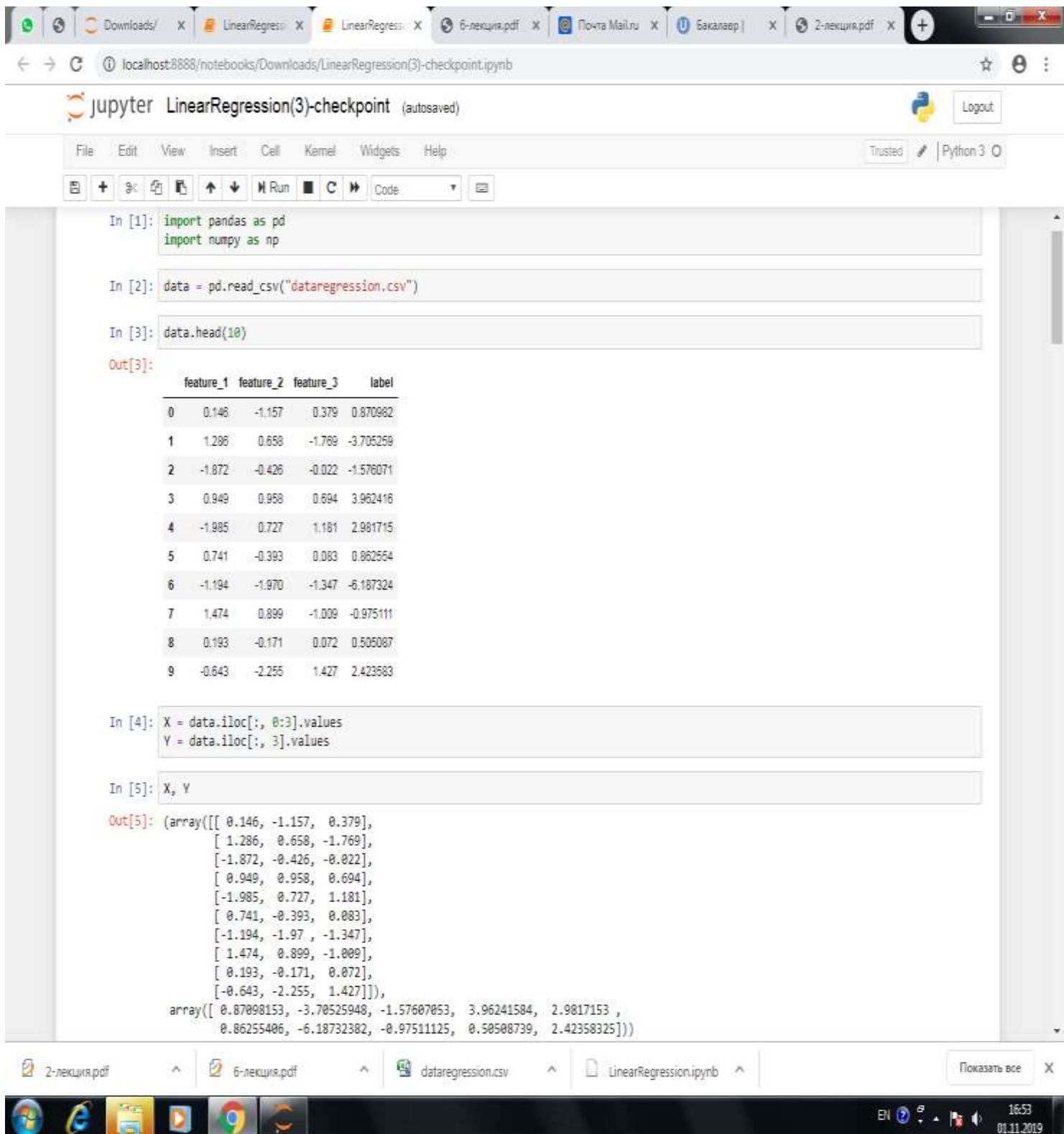


Лабораторное занятие 7. Метод логистической регрессии на Python -е

7-зертханалық сабақ. Python да логистикалық регрессия әдісін жүзеге асыру.



The screenshot displays a Jupyter Notebook titled "LinearRegression(3)-checkpoint (autosaved)" running on a local host. The notebook contains the following code and output:

```
In [1]: import pandas as pd
import numpy as np

In [2]: data = pd.read_csv("dataregression.csv")

In [3]: data.head(10)
```

Out[3]:

	feature_1	feature_2	feature_3	label
0	0.146	-1.157	0.379	0.870982
1	1.286	0.658	-1.769	-3.705259
2	-1.872	-0.426	-0.022	-1.576071
3	0.949	0.958	0.694	3.962416
4	-1.985	0.727	1.181	2.981715
5	0.741	-0.393	0.083	0.862564
6	-1.194	-1.970	-1.347	-6.187324
7	1.474	0.899	-1.009	-0.975111
8	0.193	-0.171	0.072	0.505087
9	-0.643	-2.255	1.427	2.423583

```
In [4]: X = data.iloc[:, 0:3].values
Y = data.iloc[:, 3].values

In [5]: X, Y

Out[5]: (array([[ 0.146, -1.157,  0.379],
 [ 1.286,  0.658, -1.769],
 [-1.872, -0.426, -0.022],
 [ 0.949,  0.958,  0.694],
 [-1.985,  0.727,  1.181],
 [ 0.741, -0.393,  0.083],
 [-1.194, -1.97 , -1.347],
 [ 1.474,  0.899, -1.009],
 [ 0.193, -0.171,  0.072],
 [-0.643, -2.255,  1.427]]),
 array([ 0.87098153, -3.70525948, -1.57607053,  3.96241584,  2.9817153 ,
  0.86255406, -6.18732382, -0.97511125,  0.50508739,  2.42358325]))
```

The bottom of the image shows the Windows taskbar with the date 01.11.2019 and time 16:53.

```
In [6]: X = np.hstack([ np.ones((10, 1)), X])
```

```
In [7]: X
```

```
Out[7]: array([[ 1. ,  0.146, -1.157,  0.379],
 [ 1. ,  1.286,  0.658, -1.769],
 [ 1. , -1.872, -0.426, -0.022],
 [ 1. ,  0.949,  0.958,  0.694],
 [ 1. , -1.985,  0.727,  1.181],
 [ 1. ,  0.741, -0.393,  0.083],
 [ 1. , -1.194, -1.97 , -1.347],
 [ 1. ,  1.474,  0.899, -1.009],
 [ 1. ,  0.193, -0.171,  0.072],
 [ 1. , -0.643, -2.255,  1.427]])
```

```
In [8]: X_tr = np.transpose(X)
X_tr_X = np.dot(X_tr, X)
X_tr_X_inv = np.linalg.inv(X_tr_X)
coef = np.dot(X_tr_X_inv, X_tr)
params_analytic = np.dot(coef, Y)
```

```
In [9]: X_tr_X, X_tr_X_inv
```

```
Out[9]: (array([[10. , -0.905, -3.13 , -0.311 ],
 [-0.905, 14.618413,  5.74384, -4.585205],
 [-3.13 ,  5.74384, 13.357198, -1.586011],
 [-0.311 , -4.585205, -1.586011, 10.030775]]),
 array([[ 0.10850148, -0.00174249,  0.02698602,  0.00683441],
 [-0.00174249,  0.09436244, -0.03655694,  0.03730016],
 [ 0.02698602, -0.03655694,  0.09604311, -0.00056169],
 [ 0.00683441,  0.03730016, -0.00056169,  0.1168667 ]]))
```

```
In [10]: params_analytic
```

```
Out[10]: array([0.31749375, 0.78032738, 0.74979223, 3.08462768])
```

```
In [11]: teta_grad_start = np.zeros(4)
learning_rate = 0.001
epsilon = 0.00001
max_iter = 10000
```

Downloads/ LinearRegression(3)-checkpoint LinearRegression(3)-checkpoint 6-лекция.pdf Почта Mail.ru Бакараев 2-лекция.pdf

localhost:8888/notebooks/Downloads/LinearRegression(3)-checkpoint.ipynb

jupyter LinearRegression(3)-checkpoint (autosaved) Logout

File Edit View Insert Cell Kernel Widgets Help Trusted Python 3

```
def step(teta):
    return teta - learning_rate * (1.0/10) * np.dot(np.transpose(X), (np.dot(X, teta) - Y))

teta_GD = teta_grad_start
for i in range(max_iter):
    teta_GD_new = step(teta_GD)
    if np.sum(np.abs(teta_GD_new - teta_GD)) <= epsilon:
        break
    else:
        teta_GD = teta_GD_new

print(i)
print(teta_GD)
```

8454
[0.31673068 0.77492892 0.75208069 3.07801993]

In [12]: from sklearn.linear_model import LinearRegression

In [13]: LR = LinearRegression()

In [14]: X = data.iloc[:, 0:3].values
Y = data.iloc[:, 3].values
LR.fit(X, Y)

Out[14]: LinearRegression(copy_X=True, fit_intercept=True, n_jobs=None, normalize=False)

In [15]: LR.coef_, LR.intercept_

Out[15]: (array([0.78032738, 0.74979223, 3.08462768]), 0.31749374659996565)

In [16]: Y_pred=LR.predict(X)

In [17]: Y_pred

Out[17]: array([0.73298582, -3.64234832, -1.53055241, 3.917057, 2.95658814,
0.85707209, -6.24630133, -0.97062981, 0.56197565, 2.52672546])

In [18]: eps=Y-Y_pred
eps

2-лекция.pdf 6-лекция.pdf dataregression.csv LinearRegression.ipynb Показать все

16:56 01.11.2019

Downloads/ LinearRegression LinearRegression 6-лекция.pdf Почта Mail.ru Sakasap 2-лекция.pdf

localhost8888/notebooks/Downloads/LinearRegression(3)-checkpoint.ipynb

Jupyter LinearRegression(3)-checkpoint (autosaved)

File Edit View Insert Cell Kernel Widgets Help Trusted Python 3

In [18]:

```
eps=Y-Y_pred
eps
```

Out[18]: array([0.13799571, -0.06291116, -0.04551812, 0.04535884, 0.02512716,
 0.00548197, 0.05897751, -0.00448144, -0.05688826, -0.10314221])

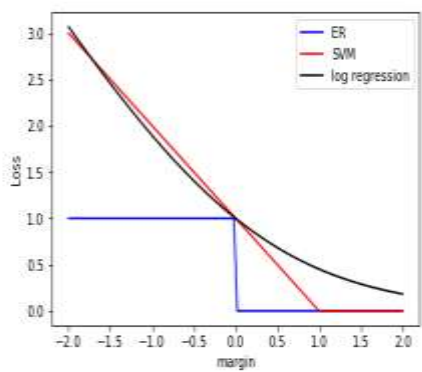
In [24]:

```
from sklearn import metrics
print("r2=", metrics.r2_score(Y,Y_pred))
```

r2= 0.9994844216048888

In [26]:

```
%matplotlib inline
import numpy as np
import matplotlib.pyplot as plt
X = np.linspace(-20, 20, 100) / 10.0
plt.plot(X, [1 if x < 0 else 0 for x in X], color = [0, 0, 1], label="ER")
plt.plot(X, [0 if ((1 - x) < 0) else (1 - x) for x in X], color = [1, 0, 0], label="SVM")
)
plt.plot(X, np.log2(1 + np.exp(-1 * X)), color = [0, 0, 0], label="log regression")
plt.legend()
plt.xlabel("margin")
plt.ylabel("Loss")
plt.show()
```



In [27]:

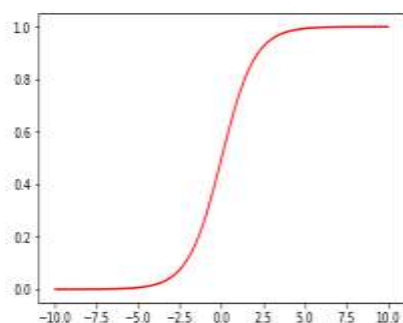
```
X = np.linspace(-100, 100, 100) / 10.0
plt.plot(X, 1 / (1 + np.exp(-1 * X)), color = [1, 0, 0])
```

Out[27]:

2-лекция.pdf 6-лекция.pdf data_regression.csv LinearRegression.ipynb Показать все

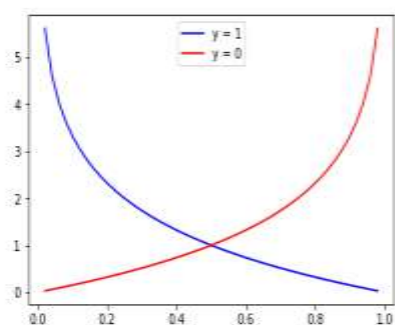
16:57 01.11.2019

Out[27]: [matplotlib.lines.Line2D at 0xb579f28]



```
In [28]: X = np.linspace(0, 10, 50) / 10.0
X = X[1:-1]
plt.plot(X, np.log2(X) * -1, color = [0, 0, 1], label="y = 1")
plt.plot(X, np.log2(1 - X) * -1, color = [1, 0, 0], label="y = 0")
plt.legend()
```

Out[28]: <matplotlib.legend.Legend at 0xb5a8ba8>



```
In [29]: from sklearn import linear_model, datasets
from sklearn.model_selection import train_test_split
```


Downloads/ LinearRegression LinearRegression 6-лекция.pdf Почта Mail.ru Sakasap 2-лекция.pdf

localhost:8888/notebooks/Downloads/LinearRegression(3)-checkpoint.ipynb

jupyter LinearRegression(3)-checkpoint (autosaved) Logout

File Edit View Insert Cell Kernel Widgets Help Trusted Python 3

```
from sklearn.metrics import confusion_matrix
import seaborn as sns
import pandas as pd
```

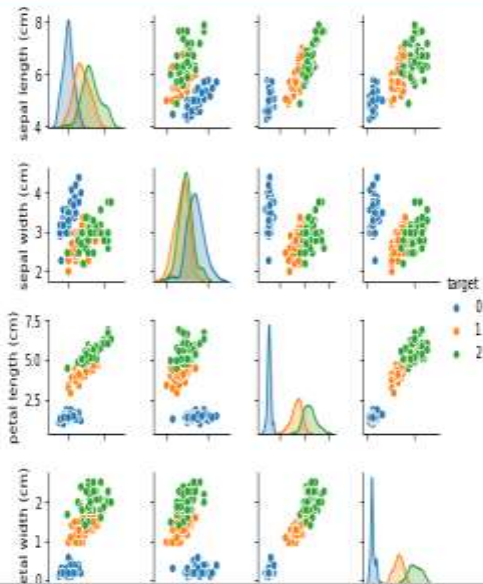
In [30]: iris = datasets.load_iris()

In [31]: iris.feature_names

Out[31]: ['sepal length (cm)',
'sepal width (cm)',
'petal length (cm)',
'petal width (cm)']

In [35]: X_DF=pd.DataFrame(data=iris.data,columns=iris.feature_names)
X_DF["target"]=iris.target
g=sns.pairplot(X_DF,hue="target",vars=iris.feature_names,size=1.5)

C:\ProgramData\Anaconda3\lib\site-packages\seaborn\axisgrid.py:2065: UserWarning: The 'size' parameter has been renamed to 'height'; please update your code.
warnings.warn(msg, UserWarning)



2-лекция.pdf 6-лекция.pdf dataregression.csv LinearRegression.ipynb Показать все

EN 16:59 01.11.2019



```
In [37]: X = iris.data
y = iris.target
X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.5, random_state=42)
```

```
In [39]: logreg = linear_model.LogisticRegression()
logreg.fit(X_train, y_train)
```

C:\ProgramData\Anaconda3\lib\site-packages\sklearn\linear_model\logistic.py:433: FutureWarning: Default solver will be changed to 'lbfgs' in 0.22. Specify a solver to silence this warning.
FutureWarning)
C:\ProgramData\Anaconda3\lib\site-packages\sklearn\linear_model\logistic.py:460: FutureWarning: Default multi_class will be changed to 'auto' in 0.22. Specify the multi_class option to silence this warning.
"this warning.", FutureWarning)

```
Out[39]: LogisticRegression(C=1.0, class_weight=None, dual=False, fit_intercept=True,
        intercept_scaling=1, max_iter=100, multi_class='warn',
        n_jobs=None, penalty='l2', random_state=None, solver='warn',
        tol=0.0001, verbose=0, warm_start=False)
```

```
In [40]: y_pred = logreg.predict(X_test)
```

```
In [41]: confusion_matrix(y_test, y_pred)
```

```
Out[41]: array([[29,  0,  0],
               [ 0, 21,  2],
               [ 0,  0, 23]], dtype=int64)
```

```
In [42]: logreg.coef_, logreg.intercept_
```

```
Out[42]: (array([[ 0.34727293,  1.1961666 , -1.92844924, -0.85983715],
                [ 0.45226594, -1.40595322,  0.34170865, -0.88352211],
                [-1.3541608 , -1.23978952,  2.01033825,  1.82990522]]),
         array([ 0.22596203,  0.66625886, -0.87817104]))
```

```
In [ ]:
```