

## Assignment 2

All assignment submissions are to be made on LEARN Quiz by 11:59 PM on the assigned due date. No extensions will be given, and assignments will not be accepted after the due date.

**Problem Statement:** A nonlinear model can describe a process that we want to estimate its states:

$$x = [0:0.01:10]$$

*y = can be found as a separate .mat file*

1. Build a 4<sup>th</sup> order polynomial model of  $y = f(x)$ , considering that y contains added white noise, using **ordinary least squares**.

Then answer the questions below:

- a. What is the obtained weight for  $x^4$ ?
- b. What is the obtained  $R^2$ ?

2. Apply a regularization of norm 2, with  $\lambda = 2$ : your new cost function will be

$$J_{L2-reg} = e^T e + \lambda \|w\|^2$$

This is equivalent to solve ridge regression with  $\lambda = 2$ .

- a. What would be  $\frac{\|W_{L2-reg}\|}{\|W_{LS}\|}$  ?

where  $W_{L2-reg}$  is the weight vector resulted from regularized Least Squares and  $W_{LS}$  is the weight vector from Least squares.

3. Build a 4<sup>th</sup> order polynomial model of  $y = f(x)$  this time using **Bisquare** method (robust least squares). For simplicity of the weight matrix calculation use the formula below which is a function of absolute error of the points.

Hint: do not use distance to the curve as it can become computationally expensive for this case.

$$q_i = \frac{1}{1 + h|e_i|}$$

s.t.  $h$ : 4x standard deviation of the absolute error  $h = 4 \times std(|e|)$

$$e_i = y_{act} - \hat{y}$$

- a. What is the obtained weight for  $x^4$ ?
- b. What is the obtained  $R^2$ ?

Note that for  $R^2$  of weighted LS or robust LS you can use this alternative formula:

$$R^2 = 1 - \frac{SSE}{SST}$$
$$SSE = \sum q_i e_i^2$$
$$SST = \sum q_i \left( y_i - \frac{\sum_{i=1}^N q_i y_i}{\sum_{j=1}^N q_j} \right)^2$$

$q_i$ s are the weights to be used for samples, to increase or decrease the importance of samples in weighted LS.  $e_i$  s are the error of the bisquare regression,  $y_i$ s are samples of actual y data.

4. *What are the reasonable orders of model for these measurements?*