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In [1]: import numpy as np
import matplotlib.pyplot as plt
from sklearn.metrics import mean_squared_error

credit = np.genfromtxt("../data/german_credit.csv", delimiter=";", skip_header=True)
dataAmount = np.shape(credit)[0]

creditability = credit[:, 0]

features = credit[:, 1:]
features_min = np.min(features, axis=0)
features_max = np.max(features, axis=0)
features_nrm = (features - features_min) / (features_max - features_min)
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In [2]: iterations = 1000
learning_rate = 0.03

#generate random parameters for each feature (column)
def parameters(data, seed):
    np.random.seed(seed)
    return np.random.rand(data.shape[1])

#calculate the prediction for each row
def hypothesis (x, coefficients):
    return np.matmul(x, coefficients)

#def Loss_function(predictions, target):
#    return return -np.mean(target * np.Log(predictions) + (1 - target) * np.Log(1 - p

bias = np.random.randn()
prediction_rates = np.empty(iterations);

#TODO 1: Linear Regression for Credit
theta = parameters(features_nrm, 1)
for i in range(iterations):
    h = hypothesis(features_nrm, theta)
    binary_h = np.where(h > 0.5, 1, 0)
    prediction_error = np.sum(binary_h - creditability)
    prediction_rate = (np.shape(creditability)[0] - prediction_error) / np.shape(c
    prediction_rates[i] = prediction_rate
    diff = h - creditability

    theta_delta = np.matmul(features_nrm.T, diff)
    theta_delta_nrm = learning_rate / np.shape(features_nrm)[0] * theta_delta
    theta = np.subtract(theta, theta_delta_nrm)

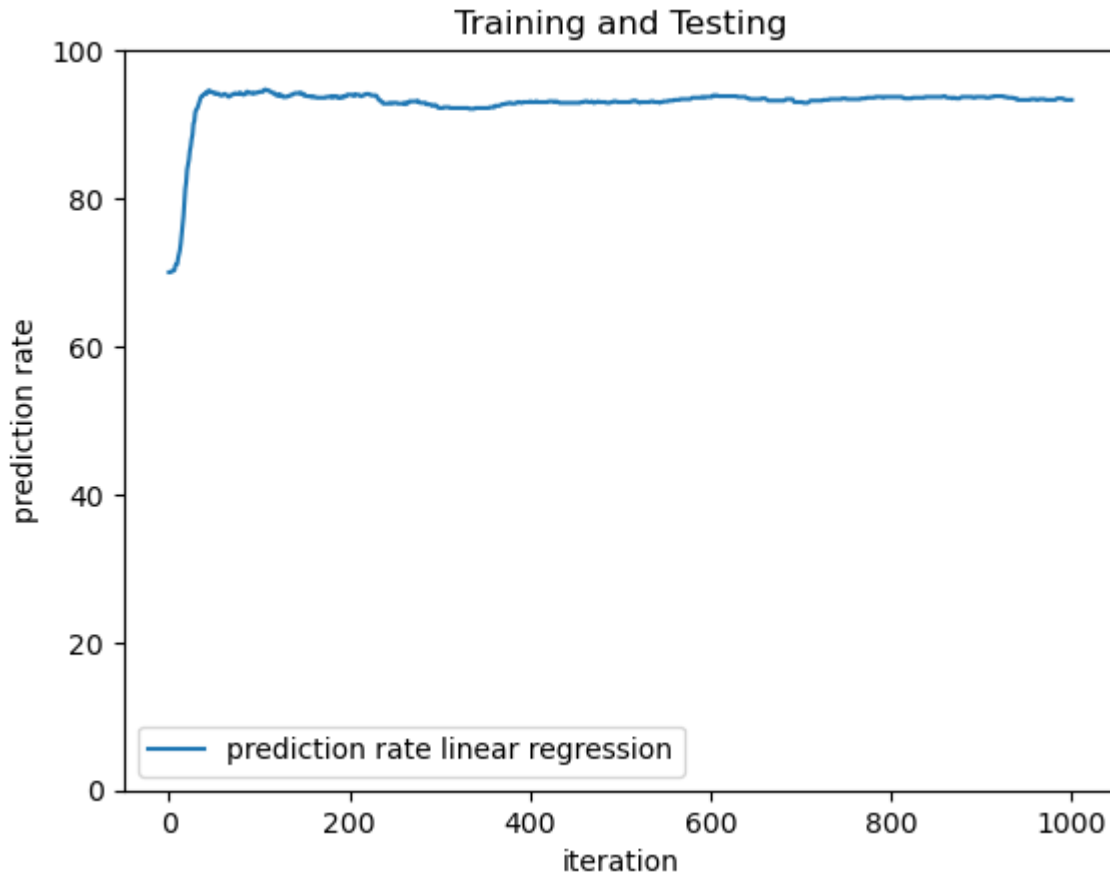
    #TODO fix the stopping condition
    # sum_of_abs_changes = np.sum(np.abs(theta_delta_nrm))
    # if sum_of_abs_changes < 0.0001:
    #     theta = parameters(features_nrm, i)
    #     break
```

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In [3]: x = np.linspace(0, iterations, iterations)
plt.ylim(0, 100)
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plt.plot(x, prediction_rates, label='prediction rate linear regression')

plt.xlabel('iteration')
plt.ylabel('prediction rate')
plt.title('Training and Testing')
plt.legend()
```

Out[3]: <matplotlib.legend.Legend at 0x11a860c39d0>



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In [4]: #TODO 2: Logistic Regression for Credit

def sigmoid(x):
    return 1 / (1 + np.exp(-x))

def hypothesisSigmoid (x, coefficients):
    return sigmoid(np.matmul(x, coefficients))

theta = parameters(features_nrm, 1)
for i in range(iterations):
    h = hypothesisSigmoid(features_nrm, theta)
    binary_h = np.where(h > 0.5, 1, 0)
    prediction_error = np.sum(binary_h - creditability)
    prediction_rate = (np.sum(creditability) / np.shape(creditability)[0]) - prediction_error / np.shape(creditability)[0]
    prediction_rates[i] = prediction_rate
    diff = h - creditability

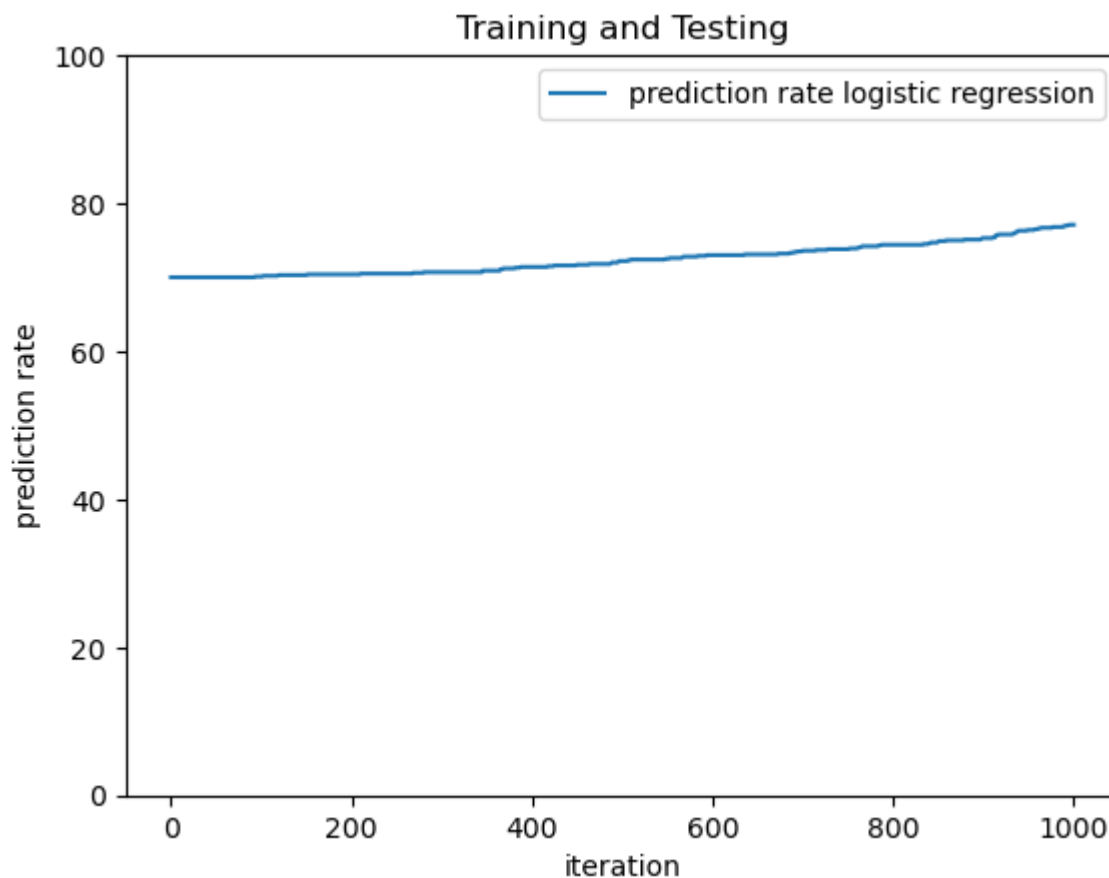
    theta_delta = np.matmul(features_nrm.T, diff)
    theta_delta_nrm = learning_rate / np.shape(features_nrm)[0] * theta_delta
    theta = np.subtract(theta, theta_delta_nrm)
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In [5]: x = np.linspace(0, iterations, iterations)
plt.ylim(0, 100)

plt.plot(x, prediction_rates, label='prediction rate logistic regression')

plt.xlabel('iteration')
plt.ylabel('prediction rate')
plt.title('Training and Testing')
plt.legend()
```

Out[5]: <matplotlib.legend.Legend at 0x11a862a0950>



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In [6]: #TODO 3: split Data in Train and Test
from sklearn.model_selection import train_test_split

X_train, X_test, y_train, y_test = train_test_split(
    features_nrm, creditability, test_size=0.1, stratify=creditability, random_state=42
)

train_size = X_train.shape[0]
test_size = X_test.shape[0]

train_prediction_rates = np.empty(iterations)
test_prediction_rates = np.empty(iterations)

theta = parameters(X_train, 1)
for i in range(iterations):
    h_train = hypothesis(X_train, theta)
    binary_h_train = np.where(h_train > 0.5, 1, 0)
    train_prediction_error = np.sum(binary_h_train - y_train)
    train_prediction_rate = (train_size - train_prediction_error) / train_size * 100
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train_prediction_rates[i] = train_prediction_rate
diff = h_train - y_train

theta_delta = np.matmul(X_train.T, diff)
theta_delta_nrm = learning_rate / train_size * theta_delta
theta = np.subtract(theta, theta_delta_nrm)

# Calculate prediction rate for the test set
h_test = hypothesis(X_test, theta)
binary_h_test = np.where(h_test > 0.5, 1, 0)
test_prediction_error = np.sum(binary_h_test - y_test)
test_prediction_rate = (test_size - test_prediction_error) / test_size * 100
test_prediction_rates[i] = test_prediction_rate

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In [7]: x = np.linspace(0, iterations, iterations)
plt.ylim(0, 100)

#plt.plot(x, prediction_rates, Label='prediction rate regression')

plt.plot(x, train_prediction_rates, label='Training set')
plt.plot(x, test_prediction_rates, label='Test set')

plt.xlabel('iteration')
plt.ylabel('prediction rate')
plt.title('Training and Testing')
plt.legend()

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Out[7]: <matplotlib.legend.Legend at 0x11a86b73750>

