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## CS 5900 HW Assignment 1

## **Implementation**

## 1. Simple Regression:

Results:

Params: [-15682.27021631 115.41845202]

Training RMSE: 64083.51.

Training cost: 2053348364.32.

Test RMSE: 65773.19.

Test cost: 2163056355.39.

Plot of training data, test data, and linear approximation:

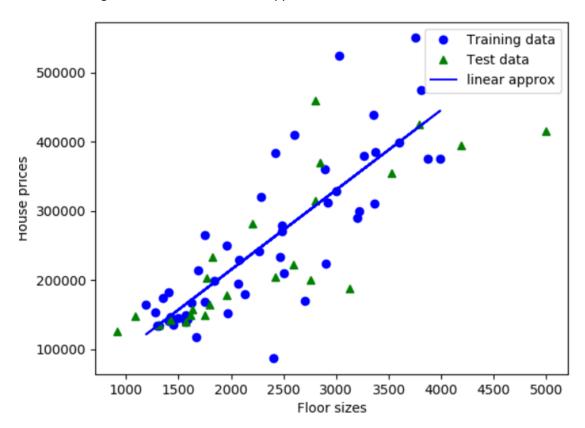


Fig: train\_test\_line.png

## 2. Multiple Regression:

Results:

Params: [-66713.84150388 96.6022094 25332.57797469 384.47514712]

Training RMSE: 61070.62.

Training cost: 1864810186.98.

Test RMSE: 58481.32.

Test cost: 1710032401.49.

The Test RMSE in this case is smaller than that of the simple case above. This is probably because of using more features to compute house price.

## **3.** Polynomial Curve Fitting:

## a) Plot of data in dataset.txt:

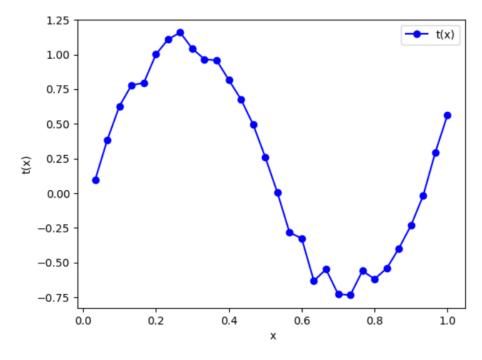


Fig: dataset.png

## **b)** Plot of data in train.txt:

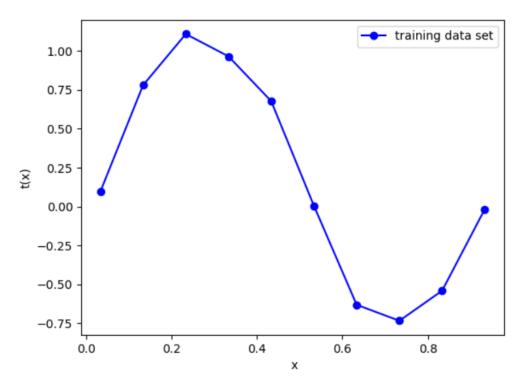


Fig: traindataset.png

## Plot of data in test.txt:

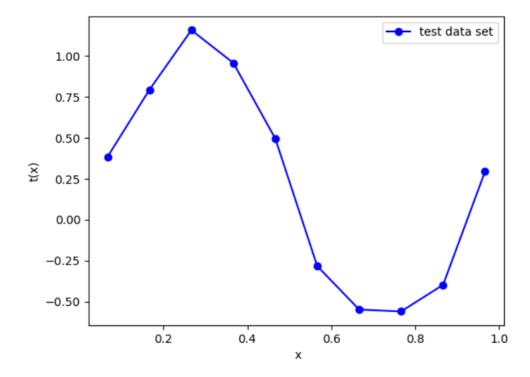


Fig: testdataset.png

## Plot of data in devel.txt:

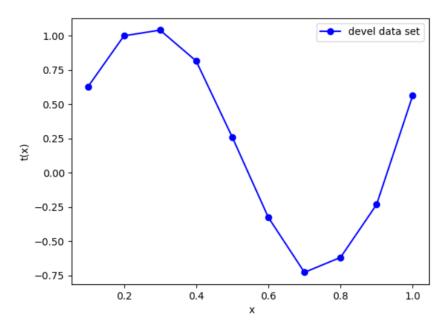


Fig: develdataset.png

## c) The solution is:

$$\mathbf{w} = \left(\lambda N\mathbf{I} + \mathbf{X}^{\mathrm{T}}\mathbf{X}\right)^{-1}\mathbf{X}^{\mathrm{T}}\mathbf{t}$$

[Slide 45 of Lecture 2 notes]

d)

**1.** Plot of RMSE values of training and test data for all values of  $M \in [0, 9]$ :

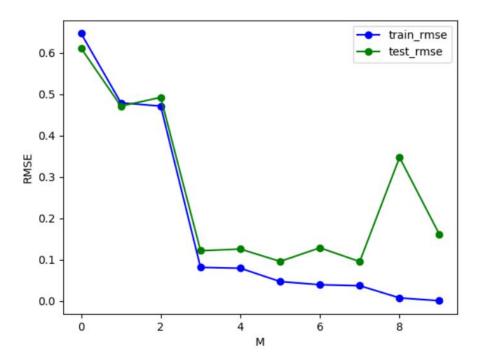


Fig: train-test-rmse-without-reg.png

We can see that the training and test RMSE plots follow a similar patter, except for M = 8.9 where the test RMSE shoots up compared to the training plot. This is because of the greater degree of overfitting for those values of M.

#### **2.** Plot of training and validation RMSE values for $\ln \lambda \in [-50, 0]$ and M=9:

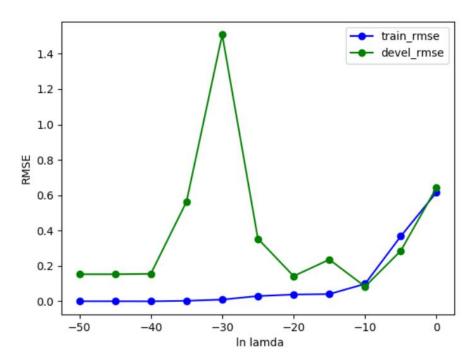


Fig: train-devel-rmse-with-reg.png

The training and validation RMSE plots follow a similar pattern except for the validation plot at  $\ln \lambda = -30$  where it shoots up and it seems to be an outlier case.

# <u>Test RMSE values without regularization and with regularization using parameter vector that obtained lowest RMSE on validation data:</u>

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Test without regularization for M = 9, RMSE: 0.16. Test with regularization for M = 9, RMSE: 0.12.
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As seen above, the Test RMSE obtained with regularization is lower than that obtained without regularization. This is because regularization avoids overfitting of the data, unlike the case without regularization.