

AMATH 301 - Spring 2018

Homework #9

Due on Sunday, June 3, 2018

Note: The first problem requires the file `arnold01.jpg` and the second problem requires the file `NoisyImage.mat`. These files are included with the homework assignment. You should download the files into the same directory as your script file and access them by using the `imread` and `load` commands, respectively. However, you should **not** upload them to Scorelator. Scorelator has its own copy of both files.

In the instructions below, I ask you to plot things. Plotting is not required to get full credit for the assignment, but I highly recommend it so that you can get a sense of what is being done. However, you should remove all plots before submitting to Scorelator.

1. Read the image `arnold01.jpg` into Matlab and convert it to a grayscale image with double precision numbers by using the following commands.

```
A = imread('arnold01.jpg');
```

```
A = double(rgb2gray(A));
```

Plot the image using the commands:

```
imagesc(A)
```

```
colormap gray
```

- (a) Perform a singular value decomposition on the matrix A that was generated by the image `arnold01.jpg`. Create a 10×1 column vector that contains the ten largest singular values of A . Store this vector in `A1.dat`. The cumulative energy in the first r modes is the sum of the first r (i.e. r largest) singular values divided by the sum of all of the singular values. Calculate the cumulative energy in the first 10 modes and save it in `A2.dat`.
- (b) Find the smallest value of r such that the cumulative energy in the first r modes is greater than 0.5. Save the value of r in `A3.dat`. Approximate the matrix A by using the first r modes (i.e. the first r columns of U , the first r singular values, and the first r rows of V^T , where U and V come from the SVD). Subtract this approximation from the original matrix A and then

calculate the size of the error by using the `norm` command (use the default matrix norm and NOT the infinity norm). Save the error in `A4.dat`. Plot the approximation using `imagesc` and compare with the original image.

- (c) Now find the smallest value of r such that the cumulative energy in the first r modes is greater than 0.9. Save the value of r in `A5.dat`. Just like in part (b), approximate the matrix A by using the first r modes, calculate the error, and save the error in `A6.dat`. Plot the approximation using `imagesc` and compare with the original image.

Things to think about: What were the values of r that you found in parts (b) and (c)? How much less information needs to be stored if you just keep the truncated versions of U , Σ , and V ? How good do the approximations look? How much cumulative energy do you think is needed for a “good” approximation?

2. Use the `load` command to load the data in `NoisyImage.mat`. Two matrices should appear in your workspace. The matrix `A` is the true version of some image and the matrix `A_noise` is a noisy version of the same image. Plot both images using the `imshow` command and compare them. The goal of this problem is to denoise the noisy image.

- (a) Calculate the error between the matrix `A` and the matrix `A_noise` by subtracting and taking the norm. Save the error in `A7.dat`. Perform a singular value decomposition on the matrix `A_noise`. Save the largest singular value in `A8.dat`.
- (b) Calculate the cumulative energy in the first 2 modes and save it in `A9.dat`. Then approximate the matrix `A_noise` by using the first 2 modes. Calculate the error between the matrix `A` which represents the true image and this approximation. Save the error in `A10.dat`. Plot this approximation and compare to both the true image and the noisy image.

Things to think about: Look at all of the singular values of `A_noise` (or at least the first 20). Do a singular value decomposition on `A` and look at the singular values.

How do they compare? Does this explain why using the first 2 modes of $\mathbf{A}_{\text{noise}}$ was so effective? Do you think the denoising process would be more difficult on a different image?