

1 Introduction

This assignment was done using C++ as the programming language, in the CLion IDE. Furthermore, the code from Numerical Recipes as well as some of the code provided by Ole Wennerberg Nielsen is used in the assignment - This will be marked using comments in the source code.

2 Exercise 1 (20 points)

Consider the linear equation $\mathbf{Ax} = \mathbf{b}$ where the 10×6 dimensional coefficient matrix A and the right hand side b are given in *Ex1A.dat* and *Ex1b.dat*.

i) (10 points) Find the Singular Value Decomposition (SVD) $\mathbf{A} = \mathbf{U}\mathbf{W}\mathbf{V}^T$. State the diagonal elements in \mathbf{W} . Submit the used code.

In figure 2, matrix A and its SVD elements are seen.

```

A = U*W*T(V):
A      Matrix 10x6:
-0.2244865   -0.8671804    0.5538675    0.4667952   -0.5046398    0.2918244
 0.4702761    0.5446024    0.783741   -0.8283025    0.8424086    1.886011
-0.695119   -0.05810601    0.8960382   -0.6301382    0.1990554    0.8703464
-0.6719778   -0.3098617   -0.9502969   -0.9089616    0.5931869   -0.1991461
 0.03471944   -0.2753386    0.07279159    0.07263496   -0.740794   -0.350045
-0.4081582    0.5189241    0.6058397    0.7638458    0.1215657   -0.4633721
 0.9743217    0.8220987    0.5921483    0.279157    0.6694407    1.120376
-0.1197952    0.6961101   -0.09070482   -0.5296146   -0.4478174   -0.7390419
 0.005971777   -0.140408   -0.620653   -0.04100433    0.9712523    0.3308694
-0.8650693    0.3065554    0.8863607    0.7120464    0.5430889   -0.03167097

U      Matrix 10x6:
-0.03025452    0.3031402    0.2133251   -0.5367182    0.3083527    0.06697301
 0.7328128   -0.1567385    0.02954747   -0.1373583   -0.2073977    0.2305694
 0.3080013    0.05974315    0.567434   -0.2440015   -0.3136331    0.07401154
-0.1035073   -0.582208    0.4320083    0.1798271    0.005015352   -0.1660911
-0.1864684    0.1230006   -0.07733242   -0.2979609   -0.123999    0.09466832
-0.04215443    0.44018    0.09944317    0.4239303   -0.05502176    0.6547462
 0.5161958    0.1373687   -0.4449636    0.1905457    0.09044809   -0.303095
-0.1702634   -0.05338541   -0.09762262    0.2012482   -0.7107251    0.02982495
 0.1194595   -0.3253896    0.09108462    0.2868987    0.4737023    0.3970189
 0.101122    0.4522362    0.4618641    0.416623    0.08605733   -0.470376

W      Matrix 6x6:
3.287839      0      0      0      0      0
 0      2.332613      0      0      0      0
 0      0      1.819115      0      0      0
 0      0      0      1.673514      0      0
 0      0      0      0      1.448961      0
 0      0      0      0      0      9.776714e-16

T(V)   Matrix 6x6:
 0.198969    0.2399872    0.3739251   -0.1415754    0.413119    0.7564962
-0.09447506    0.1214687    0.6929888    0.6473554   -0.2617886   -0.09210855
-0.870118   -0.3121299    0.215518   -0.1935954    0.2424076    0.05273592
-0.1648424    0.6186285   -0.1634359    0.2313751    0.6141883   -0.3642152
 0.115731   -0.5649585   -0.2895974    0.6220158    0.4010038    0.1893513
-0.3921912    0.3582556   -0.4721446    0.2880453   -0.4049773    0.4979375

```

Figure 1: A and its' SVD elements

ii) (5 points) Use SVD to compute the solution \mathbf{x} to $\mathbf{Ax} = \mathbf{b}$. State the solution \mathbf{x} . Submit the used code.

Below, two solutions \mathbf{x} to $\mathbf{Ax} = \mathbf{b}$ are shown for the minimization of $\mathbf{Ax} - \mathbf{b}$. For the SVD solution to be remotely usable, the residual error $\epsilon_{\text{residual}}$ should be **significantly** smaller than the random fitting $\sqrt{\frac{m-n}{m}}$. The aforementioned is not the case in either solutions, in fact $\epsilon_{\text{residual}}$ is larger than $\sqrt{\frac{m-n}{m}}$ in both solutions.

It is noticed that the results of $\mathbf{A} \cdot \mathbf{x}$ differ between the two solutions due to roundoff errors. Thus the comparison between $\epsilon_{\text{residual}}$ and $\sqrt{\frac{m-n}{m}}$ differs by a magnitude of 10^{-3} , which is insignificant given that both solutions are still unviable for the task of minimizing $\mathbf{Ax} - \mathbf{b}$.

```

x      Vector 60:
9.814590e+13  -8.965358e+13  1.181543e+14  -7.208342e+13  1.013457e+14  -1.24609e+14

A*x    Vector 100:
-0.109375    -0.65625    -0.09375    -0.1328125    0.1875    0.40625    -0.328125    0.609375
-0.5859375    0.4604492

b      Vector 100:
-0.5415778    -0.6439477    0.1423662    -0.8561312    0.5782175    -0.3400578    -0.766929    0.6734834
0.02603491    0.6539704

Random fitting 0.6324555
x Residual 0.7850958
x Compared to random fitting 0.1526403

x2     Vector 60:
9.814590e+13  -8.965358e+13  1.181543e+14  -7.208342e+13  1.013457e+14  -1.24609e+14

A*x2   Vector 100:
-0.140625    -0.65625    -0.125    -0.1210938    0.203125    0.3671875    -0.34375    0.625
-0.59375    0.4130859

b      Vector 100:
-0.5415778    -0.6439477    0.1423662    -0.8561312    0.5782175    -0.3400578    -0.766929    0.6734834
0.02603491    0.6539704

Random fitting 0.6324555
x2 Residual 0.7761954
x2 Compared to random fitting 0.1437398

Ax - Ax2      Vector 100:
0.03125    0    0.03125    -0.01171875    -0.015625    0.0390625    0.015625    -0.015625
0.0078125    0.04736328

Difference in comparison: 0.008900452

```

Figure 2: A and its' elements

3 Exercise 2 (20 points)

In this exercise, the task is to derive the time of collision between two objects. Object A is as sphere with radius $r = 1$ residing at the origin. Object B is a shape changing ellipsoidal object, which at time t is centered at $(x_e(t); y_e(t); z_e(t))$. We can describe the surface of object B (hereafter called S_B) as the set of points $(x; y; z)$ satisfying

$$a(t) [x - x_e(t)]^2 + b(t) [y - y_e(t)]^2 + c(t) [z - z_e(t)]^2 = 1$$

where $a(t), b(t), c(t)$ are all positive. The point on object B that is closest to the center of object A (the origin) is then clearly given as

$$\min_{x,y,z \in S_B} \{x^2 + y^2 + z^2\}$$

which is a constrained optimization problem where the solution must satisfy the first order conditions

$$\begin{aligned}x - \lambda a(t) [x - x_e(t)] &= 0 \\y - \lambda b(t) [y - y_e(t)] &= 0 \\z - \lambda c(t) [z - z_e(t)] &= 0 \\a(t) [x - x_e(t)]^2 + b(t) [y - y_e(t)]^2 + c(t) [z - z_e(t)]^2 - 1 &= 0\end{aligned}\tag{1}$$

where λ is a so-called Lagrange Multiplier. We have now given

$$\begin{aligned}a(t) &= 1.1(1 + t^2) \\b(t) &= 2.1(1 + 2t^2) \\c(t) &= 0.8(1 + 3t^2) \\x_e(t) &= 2.3\exp(-t) \\y_e(t) &= 4.8\exp(-t) \\z_e(t) &= 0.7\exp(-t)\end{aligned}$$

i) (6 points) At time $t = 1.2$, find a solution $(x; y; z; \lambda)$ satisfying the first order conditions in Eq.(1). Use Newton's method starting with $(x; y; z; \lambda) = (0; 0; 0; 0)$ and with a required tolerance of 10^{-8} . State your result for $x; y; z$ and compute and state the distance to the origin $d = \sqrt{x^2 + y^2 + z^2}$. Submit the used code. As a check that you programmed everything correct, d should be approximately $d \approx 1.22$. As $d > 1$, the two objects are not penetrating each other.

```
2.i
Did newt find usable roots? true
Roots for t = 1.2      Vector 4D:
      0.4041804      1.170462      0.1453793      -0.5218518
d = 1.246787
```

Figure 3: Roots for $t = 1.2$

ii) (6 points) At time $t = 1.4$, find a solution $(x; y; z; \lambda)$ satisfying the first order conditions in Eq.(1). Use Newton's method starting with $(x; y; z; \lambda) = (0; 0; 0; 0)$ and with a required tolerance of 10^{-8} . State your result for $x; y; z$ and compute and state the distance to the origin $d = \sqrt{x^2 + y^2 + z^2}$. Submit the used code. As we now have $d < 1$, the two objects penetrate.

```
2.i
Did newt find usable roots? true
Roots for t = 1.2      Vector 4D:
      0.4041804      1.170462      0.1453793      -0.5218518
d = 1.246787
```

Figure 4: Roots for $t = 1.4$

4 Exercise 5a (15 points) (Only Diploma Engineering Students)

Consider the integral

$$\int_a^b \cos(x^3) \exp(-x) dx$$

i) (5 points) For $N = 2$, state an analytical expression for the approximation of the integral as obtained by the Trapezoidal method.

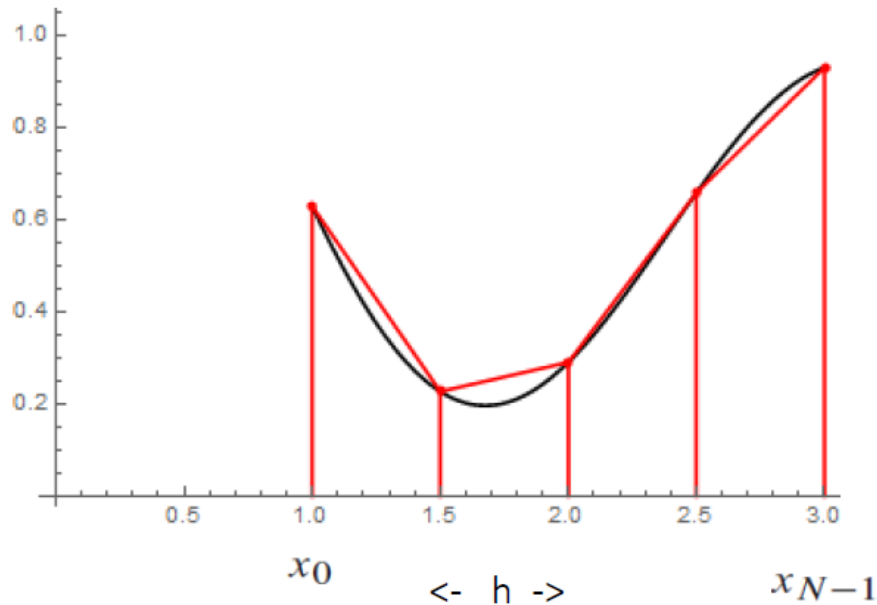


Figure 5: Visualisation of the trapezoidal method from the slides of lecture 8 in Numerical Methods. The trapezoidal method is defined as being

$$\int_a^b f(x) dx = h \cdot \left[\frac{1}{2} f_0 + f_1 + f_2 + \cdots + f_{N-2} + \frac{1}{2} f_{N-1} \right]$$

where

$$h = \frac{b-a}{N}$$

Given $N = 2$, the trapezoidal method will look as follows

$$\int_a^b f(x) dx = h \cdot \left[\frac{1}{2} f_0 + f_1 + \frac{1}{2} f_{N-1} \right]$$

where

$$h = \frac{b-a}{2}$$

We now consider the case $a = 1, b = 3$. We wish to approximate the integral using the Trapezoidal method. For this, we as usual split the integration interval into N equidistant subintervals. You may without proof assume that the order is 2 as expected.

ii) (10 points) With $N = 2, 4, 8, \dots$ use the Trapezoidal method to approximate the integral. Terminate the subdivisions when you reach a proven accuracy of better than 10^{-5} . State your results for each N , preferably in a table similar to those used during the course. Submit the used code.

Below is a table showing the results of using the trapezoidal method with $N = 2, 4, 8, \dots$ to the point of the accuracy reaching more than 10^{-5} . It is seen that the goal is reached after six iterations.

i	N - 1	A(hi)	A(hi - 1) - A(hi)	Rich - alpha^k	Rich-error	F-Calculations
1	1	0.1842214	*	4	*	2
2	3	0.1150375	0.06918388	4	0.02306129	4
3	7	0.04245041	0.07258708	4	0.02419569	8
4	15	0.03846676	0.003983652	4	0.001327884	16
5	31	0.03772984	0.0007369203	4	0.0002456401	32
6	63	0.03766943	6.040678e-05	4	2.013559e-05	64
7	127	0.0376591	1.033829e-05	4	3.446095e-06	128

Figure 6: Approximated areas using trapezoidal method with up until an accuracy of better than 10^{-5} .