课后作业: 神经网络(Neural Networks)

作者: 欧新宇 (Xinyu OU)

本文档所展示的测试结果,均运行于: Intel Core i7-7700K CPU 4.2GHz

【作业提交】

将分类结果保存到文本文档进行提交(写上每一题的题号和题目,然后再贴答案),同时提交源代码。

- 1. 测试结果命名为: ex08-结果-你的学号-你的姓名.txt
- 2. 输出图片命名为: ex08-性能对比图-你的学号-你的姓名.png (.jpg)
- 3. 源代码命名为:
- ex08-01Baseline-你的学号-你的姓名.py
- ex08-02Single-你的学号-你的姓名.py
- ex08-03Multi-你的学号-你的姓名.py
- ex08-04Logistic-你的学号-你的姓名.py
- ex08-05Tanh-你的学号-你的姓名.py
- ex08-06ReLU-你的学号-你的姓名.py
- ex08-07All-你的学号-你的姓名.py

结果文件,要求每小题标注题号,两题之间要求空一行

要求在 "鸢尾花" 数据集上完成以下任务, 要求如下:

- 1. 要求训练集和测试集的分割比例为: 1:9
- 2. 先构建一个基于默认参数的Baseline模型 (ex08-01Baseline) ,分别在Baseline的基础上设置单 隐层模型(增加/减少神经元) (ex08-02Single) 、多隐层模型 (ex08-03Multi) ,并输出评分结果。【注意:该题可能需要多次运行,并选择一个出一个较好的结果,提供给第3题使用。】
- 3. 选择一个较好的模型,在此基础上测试三种不同的激活函数 {'logistic', 'tanh', 'relu'},并输出评分结果。分别命名为:ex08-04Logistic,ex08-05Tanh,ex08-06ReLU。
- 4. 对以上六个模型 {'Baseline', 'Single', 'Multi', 'Logistic', 'Tanh', 'ReLU'}, 绘制测试集性能曲线图. (ex08-07All, ex08-性能对比图)
- 5. 所有模型性能评分,都写入文件(ex08-结果),格式为:

```
1 01Baseline: 训练集准确率: 1.0000, 测试集准确率: 0.9704.
2 02Single: 训练集准确率: 1.0000, 测试集准确率: 0.9630.
3 ...
4 06ReLU: 训练集准确率: 1.0000, 测试集准确率: 0.9778.
```

数据集载入方法

```
from sklearn import datasets
iris = datasets.load_iris()

统一设置: random_state=10
```

Baseline

```
1 # TODO: 1. 导入必须库 以及 定义必要的函数
 2
   # 导入数据集工具包
   from sklearn import datasets
   from sklearn.model_selection import train_test_split
   # 导入MLP神经网络包
   from sklearn.neural_network import MLPClassifier
 7
 8
   # TODO: 2. 创建/导入数据
 9
   iris = datasets.load_iris()
10
11 # TODO: 3. 数据预处理,包括训练集、测试集划分,数据正则化,数据清洗等
12 \mid X = iris.data
13
   y = iris.target
14 X_train, X_test, y_train, y_test = train_test_split(X, y, train_size=0.1,
    random_state=10)
15
16 # TODO: 4. 构建模型,并进行模型训练(或称为拟合数据)
17
   mlp_Baseline = MLPClassifier(solver='lbfgs', random_state=10)
18
   mlp_Baseline.fit(X_train, y_train)
19
20 # TODO: 5. 输出预测结果
21 | score_train = mlp_Baseline.score(X_train, y_train)
   score_test = mlp_Baseline.score(X_test, y_test)
23 print("训练集准确率: {0:.4f}, 测试集准确率: {1:.4f}.".format(score_train,
    score_test))
24
```

1 训练集准确率: 1.0000, 测试集准确率: 0.9704.

Single

```
1 # TODO: 1. 导入必须库 以及 定义必要的函数
 2 # 导入数据集工具包
   from sklearn import datasets
   from sklearn.model_selection import train_test_split
   # 导入MLP神经网络包
   from sklearn.neural_network import MLPClassifier
 6
 7
   # TODO: 2. 创建/导入数据
 8
9
   iris = datasets.load_iris()
10
11 # TODO: 3. 数据预处理,包括训练集、测试集划分,数据正则化,数据清洗等
   X = iris.data
12
   y = iris.target
13
   X_train, X_test, y_train, y_test = train_test_split(X, y, train_size=0.1,
    random_state=10)
15
   # TODO: 4. 构建模型,并进行模型训练(或称为拟合数据)
16
17
   mlp_Single = MLPClassifier(solver='lbfgs', random_state=10,
18
                              hidden_layer_sizes=[10])
19
   mlp_Single.fit(X_train, y_train)
20
   # TODO: 5. 输出预测结果
21
22
   score_train = mlp_Single.score(X_train, y_train)
23
   score_test = mlp_Single.score(X_test, y_test)
```

```
print("训练集准确率: {0:.4f}, 测试集准确率: {1:.4f}.".format(score_train, score_test))

25
```

```
1 训练集准确率: 1.0000, 测试集准确率: 0.9630.
```

Multi

```
1 # TODO: 1. 导入必须库 以及 定义必要的函数
   # 导入数据集工具包
 2
 3
   from sklearn import datasets
   from sklearn.model_selection import train_test_split
   # 导入MLP神经网络包
   from sklearn.neural_network import MLPClassifier
 7
   # TODO: 2. 创建/导入数据
 8
9
   iris = datasets.load_iris()
10
11 # TODO: 3. 数据预处理,包括训练集、测试集划分,数据正则化,数据清洗等
12 \mid X = iris.data
13
   y = iris.target
   X_train, X_test, y_train, y_test = train_test_split(X, y, train_size=0.1,
   random_state=10)
15
   # TODO: 4. 构建模型,并进行模型训练(或称为拟合数据)
16
17
   mlp_Multi = MLPClassifier(solver='lbfgs', random_state=10,
                              hidden_layer_sizes=[32, 128, 128] )
18
19
   mlp_Multi.fit(X_train, y_train)
20
21 # TODO: 5. 输出预测结果
   score_train = mlp_Multi.score(X_train, y_train)
22
23
   score_test = mlp_Multi.score(X_test, y_test)
   print("训练集准确率: {0:.4f}, 测试集准确率: {1:.4f}.".format(score_train,
    score_test))
25
```

```
1 训练集准确率: 1.0000, 测试集准确率: 0.9778.
```

Logistic

```
1 # TODO: 1. 导入必须库 以及 定义必要的函数
   # 导入数据集工具包
   from sklearn import datasets
   from sklearn.model_selection import train_test_split
   # 导入MLP神经网络包
5
6
   from sklearn.neural_network import MLPClassifier
7
   # TODO: 2. 创建/导入数据
9
   iris = datasets.load_iris()
10
   # TODO: 3. 数据预处理,包括训练集、测试集划分,数据正则化,数据清洗等
11
12 X = iris.data
13
   y = iris.target
```

```
14 | X_train, X_test, y_train, y_test = train_test_split(X, y, train_size=0.1,
    random_state=10)
15
16
   # TODO: 4. 构建模型,并进行模型训练(或称为拟合数据)
17
    mlp_Logistic = MLPClassifier(solver='lbfgs', random_state=10,
    activation='logistic',
                                hidden_layer_sizes=[32, 128, 128] )
18
19
   mlp_Logistic.fit(X_train, y_train)
20
   # TODO: 5. 输出预测结果
21
   score_train = mlp_Logistic.score(X_train, y_train)
22
23
   score_test = mlp_Logistic.score(X_test, y_test)
   print("训练集准确率: {0:.4f}, 测试集准确率: {1:.4f}.".format(score_train,
    score_test))
25
```

```
1 训练集准确率: 1.0000, 测试集准确率: 0.9556.
```

Tanh

```
1 # TODO: 1. 导入必须库 以及 定义必要的函数
   # 导入数据集工具包
   from sklearn import datasets
   from sklearn.model_selection import train_test_split
5
   # 导入MLP神经网络包
6
   from sklearn.neural_network import MLPClassifier
   # TODO: 2. 创建/导入数据
9
   iris = datasets.load_iris()
10
   # TODO: 3. 数据预处理,包括训练集、测试集划分,数据正则化,数据清洗等
11
12
   X = iris.data
13
   y = iris.target
   X_train, X_test, y_train, y_test = train_test_split(X, y, train_size=0.1,
   random_state=10)
15
   # TODO: 4. 构建模型,并进行模型训练(或称为拟合数据)
16
17
   mlp_Tanh = MLPClassifier(solver='lbfgs', random_state=10,
   activation='tanh',
18
                              hidden_layer_sizes=[32, 128, 128] )
19
   mlp_Tanh.fit(X_train, y_train)
20
21 # TODO: 5. 输出预测结果
   score_train = mlp_Tanh.score(X_train, y_train)
23
   score_test = mlp_Tanh.score(X_test, y_test)
   print("训练集准确率: {0:.4f}, 测试集准确率: {1:.4f}.".format(score_train,
   score_test))
25
```

```
1 训练集准确率: 1.0000, 测试集准确率: 0.9556.
```

ReLU

```
2 # 导入数据集工具包
   from sklearn import datasets
   from sklearn.model_selection import train_test_split
   # 导入MLP神经网络包
   from sklearn.neural_network import MLPClassifier
 7
 8
   # TODO: 2. 创建/导入数据
9
   iris = datasets.load_iris()
10
11
   # TODO: 3. 数据预处理,包括训练集、测试集划分,数据正则化,数据清洗等
   X = iris.data
12
13
   y = iris.target
   X_train, X_test, y_train, y_test = train_test_split(X, y, train_size=0.1,
14
    random_state=10)
15
   # TODO: 4. 构建模型,并进行模型训练(或称为拟合数据)
16
   mlp_ReLU = MLPClassifier(solver='lbfgs', random_state=10,
17
    activation='relu',
                               hidden_layer_sizes=[32, 128, 128] )
18
19
   mlp_ReLU.fit(X_train, y_train)
20
21
   # TODO: 5. 输出预测结果
22
   score_train = mlp_ReLU.score(X_train, y_train)
23 | score_test = mlp_ReLU.score(X_test, y_test)
   print("训练集准确率: {0:.4f}, 测试集准确率: {1:.4f}.".format(score_train,
    score_test))
25
```

1 训练集准确率: 1.0000, 测试集准确率: 0.9778.

所有方法对比

```
1 # TODO: 1. 导入必须库 以及 定义必要的函数
   import numpy as np
 3
   import matplotlib.pyplot as plt
   # 导入数据集工具包
 5
   from sklearn import datasets
   from sklearn.model_selection import train_test_split
   # 导入MLP神经网络包
 8
   from sklearn.neural_network import MLPClassifier
 9
   # TODO: 2. 创建/导入数据
10
11
   iris = datasets.load_iris()
12
13
   # TODO: 3. 数据预处理,包括训练集、测试集划分,数据正则化,数据清洗等
14
   X = iris.data
15
   y = iris.target
   X_train, X_test, y_train, y_test = train_test_split(X, y, train_size=0.1,
16
    random_state=10)
17
   xticks = ['Baseline', 'Single', 'Multi', 'Logistic', 'Tanh', 'ReLU']
18
   num = len(xticks)
19
20
   scores_test = np.zeros([1, num])
21
   # TODO: 4. 构建模型,并进行模型训练(或称为拟合数据)
22
23
   mlp_Baseline = MLPClassifier(solver='lbfgs', random_state=10)
```

```
24
    mlp_Baseline.fit(X_train, y_train)
25
    scores_test[0, 0] = mlp_Baseline.score(X_test, y_test)
26
    mlp_Single = MLPClassifier(solver='lbfgs', random_state=10,
27
    hidden_layer_sizes=[10])
28
    mlp_Single.fit(X_train, y_train)
29
    scores_test[0, 1] = mlp_Single.score(X_test, y_test)
30
31
    mlp_Multi = MLPClassifier(solver='lbfgs', random_state=10,
    hidden_layer_sizes=[32, 128, 128] )
32
    mlp_Multi.fit(X_train, y_train)
33
    scores_test[0, 2] = mlp_Multi.score(X_test, y_test)
34
35
36
    mlp_Logistic = MLPClassifier(solver='lbfgs', random_state=10,
    activation='logistic', hidden_layer_sizes=[32, 128, 128] )
37
    mlp_Logistic.fit(X_train, y_train)
38
    scores_test[0, 3] = mlp_Logistic.score(X_test, y_test)
39
40
    mlp_Tanh = MLPClassifier(solver='lbfgs', random_state=10,
41
    activation='tanh', hidden_layer_sizes=[32, 128, 128] )
42
    mlp_Tanh.fit(X_train, y_train)
43
    scores_test[0, 4] = mlp_Tanh.score(X_test, y_test)
44
45
    mlp_ReLU = MLPClassifier(solver='lbfgs', random_state=10,
46
    activation='relu', hidden_layer_sizes=[32, 128, 128] )
47
    mlp_ReLU.fit(X_train, y_train)
48
    scores_test[0, 5] = mlp_ReLU.score(X_test, y_test)
49
50
    plt.figure(dpi=100)
51
    plt.plot(scores_test[0, :], label='Test')
52
   plt.legend(loc='best')
53
    plt.savefig('results/Ch08Hw01NN.png', dpi=150)
    plt.show()
```

