

# Assignment 4

## MATH 7502 - Semester 2, 2018

### Mathematics for Data Science 2

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#### Question 1 - Carry over of question 10 from previous assignment:

Solve Question 12.13 from [VMLS], page 241.

#### Question 2 - Carry over of question 11 from previous assignment:

You are given a channel impulse response, the  $n$ -vector  $c$ . Your job is to find an equalizer impulse response, the  $n$ -vector  $h$  that minimizes  $\|h * c - e_1\|^2$ . You can assume  $c_1 \neq 0$ .

(a) Explain how to find  $h$ , Apply your method to find the equalizer  $h$  for the channel  $c = (1.0, 0.7, -0.3, -0.1, 0.05)$ .

(b) Plot  $c$ ,  $h$ , and  $h * c$ .

#### Question 3

Say that you observe data points  $(y_1, x_1, m_1), \dots, (y_n, x_n, m_1)$ . Assume that  $y$  and  $x$  are real valued and that  $m$  is binary valued. Say you wish to use least squares to fit a function,

$$y(x) = \beta_0 + \beta_1 x + \beta_2 m_1$$

(i) Describe the  $A$  matrix for the problem  $\min_{\beta} \|A\beta - y\|$ .

(ii) Consider the data values below. Plot the data values on the  $x$ - $y$  plane using different colors for  $m=0$  and  $m=1$

(iii) Fit the model with for the data and plot the line(s) of best fit.

In [27]:

```
xVals = [1, 6, 11, 16, 21, 26, 31, 36, 41, 46, 51, 56, 61, 66, 71]
mVals = [1, 1, 0, 1, 1, 1, 1, 1, 0, 1, 0, 1, 1, 0, 1]
yVals = [215.132, 259.396, 99.2338, 324.469, 253.776, 450.759,
         305.793, 472.493, 258.894, 555.746, 335.42,
         636.734, 624.769, 435.191, 638.885];
```

## Question 4

Carry out 12.14 from [VMLS], page 242 dealing with recursive least squares.

## Question 5

Carry out 13.17 from [VMLS], pages 282-283.

## Question 6

Carry out 13.19 from [VMLS], page 283.

## Question 7

Carry out 14.17 from [VMLS], page 306.

## Question 8

Carry out 15.4 from [VMLS], page 334.

## Question 9

Carry out 15.11 from [VMLS], page 337.

## Question 10

Carry out 16.5 from [VMLS], page 352.

## Question 11

The code below considers a non-small least squares problem. With  $A$  of dimension  $40,000 \times 1000$ . It is constructed by selecting  $A$  and  $\beta$  randomly with a fixed seed. Plot the running time of this code for increasing  $n$  and  $p$  (e.g. keep  $p/n = 1/8$  and increase (or decrease  $n$ ). ) Investigate the behaviour of the running time as the ratio of  $p$  and  $n$  changes.

In [24]:

```
using Distributions
srand(1988)
n = 40000
p = 500
A = round(50*rand(n,p))
beta = 5*rand(p)
y = A*beta + 2000*rand(Normal(),n);
betaHat = A \ y
maximum(abs(betaHat - beta))
```

Out[24]:

2.2697565816429908

## Question 12

Implement a gradient descent algorithm for the the data of the previous question. Say that you wish to run it for a fixed number of iterations (with a specified fixed learning rate and fixed initial guess). Plot the maximum absolute value error rate as  $n$  grows.