

```
In [28]: import numpy as np  
import pandas as pd
```

```
In [29]: dataset=pd.read_csv(r"D:\ML_Course\Works_on_python\Multi_Linear_Regression\50_Startups.csv")
```

```
In [30]: dataset.head()
```

Out[30]:

	R&D Spend	Administration	Marketing Spend	State	Profit
0	165349.20	136897.80	471784.10	New York	192261.83
1	162597.70	151377.59	443898.53	California	191792.06
2	153441.51	101145.55	407934.54	Florida	191050.39
3	144372.41	118671.85	383199.62	New York	182901.99
4	142107.34	91391.77	366168.42	Florida	166187.94

```
In [31]: dataset["State"].unique()
```

Out[31]: array(['New York', 'California', 'Florida'], dtype=object)

```
In [32]: dataset.isnull().any()
```

Out[32]:

R&D Spend	False
Administration	False
Marketing Spend	False
State	False
Profit	False
dtype:	bool

```
In [33]: from sklearn.preprocessing import LabelEncoder  
le=LabelEncoder()  
dataset["State"]=le.fit_transform(dataset["State"])
```

```
In [34]: dataset.head()
```

Out[34]:

	R&D Spend	Administration	Marketing Spend	State	Profit
0	165349.20	136897.80	471784.10	2	192261.83
1	162597.70	151377.59	443898.53	0	191792.06
2	153441.51	101145.55	407934.54	1	191050.39
3	144372.41	118671.85	383199.62	2	182901.99
4	142107.34	91391.77	366168.42	1	166187.94

```
In [35]: x=dataset.iloc[:,0:4].values  
y=dataset.iloc[:,4:5].values
```

```
In [36]: x.shape
```

Out[36]: (50, 4)

```
In [37]: y.shape
```

Out[37]: (50, 1)

```
In [38]: from sklearn.preprocessing import OneHotEncoder  
one=OneHotEncoder()  
z=one.fit_transform(x[:,3:4]).toarray()  
x=np.delete(x,3,axis=1)  
x=np.concatenate((z,x),axis=1)
```

C:\Users\anikp\Anaconda3\lib\site-packages\sklearn\preprocessing\\_encoders.py:368: FutureWarning: The handling of integer data will change in version 0.22. Currently, the categories are determined based on the range [0, max(values)], while in the future they will be determined based on the unique values.

If you want the future behaviour and silence this warning, you can specify "categories='auto'".

In case you used a LabelEncoder before this OneHotEncoder to convert the categories to integers, then you can now use the OneHotEncoder directly.

```
warnings.warn(msg, FutureWarning)
```

```
In [39]: x.shape
```

```
Out[39]: (50, 6)
```

```
In [40]: from sklearn.model_selection import train_test_split  
x_train,x_test,y_train,y_test=train_test_split(x,y,test_size=0.2,random_state=0)
```

```
In [41]: x_test.shape
```

```
Out[41]: (10, 6)
```

```
In [42]: x_train.shape
```

```
Out[42]: (40, 6)
```

```
In [43]: y_train.shape
```

```
Out[43]: (40, 1)
```

```
In [44]: y_test.shape
```

```
Out[44]: (10, 1)
```

```
In [45]: from sklearn.linear_model import LinearRegression  
mlr=LinearRegression()  
mlr.fit(x_train,y_train)
```

```
Out[45]: LinearRegression(copy_X=True, fit_intercept=True, n_jobs=None,  
normalize=False)
```

```
In [46]: y_pred=mlr.predict(x_test)
```

In [47]: x\_test

```
Out[47]: array([[0.000000e+00, 1.000000e+00, 0.000000e+00, 6.6051520e+04,
   1.8264556e+05, 1.1814820e+05],
 [1.000000e+00, 0.000000e+00, 0.000000e+00, 1.0067196e+05,
  9.1790610e+04, 2.4974455e+05],
 [0.000000e+00, 1.000000e+00, 0.000000e+00, 1.0191308e+05,
  1.1059411e+05, 2.2916095e+05],
 [0.000000e+00, 1.000000e+00, 0.000000e+00, 2.7892920e+04,
  8.4710770e+04, 1.6447071e+05],
 [0.000000e+00, 1.000000e+00, 0.000000e+00, 1.5344151e+05,
  1.0114555e+05, 4.0793454e+05],
 [0.000000e+00, 0.000000e+00, 1.000000e+00, 7.2107600e+04,
  1.2786455e+05, 3.5318381e+05],
 [0.000000e+00, 0.000000e+00, 1.000000e+00, 2.0229590e+04,
  6.5947930e+04, 1.8526510e+05],
 [0.000000e+00, 0.000000e+00, 1.000000e+00, 6.1136380e+04,
  1.5270192e+05, 8.8218230e+04],
 [0.000000e+00, 1.000000e+00, 0.000000e+00, 7.3994560e+04,
  1.2278275e+05, 3.0331926e+05],
 [0.000000e+00, 1.000000e+00, 0.000000e+00, 1.4210734e+05,
  9.1391770e+04, 3.6616842e+05]])
```

In [48]: y\_test

```
Out[48]: array([[103282.38],
 [144259.4 ],
 [146121.95],
 [ 77798.83],
 [191050.39],
 [105008.31],
 [ 81229.06],
 [ 97483.56],
 [110352.25],
 [166187.94]])
```

```
In [49]: y_pred
```

```
Out[49]: array([[103015.20159794],  
[132582.27760817],  
[132447.73845174],  
[ 71976.09851258],  
[178537.48221058],  
[116161.24230168],  
[ 67851.69209676],  
[ 98791.73374684],  
[113969.43533015],  
[167921.06569553]])
```

```
In [50]: from sklearn.metrics import r2_score  
accuracy=r2_score(y_test,y_pred)
```

```
In [51]: accuracy
```

```
Out[51]: 0.9347068473282567
```

```
In [52]: #Random prediction, state col has been splitted into 3 cols and 1st enter it's value then rest  
y=mlr.predict([[0,0,1,12345,123456,123456]])#0,0,1 is for 1 is Florida and 6 cols so 6 values
```

```
In [53]: y
```

```
Out[53]: array([[61381.51739101]])
```

```
In [54]: y[0][0]
```

```
Out[54]: 61381.51739101054
```

## Decision Tree

```
In [59]: from sklearn.tree import DecisionTreeRegressor  
dtr=DecisionTreeRegressor(random_state=0)  
dtr.fit(x_train,y_train)
```

```
Out[59]: DecisionTreeRegressor(criterion='mse', max_depth=None, max_features=None,  
max_leaf_nodes=None, min_impurity_decrease=0.0,  
min_impurity_split=None, min_samples_leaf=1,  
min_samples_split=2, min_weight_fraction_leaf=0.0,  
presort=False, random_state=0, splitter='best')
```

```
In [80]: y_dtr=dtr.predict(x_test)
```

```
In [81]: y_dtr
```

```
Out[81]: array([101004.64, 141585.52, 141585.52, 78239.91, 182901.99, 107404.34,  
69758.98, 97427.84, 108733.99, 182901.99])
```

```
In [82]: y_test
```

```
Out[82]: array([[103282.38],  
[144259.4 ],  
[146121.95],  
[ 77798.83],  
[191050.39],  
[105008.31],  
[ 81229.06],  
[ 97483.56],  
[110352.25],  
[166187.94]])
```

```
In [83]: accuracy_dtr=r2_score(y_test,y_dtr)
```

```
In [84]: accuracy_dtr # more accuracy
```

```
Out[84]: 0.9594341740623319
```

```
for draw decision tree
```

```
from sklearn import tree  
tree.export_graphviz(dtr)  
from sklearn.externals.six import StringIO
```

```
from IPython.display import Image
from sklearn.tree import export_graphviz
import pydotplus
dot_data = StringIO()
export_graphviz(dtr, out_file=dot_data,
                filled=True, rounded=True,
                special_characters=True)
graph = pydotplus.graph_from_dot_data(dot_data.getvalue())
Image(graph.create_png())
```

In [70]: `yd=dtr.predict([[1,0,0,12345,23456,6789]])`

In [71]: `yd`

Out[71]: `array([65200.33])`

## Random Forest

In [72]: `from sklearn.ensemble import RandomForestRegressor
rfr = RandomForestRegressor(n_estimators = 10,random_state = 0)#n_estimator is more then more accu or may be not
rfr.fit(x_train,y_train)`

C:\Users\anikp\Anaconda3\lib\site-packages\ipykernel\_launcher.py:3: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n\_samples,), for example using ravel().  
This is separate from the ipykernel package so we can avoid doing imports until

Out[72]: `RandomForestRegressor(bootstrap=True, criterion='mse', max_depth=None,
max_features='auto', max_leaf_nodes=None,
min_impurity_decrease=0.0, min_impurity_split=None,
min_samples_leaf=1, min_samples_split=2,
min_weight_fraction_leaf=0.0, n_estimators=10, n_jobs=None,
oob_score=False, random_state=0, verbose=0, warm_start=False)`

In [77]: `y_rfr=rdr.predict(x_test)`

In [78]: `accuracy_rfr=r2_score(y_test,y_rfr)`

In [79]: `accuracy_rfr#omore accuracy`

Out[79]: 0.9658739721928109

In [ ]: