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## COMPUTER EXERCISE 6

### IMAGE SEGMENTATION USING GAUSSIAN MIXTURE MODELS

#### SPATIAL STATISTICS AND IMAGE ANALYSIS, TMS016

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## 1 Introduction

The purpose of this computer exercise is to give an introduction to image segmentation using Gaussian mixture models. When in doubt about how to use a specific function in Matlab, use `help` and `doc` to get more information.

## 2 Segmentation of satellite data

Throughout the exercise, we will use a satellite image of Gothenburg as an example, which you can download from the course homepage.

- Use the K-means algorithm to classify the image with different number of classes  $K$  and plot the results. Can you get one class that only contains the water with this method? An implementation of the K-means algorithm is given in the function `normmix_kmeans`.
- Choose some value of  $K$  (such as 3) and use `normmix_sgd` to estimate a general Gaussian mixture model to the data. Then use `normmix_classify` to classify the image and plot the results.
- `normmix_classify` classifies the pixels by choosing the class with the highest probability for each pixel. The function also returns the actual class probabilities as a second output. To investigate the uncertainty of the classification, use the function `classification2rgb`, which you wrote in the first exercise, to plot the probabilities. Depending on how you wrote the function, you might have to update it to allow for plotting of probabilities.
- Compare the results to the K-means classification, and in particular look at the estimated parameters of the mixture model and compare with those estimated by the K-means algorithm.

## 3 Plotting a segmented image

- Choose your favourite classification from above and plot the parts of the image as segmented by the method. As an example, for  $K = 4$ , you can plot the different parts using

```
I = imread('gothenburg_satellite.png');
I = double(I)/255;
Istack = reshape(I,[size(I,1)*size(I,2) size(I,3)]);
figure(1)
for k=1:4
    I_class = Istack;
    I_class(c1~=k,:)=256;
    subplot(2,2,k)
    imagesc(reshape(I_class,[size(I,1) size(I,2) 3]));axis image;
end
```

where `c1` is the classification obtained from `normmix_classify` or `normmix_kmeans`.

## 4 Segmentation using relative colors

An often undesired feature of classifying the image using the RGB colors is that shadows can affect the results.

- Transform the image to relative colors (as in Exercise 1), or to LAB colors using `rgb2lab`, and classify the image using K-means. Compare with the classification using RGB colors.
- Perform the classification using the general Gaussian mixture model can compare with the classification using RGB colors.
- Which method, which color space, and which value of  $K$ , would you say works best for this image?

## 5 Morphological operations and improved segmentation

A problem with segmenting an image using a mixture model is that the intensity of the background may have a clear spatial trend. We can therefore improve the segmentation by first estimating the background, removing it, and then segmenting the updated image.

Load the `rice.png` image which is supplied with Matlab by writing `I = imread('rice.png');` and convert it to double values.

- Create a binary image by segmenting the image into two classes based on the greyscale values using a GMM
- Compute the image erosion, dilation, and opening using a circular structure element with different radii  $r$  and plot the results. A circular structure element can be constructed using `strel('disk',r)`, and you can compute the erosion, dilation, and opening using `imerode`, `imdilate`, and `imopen`, respectively. Make sure that you understand what these operations are doing.
- Use `imopen` with a circular structure element to estimate the background of the grayscale image. Plot the image opening for different values of  $r$  to find a suitable value.
- Subtract the estimated background from the image and plot the results.
- Segment the image into two classes using a GMM and compare the result to the segmentation without the background removal.