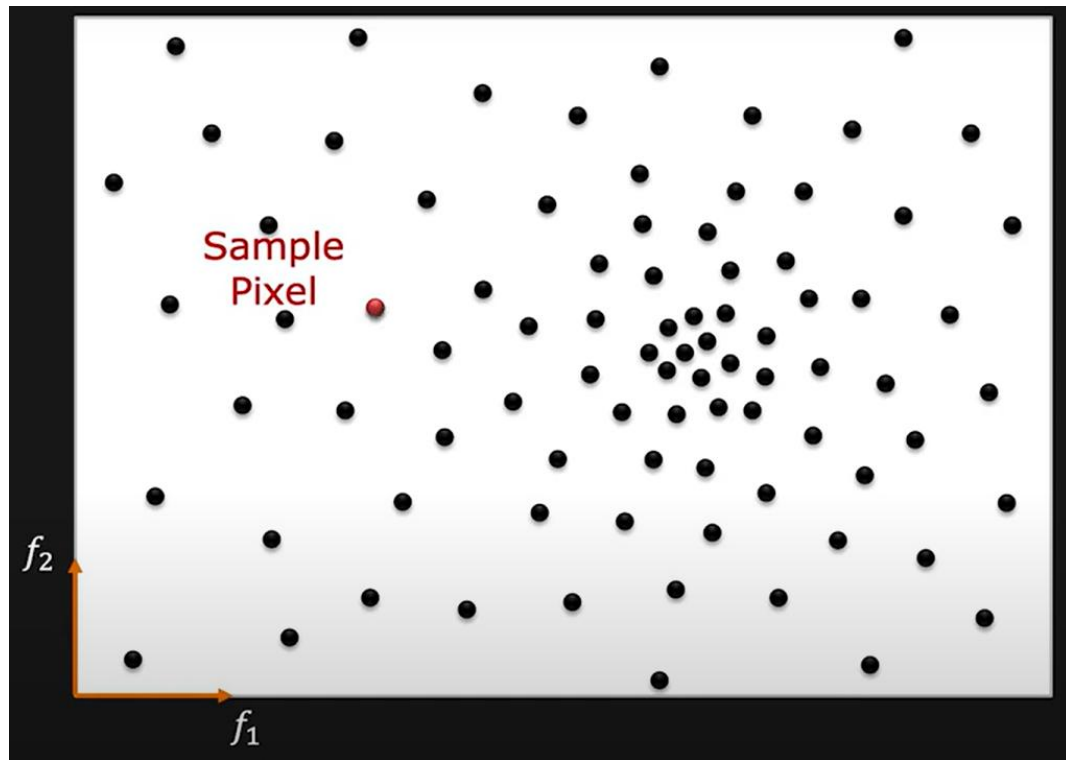


Pixel Feature Distribution



Labeled Clusters and their Centers

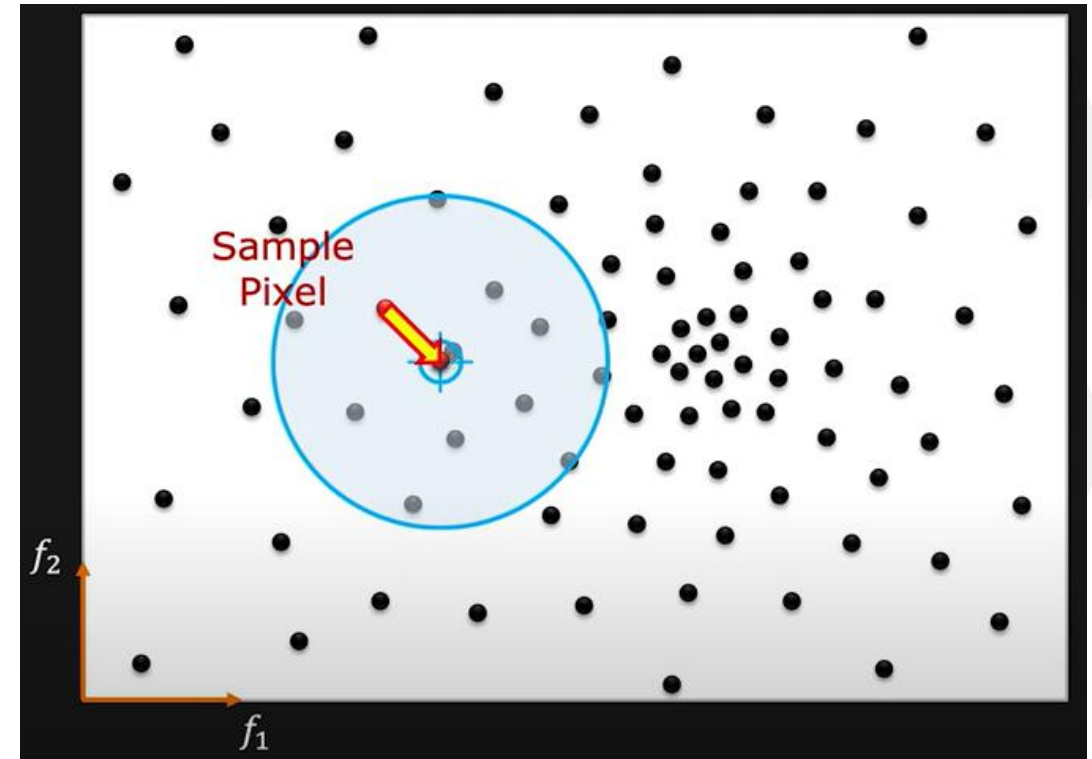
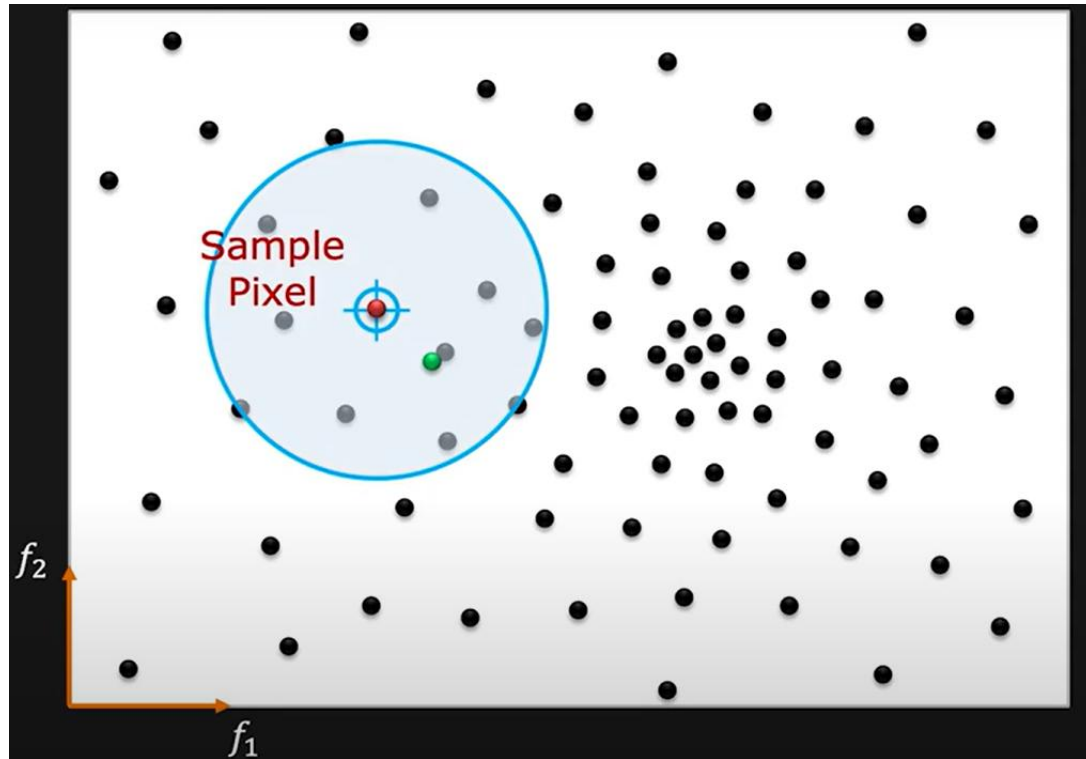
# Hill climbing using Mean Shift



---

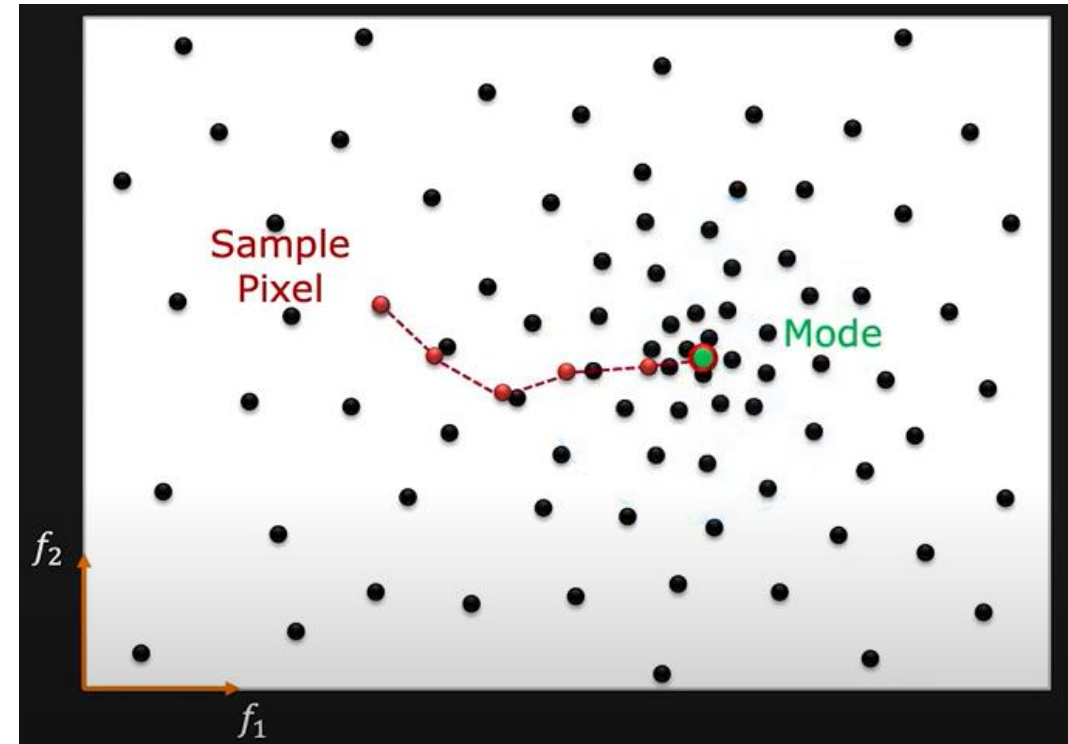
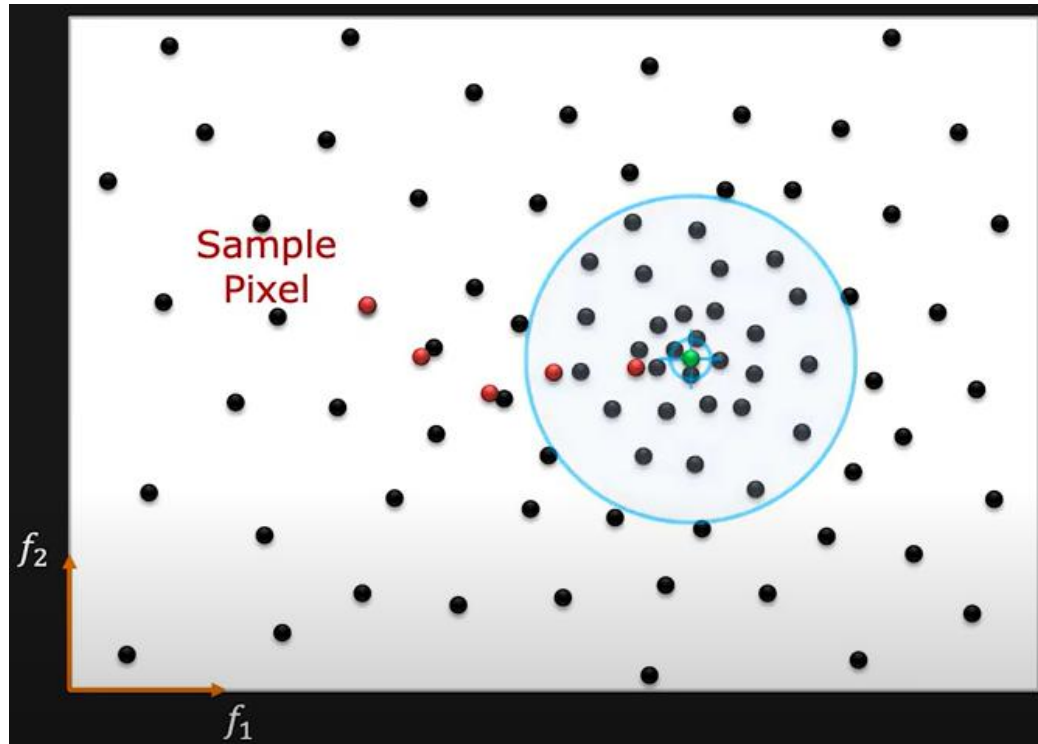
Compute Centroid within a window of size  $W$ .  
Use simple Mean of Weighted Mean.

# Hill climbing using Mean Shift



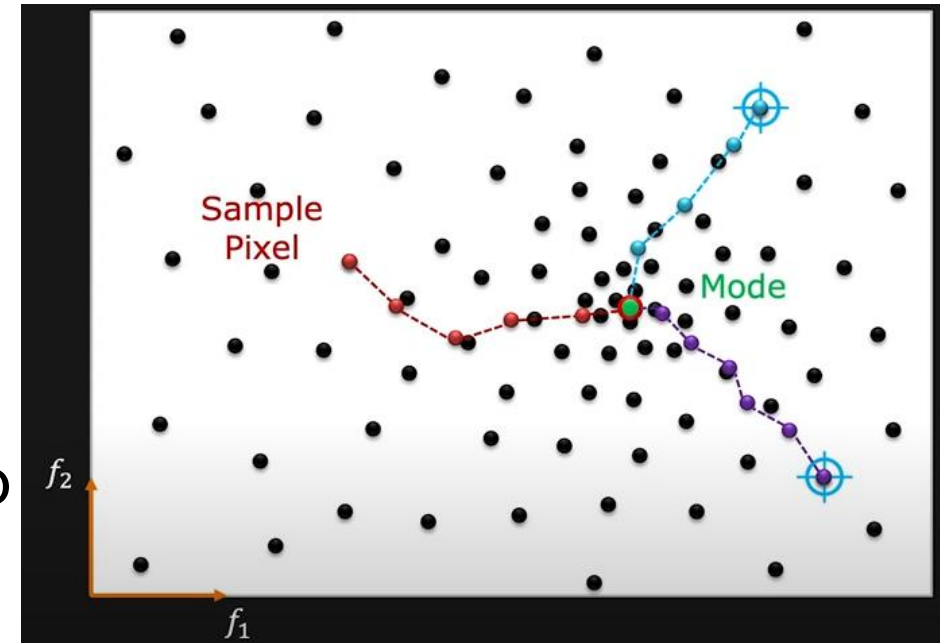


# Hill climbing using Mean Shift



# Hill climbing using Mean Shift

- Declare mode and assign it a cluster label
- Repeat for all pixels!
- Features that converge to same mode belong to the same cluster.



# Mean Shift algorithm

**Given:** Distribution of  $N$  pixels in feature space.

**Task:** Find modes (clusters) of distribution.

**Clustering:**

**1:** Set  $\mathbf{m}_i = \mathbf{f}_i$  as initial mean for each pixel  $i$ .

**2:** Repeat the following for each mean  $\mathbf{m}_i$ :

**a:** Place window of size  $W$  around  $\mathbf{m}_i$ .

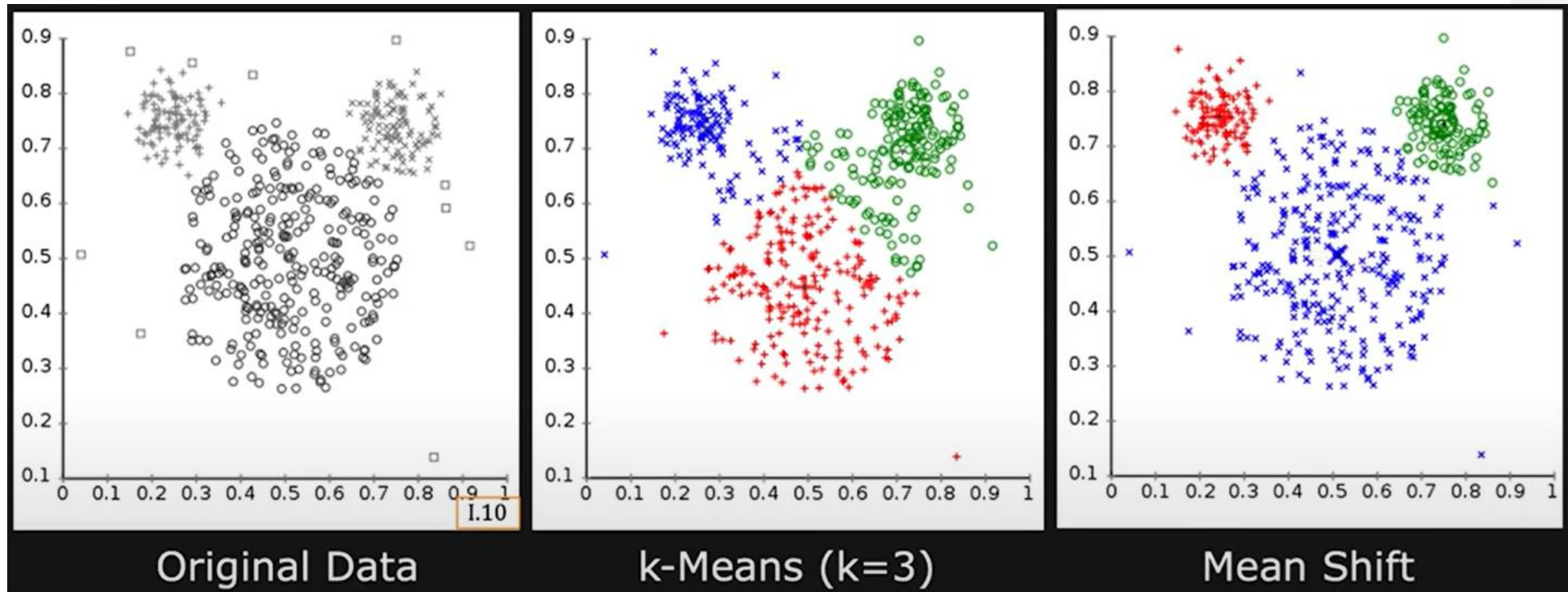
**b:** Compute centroid  $\mathbf{m}$  within the window. Set  $\mathbf{m}_i = \mathbf{m}$ .

**c:** Stop if shift in mean  $\mathbf{m}_i$  is less than a threshold  $\varepsilon$ .  
 $\mathbf{m}_i$  is the mode.

**3:** Label all pixels that have same mode as belonging to same cluster.



# K-means v/s Mean Shift



# Mean Shift: Remarks

- Simple but computationally expensive
  - Finds arbitrary number of clusters
  - No initialization required
  - Robust to outliers
  - Clustering depends on Window size  $W$
- 

