

Introduction

In your writeup, describe the steps you completed for each problem and show the results. Readability will be part of your grade.

1 Image Clustering with the k -means Algorithm

In class, we discussed how images could be segmented by grouping the pixels into clusters. In this problem, you will use the k -means algorithm to group pixels into segments.

1. Implement a function `im2featurevec` that takes an image with N_P pixels and returns a matrix (2D array) with N_P rows and M columns per row. Each of the M columns will denote a single feature response. Initially, there will be five features: R , G , B , x , and y .
2. Implement the k -means algorithm. Assuming that there are N_C clusters, the basic steps of the algorithm are:
 - Initialize the algorithm by either initializing the cluster assignments or the cluster locations
 - Until convergence criterion is satisfied:
 - Assign each point to the nearest cluster center
 - Ensure that each center has at least one point assigned to it. One possible heuristic for filling in empty clusters is to choose a random point that is far from the cluster center.
 - Set each cluster center to the average of the points assigned to it. You will average each dimension of the vectors separately.

The input to your function should be an array of points and the number of cluster centers. The output should be the cluster to which each point is assigned and the cluster centers.

3. Write a function that takes an image and returns an image where each pixel contains the cluster number assigned to that cluster. Write a second function that takes this image and displays the boundaries. A simple method for finding the boundaries is to filter the image with vertical and horizontal derivative filters, compute the gradient magnitude, then threshold that value.
4. Test your function on the images provided.
5. Problem 1.1 does not ask you to normalize the feature vectors. To see the effect of normalizing the vectors, write a new function that creates the feature matrix as before, but now subtracts the mean from each column, so that each column has a zero mean. In addition, the variance of each column should be divided by a constant so that the quantity:

$$\frac{1}{N^p} \sum_{n=1}^{N^p} (F_n - \mu)^2$$

is equal to 1. The term F_n denotes the feature at row n in a column. Compare the new results to the old results.

6. Experiment with different features. How do the results change?