## Labs

## Set 13 (DM562)

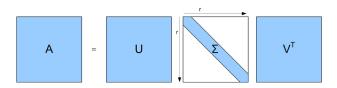
DM562 Scientific Programming
 DM857 Introduction to Programming
 DS830 Introduction to Programming

## Singular Value Decomposition and Image Compression

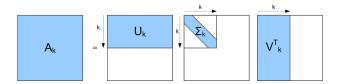
The notion of singular value decomposition (SVD) from linear algebra has found applications in many fields, especially in signal processing and data science as a dimensionality reduction technique. This is because SVD provides an answer to the problem of finding the matrix  $A_k$  of rank k that is closest to a given matrix k of rank k for any k

For the aims of this lab we don't need to go into the details of the mathematical definition of SVD or "closest". It suffices to know that:

(a) Given a real  $r \times n$  matrix A its SVD is  $A = U\Sigma V^*$  where  $\Sigma$  is a rectangular diagonal matrix.



(b) The first k singular values (truncate U,  $\Sigma$ ,  $V^*$  to k < m), are a decomposition of the matrix of rank k closest to A.



To compute the SVD of a matrix, you can use the  $svd^1$  function from module linalg of numpy. This library offers a number of classes and functions for representing and operating on matrices<sup>2</sup>. Other implementations of SVD are available from  $scipy^3$  or  $sklearn^4$ .

Image compression is a type of data compression applied to digital images to reduce their cost for storage or transmission. Since a digital image is essentially a matrix where each element stores the colour of the corresponding pixel, it can be compressed by computing its SVD and then taking a number k of singular values. This compression comes at a cost: by discarding some singular values we lose some information about the original image.

<sup>&</sup>lt;sup>1</sup>https://numpy.org/doc/stable/reference/generated/numpy.linalg.svd.html

<sup>2</sup>https://numpy.org/doc/stable/reference/generated/numpy.matrix.html

 $<sup>^3</sup>$ https://docs.scipy.org/doc/scipy/reference/generated/scipy.linalg.svd.html

<sup>4</sup>https://scikit-learn.org/stable/modules/classes.html#module-sklearn.decomposition

Write a program that write a Python program that applies this compression method with varying values for k. To load an image and store its pixels as a list, you can use the Image<sup>5</sup> class from module PIL (aka "Pillow").

```
from PIL import Image
image = Image.open('some_image.jpg').convert('L')
```

To display an image stored in a list, you can use the imshow<sup>6</sup> function from matplotlib.

 $<sup>^{5} \</sup>texttt{https://pillow.readthedocs.io/en/stable/reference/Image.html}$ 

 $<sup>^6</sup> https://matplotlib.org/stable/api/\_as\_gen/matplotlib.pyplot.imshow.html$