

## Experiment No -04

### Simple Linear Regression Model

```
In [1]: print('-----EXPERIEMENT-04-----')
print('NAME: Pratyush Srivastava')
print('ROLL NO: 18SCSE1010128')

-----EXPERIEMENT-04-----
NAME: Pratyush Srivastava
ROLL NO: 18SCSE1010128
```

### Ordinary Least Squares

```
In [2]: #Importing Linear Regression Model From Sklearn Library
from sklearn import linear_model
reg = linear_model.LinearRegression()
```

```
In [3]: #Training of raw data that is passes in fit function
reg.fit([[0, 0], [1, 1], [2, 2]], [0, 1, 2])
```

```
Out[3]: LinearRegression()
```

```
In [4]: #Coefficient of the Linear Regression Model
reg.coef_
```

```
Out[4]: array([0.5, 0.5])
```

# Ridge Regression

```
In [5]: #Importing Linear Regression Model From Sklearn Library  
from sklearn import linear_model  
reg = linear_model.Ridge(alpha=.5)
```

```
In [6]: #Training of raw data that is passes in fit function  
reg.fit([[0, 0], [0, 0], [1, 1]], [0, .1, 1])
```

Out[6]: Ridge(alpha=0.5)

```
In [7]: #Coefficient of the Linear Regression Model  
reg.coef_
```

Out[7]: array([0.34545455, 0.34545455])

```
In [8]: #Intercept of the Linear Regression Model  
reg.intercept_
```

Out[8]: 0.13636363636363638

## First Example of Ordinary Least Sqaure(OLS)

```
In [9]: #Importing Numpy and Linear Regression Model  
import numpy as np  
from sklearn.linear_model import LinearRegression
```

```
In [10]: #Taking X as raw input  
X = np.array([[1, 1], [1, 2], [2, 2], [2, 3]])  
# y = 1 * x_0 + 2 * x_1 + 3
```

```
In [11]: #Taking y as output and after that train the model by using fit functio  
n
```

```
y = np.dot(X, np.array([1, 2])) + 3  
reg = LinearRegression().fit(X, y)
```

```
In [12]: #Check the accuracy of the model  
reg.score(X, y)
```

```
Out[12]: 1.0
```

```
In [13]: #Coefficient Of the model  
reg.coef_
```

```
Out[13]: array([1., 2.])
```

```
In [14]: #Intercept of the Model  
reg.intercept_
```

```
Out[14]: 3.0000000000000018
```

```
In [15]: #Prediction on unseen data  
reg.predict(np.array([[3, 5]]))
```

```
Out[15]: array([16.])
```

## Linear Regression Example with in-built Diabetes dataset

```
In [16]: #Importing Libraries  
import matplotlib.pyplot as plt  
import numpy as np  
from sklearn import datasets, linear_model  
from sklearn.metrics import mean_squared_error, r2_score
```

```
In [17]: # Load the diabetes dataset  
diabetes_X, diabetes_y = datasets.load_diabetes(return_X_y=True)
```

```
In [18]: # Use only one feature  
diabetes_X = diabetes_X[:, np.newaxis, 2]  
diabetes_X
```

```
Out[18]: array([[ 0.06169621],  
                [-0.05147406],  
                [ 0.04445121],  
                [-0.01159501],  
                [-0.03638469],  
                [-0.04069594],  
                [-0.04716281],  
                [-0.00189471],  
                [ 0.06169621],  
                [ 0.03906215],  
                [-0.08380842],  
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                [-0.02884001],  
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                [-0.00405033],  
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                [-0.03099563],
```

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```

```
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```

```
[-0.03422907],  
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[-0.01590626],  
[-0.01590626],  
[ 0.03906215],  
[-0.0730303 ]])
```

```
In [19]: # Split the data into training/testing sets  
diabetes_X_train = diabetes_X[:-20]  
diabetes_X_test = diabetes_X[-20:]
```

```
In [20]: # Split the targets into training/testing sets  
diabetes_y_train = diabetes_y[:-20]  
diabetes_y_test = diabetes_y[-20:]
```

```
In [21]: # Create linear regression object  
regr = linear_model.LinearRegression()
```

```
In [22]: # Train the model using the training sets  
regr.fit(diabetes_X_train, diabetes_y_train)
```

```
Out[22]: LinearRegression()
```

```
In [23]: # Make predictions using the testing set  
diabetes_y_pred = regr.predict(diabetes_X_test)
```

```
In [24]: # The coefficients
```

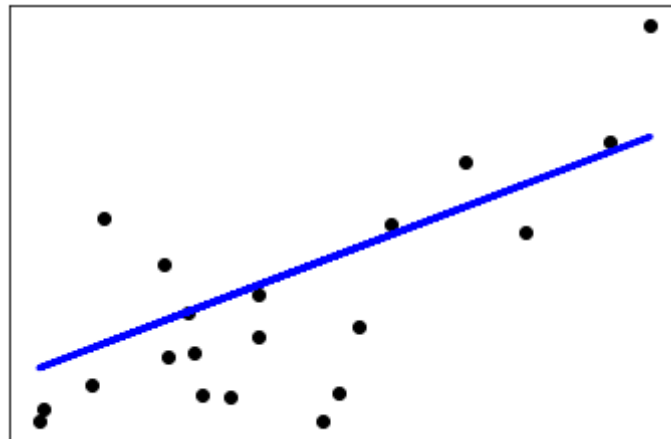
```
print('Coefficients: \n', regr.coef_)
```

```
Coefficients:  
[938.23786125]
```

```
In [25]: print('Mean squared error: %.2f'% mean_squared_error(diabetes_y_test, d  
diabetes_y_pred))  
# The coefficient of determination: 1 is perfect prediction  
print('Coefficient of determination: %.2f'% r2_score(diabetes_y_test, d  
diabetes_y_pred))
```

```
Mean squared error: 2548.07  
Coefficient of determination: 0.47
```

```
In [26]: # Plot outputs  
plt.scatter(diabetes_X_test, diabetes_y_test, color='black')  
plt.plot(diabetes_X_test, diabetes_y_pred, color='blue', linewidth=3)  
  
plt.xticks()  
plt.yticks()  
  
plt.show()
```



In this model We have taken only one features then then the Mean squared error is 2548.07 ,



Coefficients is [938.23786125] and Coefficient of determination: 0.47

## Change the features

```
In [27]: import matplotlib.pyplot as plt
import numpy as np
from sklearn import datasets, linear_model
from sklearn.metrics import mean_squared_error, r2_score

# Load the diabetes dataset
diabetes_X, diabetes_y = datasets.load_diabetes(return_X_y=True)

# Use only one feature
diabetes_X = diabetes_X[:, np.newaxis, 3]

# Split the data into training/testing sets
diabetes_X_train = diabetes_X[:-20]
diabetes_X_test = diabetes_X[-20:]

# Split the targets into training/testing sets
diabetes_y_train = diabetes_y[:-20]
diabetes_y_test = diabetes_y[-20:]

# Create linear regression object
regr = linear_model.LinearRegression()

# Train the model using the training sets
regr.fit(diabetes_X_train, diabetes_y_train)

# Make predictions using the testing set
diabetes_y_pred = regr.predict(diabetes_X_test)

# The coefficients
print('Coefficients: \n', regr.coef_)
# The mean squared error
print('Mean squared error: %.2f' % mean_squared_error(diabetes_y_test,
diabetes_y_pred))
```

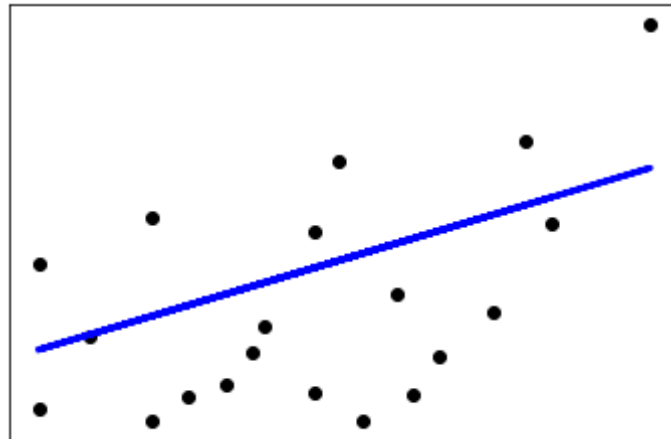
```
# The coefficient of determination: 1 is perfect prediction
print('Coefficient of determination: %.2f' % r2_score(diabetes_y_test,
diabetes_y_pred))

# Plot outputs
plt.scatter(diabetes_X_test, diabetes_y_test, color='black')
plt.plot(diabetes_X_test, diabetes_y_pred, color='blue', linewidth=3)

plt.xticks(())
plt.yticks(())

plt.show()
```

Coefficients:  
[709.19471785]  
Mean squared error: 4058.41  
Coefficient of determination: 0.16



In the above data we have taken only 1 features and while i have taken 2 features then the Mean squared error is 4058.41 , Coefficients is [709.19471785] and Coefficient of determination: 0.16

**Increase the feature size to 2 and discuss the**

## output

```
In [28]: import matplotlib.pyplot as plt
import numpy as np
from sklearn import datasets, linear_model
from sklearn.metrics import mean_squared_error, r2_score

# Load the diabetes dataset
diabetes_X, diabetes_y = datasets.load_diabetes(return_X_y=True)

# Use only one feature
diabetes_X = diabetes_X[:, np.newaxis, 4]

# Split the data into training/testing sets
diabetes_X_train = diabetes_X[:-20]
diabetes_X_test = diabetes_X[-20:]

# Split the targets into training/testing sets
diabetes_y_train = diabetes_y[:-20]
diabetes_y_test = diabetes_y[-20:]

# Create linear regression object
regr = linear_model.LinearRegression()

# Train the model using the training sets
regr.fit(diabetes_X_train, diabetes_y_train)

# Make predictions using the testing set
diabetes_y_pred = regr.predict(diabetes_X_test)

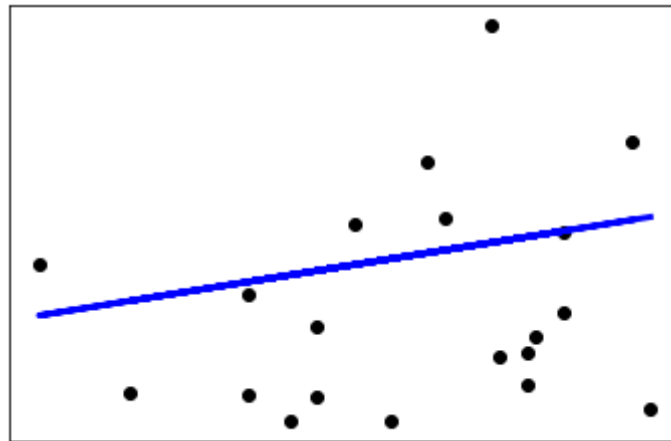
# The coefficients
print('Coefficients: \n', regr.coef_)
# The mean squared error
print('Mean squared error: %.2f' % mean_squared_error(diabetes_y_test,
diabetes_y_pred))
# The coefficient of determination: 1 is perfect prediction
print('Coefficient of determination: %.2f' % r2_score(diabetes_y_test,
diabetes_y_pred))
```

```
# Plot outputs
plt.scatter(diabetes_X_test, diabetes_y_test, color='black')
plt.plot(diabetes_X_test, diabetes_y_pred, color='blue', linewidth=3)

plt.xticks(())
plt.yticks(())

plt.show()
```

Coefficients:  
[352.82770178]  
Mean squared error: 5608.70  
Coefficient of determination: -0.16



In the above data we have taken only 2 features and when i have taken 3 features then the Mean squared error is 5608.70 , Coefficients is [352.82770178] and Coefficient of determination: -0.16

In [ ]: