## 20220426-C++

- 1.过程描述
- 2.结果输出

## 1.过程描述

```
C++ 2 复制代码
    knn.h
     #ifndef __KNN_H
 1
 2
     #define __KNN_H
 3
 4 ▼ #include "Common.h"
 5
   // O(k*n) where k is the number of neighbors and N is the size of
6
     training data
7
     // 0(n) + 0(k*n) + k
8
     class KNN : public CommonData
 9
10 ▼ {
11
       int k;
12
       std::vector<Data *> * neighbors;
13
14
       public:
15
       KNN(int);
16
       KNN();
17
       ~KNN();
18
19
       void findKnearest(Data *queryPoint);
20
       void setK(int val);
       int findMostFrequentClass();
21
       double calculateDistance(Data* gueryPoint, Data* input);
22
       double validatePerformance();
23
       double testPerformance();
24
25
     };
26
27
     #endif
```

▼ knn.cpp C++ C 复制代码

```
1 ▼ #include "knn.h"
     #include <cmath>
 3
     #include <limits>
     #include <map>
     #include "stdint.h"
 5
     #include "DataHandler.h"
 6
 8
 9
     KNN::KNN(int val)
10 ▼ {
11
          k = val;
12
     }
13
14
     KNN::KNN()
15 ▼ {
16
17
     }
18
19
     KNN::~KNN()
20 ▼ {
21
         // NOTHING TO DO
22
     }
23
24
     void KNN::findKnearest(Data* queryPoint)
25 ▼ {
26
          neighbors = new std::vector<Data*>;
27
          double min = std::numeric_limits<double>::max();
28
         double previousMin = min;
29
          int index;
         for (int i = 0; i < k; i++)
30
31 ▼
         {
32
              if (i == 0)
33 ▼
34
                  for (int j = 0; j < trainingData->size(); j++)
35 ▼
                  {
36
                      double dist = calculateDistance(queryPoint,
     trainingData->at(j));
37
                      trainingData->at(j)->setDistance(dist);
                      if (dist < min)</pre>
38
39 ▼
                      {
40
                          min = dist;
41
                          index = j;
42
                      }
                  }
43
44
                  neighbors->push_back(trainingData->at(index));
```

```
45
                  previousMin = min;
46
                  min = std::numeric_limits<double>::max();
              }
47
              else
48
49 -
              {
                  for (int j = 0; j < trainingData->size(); j++)
50
51 ▼
                  {
                      double dist = trainingData->at(j)->getDistance();
52
53
                      if (dist > previousMin && dist < min)</pre>
54 ▼
                      {
55
                          min = dist;
56
                          index = j;
                      }
57
58
                  }
59
                  neighbors->push_back(trainingData->at(index));
60
                  previousMin = min;
61
                  min = std::numeric_limits<double>::max();
62
              }
63
          }
64
     }
65
     void KNN::setK(int val)
66 ▼ {
67
          k = val;
68
     }
69
     int KNN::findMostFrequentClass()
70
71 ▼ {
72
          std::map<uint8_t, int> frequencyMap;
          for (int i = 0; i < neighbors->size(); i++)
73
74 ▼
75
              if (frequencyMap.find(neighbors->at(i)->getLabel()) ==
      frequencyMap.end())
76 ▼
              {
77
                  frequencyMap[neighbors->at(i)->getLabel()] = 1;
78
              }
              else
79
              {
80 ▼
81
                  frequencyMap[neighbors->at(i)->getLabel()]++;
82
              }
83
          }
84
85
          int best = 0;
86
          int max = 0;
87
88
          for (auto kv : frequencyMap)
89 -
          {
              if (kv.second > max)
90
              {
91 -
```

```
92
                  max = kv.second;
 93
                   best = kv.first;
              }
 94
          }
 95
 96
          delete neighbors;
           return best;
 97
 98
99
      }
100
101
      double KNN::calculateDistance(Data* queryPoint, Data* input)
102 ▼ {
103
          double value = 0;
104
          if (queryPoint->getNormalizedFeatureVector()->size() != input-
      >getNormalizedFeatureVector()->size())
105 ▼
              printf("Vector size mismatch.\n");
106
              exit(1);
107
          }
108
      #ifdef EUCLID
109
          for (unsigned i = 0; i < queryPoint->getNormalizedFeatureVector()-
110
      >size(); i++)
111 ▼
          {
112
              value += pow(queryPoint->getNormalizedFeatureVector()->at(i) -
      input->getNormalizedFeatureVector()->at(i), 2);
113
          }
          return sqrt(value);
114
      #elif defined MANHATTAN
115
          //do some stuff
116
117
      #endif
118
      }
119
120
      double KNN::validatePerformance()
121 ▼ {
122
          double current_performance = 0;
123
          int count = 0;
124
          int data index = 0;
          for (Data* gueryPoint : *validationData)
125
126 ▼
          {
127
              findKnearest(queryPoint);
128
               int prediction = findMostFrequentClass();
129
              data index++;
              if (prediction == queryPoint->getLabel())
130
131 ▼
              {
132
                   count++;
133
              }
              printf("Current Performance: %.3f %%\n", ((double)count) * 100.0
134
      / ((double)data index));
          }
135
```

```
136
           current_performance = ((double)count) * 100.0 /
       ((double)validationData->size());
137
           printf("Validation Performance for K = %d: %.3f\n", k,
      current performance);
           return current_performance;
138
      }
139
      double KNN::testPerformance()
140
141 ▼ {
142
          double current performance = 0;
143
           int count = 0;
          for (Data* queryPoint : *testData)
144
145 ▼
              findKnearest(queryPoint);
146
               int prediction = findMostFrequentClass();
147
               if (prediction == queryPoint->qetLabel())
148
149 ▼
              {
150
                   count++;
              }
151
          }
152
          current_performance = ((double)count) * 100.0 / ((double)testData-
153
      >size());
           printf("Validation Performance for K = %d: %.3f\n", k,
154
      current_performance);
           return current_performance;
155
      }
156
157
      int
158
159
      main()
160 ▼ {
161
          DataHandler* dh = new DataHandler();
          //dh->read csv("/home/gerardta/iris.data",",");
162
           dh->readInputData("train-images.idx3-ubyte");
163
          dh->readLabelData("train-labels.idx1-ubyte");
164
165
          dh->countClasses();
          dh->splitData();
166
          KNN* nearest = new KNN();
167
          nearest->setK(3);
168
           nearest->setTrainingData(dh->getTrainingData());
169
           nearest->setTestData(dh->getTestData());
170
           nearest->setValidationData(dh->getValidationData());
171
          double performance = 0;
172
          double best_performance = 0;
173
           int best k = 1;
174
           for (int k = 1; k \le 3; k++)
175
176 ▼
          {
              if (k == 1)
177
              {
178 ▼
179
                   performance = nearest->validatePerformance();
```

```
180
                   best_performance = performance;
              }
181
              else
182
183 ▼
              {
                   nearest->setK(k);
184
                   performance = nearest->validatePerformance();
185
                   if (performance > best_performance)
186
187 ▼
                   {
                       best_performance = performance;
188
                       best_k = k;
189
                   }
190
              }
191
192
          }
193
          nearest->setK(best_k);
          nearest->testPerformance();
194
195
      }
```

```
C++ 2 复制代码
    common.h
     #ifndef ___COMMON_HPP
 1
     #define COMMON HPP
 3 ▼ #include "data.h"
     #include <vector>
4
 5
     class CommonData
 6 ▼ {
     protected:
7
         std::vector<Data*>* trainingData;
8
9
         std::vector<Data*>* testData;
         std::vector<Data*>* validationData;
10
11
     public:
12
         void setTrainingData(std::vector<Data*>* vect);
         void setTestData(std::vector<Data*>* vect);
13
14
         void setValidationData(std::vector<Data*>* vect);
15
     };
     #endif
16
17
```

C++ 🗗 🗗 复制代码

```
common.cpp
 1 ▼ #include "common.h"
void CommonData::setTrainingData(std::vector<Data*>* vect)
4 ▼ {
         trainingData = vect;
 5
 6
     void CommonData::setTestData(std::vector<Data*>* vect)
         testData = vect;
9
10
     }
     void CommonData::setValidationData(std::vector<Data*>* vect)
11
12 ▼ {
13
         validationData = vect;
     }
14
```

C++ D 复制代码

```
#ifndef ___DATA_H
 1
 2
     #define DATA H
 3
 4 ▼ #include <vector>
 5
     #include "stdint.h" // uint8_t
     #include "stdio.h"
 6
     class Data
8 ▼ {
9
         std::vector<uint8 t>* featureVector;
10
         std::vector<double>* normalizedFeatureVector;
         std::vector<int>* classVector;
11
12
         uint8 t label;
         uint8 t enumeratedLabel; // A -> 1
13
14
         double distance:
15
16
     public:
17
         void setDistance(double);
18
         void setFeatureVector(std::vector<uint8 t>*);
19
         void setNormalizedFeatureVector(std::vector<double>*);
         void setClassVector(int counts);
20
         void appendToFeatureVector(uint8_t);
21
22
         void appendToFeatureVector(double);
23
         void setLabel(uint8 t);
24
         void setEnumeratedLabel(uint8 t);
25
         void printVector();
26
         void printNormalizedVector();
27
28
         double getDistance();
         int getFeatureVectorSize();
29
30
         uint8_t getLabel();
31
         uint8 t getEnumeratedLabel();
32
33
         std::vector<uint8_t>* getFeatureVector();
34
         std::vector<double>* getNormalizedFeatureVector();
35
         std::vector<int> getClassVector();
36
37
     };
38
39
     #endif
40
41
```

▼ data.cpp C++ C 复制代码

```
1 ▼ #include "data.h"
 2
 3
     void Data::setDistance(double dist)
 4 -
     {
 5
         distance = dist:
 6
 7
     void Data::setFeatureVector(std::vector<uint8_t>* vect)
8 ▼ {
9
         featureVector = vect;
10
     }
11
12
     void Data::setNormalizedFeatureVector(std::vector<double>* vect)
13
14 ▼ {
15
         normalizedFeatureVector = vect;
16
17
     void Data::appendToFeatureVector(uint8_t val)
18 ▼
     {
19
         featureVector->push_back(val);
20
21
     void Data::appendToFeatureVector(double val)
22 ▼ {
23
         normalizedFeatureVector->push_back(val);
24
25
     void Data::setLabel(uint8_t val)
26 ▼ {
27
         label = val;
28
29
     void Data::setEnumeratedLabel(uint8_t val)
30 ▼
31
         enumeratedLabel = val;
32
     }
33
     void Data::setClassVector(int classCounts)
34
35 ▼ {
36
         classVector = new std::vector<int>();
37
         for (int i = 0; i < classCounts; i++)</pre>
38 ▼
         {
39
              if (i == label)
40
                  classVector->push_back(1);
41
             else
42
                  classVector->push_back(0);
43
         }
     }
44
45
```

```
46
     void Data::printVector()
47 ▼ {
         printf("[ ");
48
         for (uint8 t val : *featureVector)
49
50 ▼
         {
             printf("%u ", val);
51
52
         }
53
         printf("]\n");
     }
54
55
     void Data::printNormalizedVector()
56
57 ▼ {
         printf("[ ");
58
         for (auto val : *normalizedFeatureVector)
59
60 -
         {
61
             printf("%.2f ", val);
62
         }
63
         printf("]\n");
64
     }
65
66
     double Data::getDistance()
67
68 ▼ {
69
         return distance;
     }
70
71
72
     int Data::getFeatureVectorSize()
73 ▼ {
74
         return featureVector->size();
75
     }
76
     uint8_t Data::getLabel()
77 ▼ {
78
         return label;
79
     uint8_t Data::getEnumeratedLabel()
80
81 ▼ {
         return enumeratedLabel;
82
83
     }
84
     std::vector<uint8_t>* Data::getFeatureVector()
85
86 ▼ {
87
         return featureVector;
88
     std::vector<double>* Data::getNormalizedFeatureVector()
89
90 ▼ {
         return normalizedFeatureVector;
91
92
     }
93
```

```
94 std::vector<int> Data::getClassVector()
95 ▼ {
96    return *classVector;
97 }
```

▼ DataHandler.h C++ □ 复制代码

```
1
     #ifndef __DATA_HANDLER_H
 2
     #define DATA HANDLER H
 3
 4 ▼ #include "fstream"
 5
     #include "stdint.h"
     #include "data.h"
 6
     #include <vector>
     #include <string>
 8
 9
     #include <map>
     #include <unordered_set>
10
     #include <math.h>
11
12
13
     class DataHandler
14 ▼ {
15
          std::vector<Data*>* dataArray; // all of the data
16
          std::vector<Data*>* trainingData;
17
          std::vector<Data*>* testData;
18
          std::vector<Data*>* validationData;
19
          int class counts;
20
          int featureVectorSize:
21
          std::map<uint8_t, int> classFromInt;
22
          std::map<std::string, int> classFromString; //string key
23
24
     public:
25
          const double TRAIN_SET_PERCENT = .1;
26
          const double TEST_SET_PERCENT = .075;
27
          const double VALID SET PERCENT = 0.005;
28
29
          DataHandler();
30
          ~DataHandler():
31
32
          void readCsv(std::string, std::string);
33
          void readInputData(std::string path);
34
          void readLabelData(std::string path);
35
          void splitData();
36
          void countClasses():
37
          void normalize();
38
          void print();
39
          int getClassCounts();
40
          int getDataArraySize();
41
42
          int getTrainingDataSize();
43
          int getTestDataSize();
          int getValidationSize();
44
45
```

```
uint32_t format(const unsigned char* bytes);
46
47
48
         std::vector<Data*>* getTrainingData();
         std::vector<Data*>* getTestData();
49
50
         std::vector<Data*>* getValidationData();
51
         std::map<uint8_t, int> getClassMap();
52
53
     };
54
     #endif
55
```

▼ DataHandler.cpp C++ 🗗 🗗 复制代码

```
1 ▼ #include "DataHandler.h"
     #include <algorithm>
 3
     #include <random>
4
     #pragma warning(disable:4996)
 5
     DataHandler::DataHandler()
6
 7 ▼ {
8
         dataArray = new std::vector<Data*>;
9
         trainingData = new std::vector<Data*>;
10
         testData = new std::vector<Data*>;
11
         validationData = new std::vector<Data*>;
12
     }
13
14
     DataHandler::~DataHandler()
15 ▼ {
16
         // FIX ME
17
     }
18
19
     void DataHandler::readCsv(std::string path, std::string delimiter)
20 ▼ {
21
         class_counts = 0;
22
         std::ifstream data_file;
23
         data_file.open(path.c_str());
24
         std::string line;
25
26
         while (std::getline(data_file, line))
27 ▼
28
             if (line.length() == 0) continue;
29
             Data* d = new Data();
             d->setNormalizedFeatureVector(new std::vector<double>());
30
31
             size t position = 0;
32
             std::string token;
33
             while ((position = line.find(delimiter)) != std::string::npos)
34 ▼
             {
35
                  token = line.substr(0, position);
36
                  d->appendToFeatureVector(std::stod(token));
37
                  line.erase(0, position + delimiter.length());
38
             }
39
40
             if (classFromString.find(line) != classFromString.end())
41 -
             {
42
                  d->setLabel(classFromString[line]);
43
             }
             else
44
45 ▼
             {
```

```
46
                  classFromString[line] = class_counts;
47
                  d->setLabel(classFromString[token]);
                  class counts++;
48
              }
49
              dataArray->push_back(d);
50
          }
51
         for (Data* data : *dataArray)
52
53
              data->setClassVector(class_counts);;
54
         //normalize();
          featureVectorSize = dataArray->at(0)->getNormalizedFeatureVector()-
55
     >size();
56
     }
57
     void DataHandler::readInputData(std::string path)
58
59 ▼ {
60
          uint32_t magic = 0;
61
          uint32_t num_images = 0;
62
          uint32_t num_rows = 0;
63
          uint32_t num_cols = 0;
64
          unsigned char bytes[4];
65
          FILE* f = fopen(path.c str(), "r");
66
67
          if (f)
68 -
         {
              int i = 0;
69
              while (i < 4)
70
71 -
72
                  if (fread(bytes, sizeof(bytes), 1, f))
73 ▼
                  {
74
                      switch (i)
75 ▼
                      {
76
                      case 0:
                          magic = format(bytes);
77
78
                          i++;
79
                          break;
80
                      case 1:
                          num images = format(bytes);
81
82
                          i++;
83
                          break;
                      case 2:
84
                          num_rows = format(bytes);
85
86
                          i++;
                          break;
87
88
                      case 3:
89
                          num_cols = format(bytes);
                          i++;
90
                          break;
91
                      }
92
```

```
93
                   }
               }
 94
               printf("Done getting file header.\n");
 95
               uint32 t image size = num rows ★ num cols;
 96
               for (i = 0; i < num_images; i++)</pre>
 97
 98 -
99
                   Data* d = new Data();
                   d->setFeatureVector(new std::vector<uint8_t>());
100
101
                   uint8_t element[1];
102
                   for (int j = 0; j < image_size; j++)</pre>
103 ▼
                   {
                       if (fread(element, sizeof(element), 1, f))
104
105 ▼
                       {
                           d->appendToFeatureVector(element[0]);
106
                       }
107
108
                   }
                   dataArray->push_back(d);
109
                   dataArray->back()->setClassVector(class_counts);
110
               }
111
               normalize();
112
               featureVectorSize = dataArray->at(0)->getFeatureVector()-
113
      >size():
114
               printf("Successfully read %lu data entries.\n", dataArray-
      >size());
               printf("The Feature Vector Size is: %d\n", featureVectorSize);
115
           }
116
117
           else
           {
118
               printf("Invalid Input File Path\n");
119
120
               exit(1);
           }
121
122
      }
123
      void DataHandler::readLabelData(std::string path)
124
125
           uint32 t magic = 0;
126
           uint32 t num images = 0;
127
           unsigned char bytes[4];
           FILE* f = fopen(path.c_str(), "r");
128
           if (f)
129
           {
130
131
               int i = 0;
               while (i < 2)
132
133
               {
                   if (fread(bytes, sizeof(bytes), 1, f))
134
135
                   {
136
                       switch (i)
137
138
                       case 0:
```

```
139
                           magic = format(bytes);
140
                           i++;
141
                           break;
142
                       case 1:
                           num_images = format(bytes);
143
144
145
                           break;
                       }
146
                   }
147
               }
148
149
               for (unsigned j = 0; j < num_images; j++)</pre>
150
151
                   uint8 t element[1];
152
                   if (fread(element, sizeof(element), 1, f))
153
                   {
154
155
                       dataArray->at(j)->setLabel(element[0]);
                   }
156
               }
157
158
               printf("Done getting Label header.\n");
159
           }
160
161
           else
162
           {
               printf("Invalid Label File Path\n");
163
164
               exit(1);
           }
165
      }
166
      void DataHandler::splitData()
167
168
           std::unordered_set<int> used_indexes;
169
           int train size = dataArray->size() * TRAIN SET PERCENT;
170
           int test size = dataArray->size() * TEST SET PERCENT;
171
172
           int valid_size = dataArray->size() * VALID_SET_PERCENT;
173
           std::random_shuffle(dataArray->begin(), dataArray->end());
174
175
176
           // Training Data
177
178
           int count = 0;
           int index = 0;
179
           while (count < train_size)</pre>
180
181
           {
               trainingData->push back(dataArray->at(index++));
182
183
               count++;
           }
184
185
186
          // Test Data
```

```
187
          count = 0;
          while (count < test_size)</pre>
188
189
               testData->push back(dataArray->at(index++));
190
191
               count++;
          }
192
193
194
          // Test Data
195
196
          count = 0;
197
          while (count < valid size)</pre>
198
          {
199
               validationData->push_back(dataArray->at(index++));
200
               count++;
          }
201
202
203
           printf("Training Data Size: %lu.\n", trainingData->size());
           printf("Test Data Size: %lu.\n", testData->size());
204
           printf("Validation Data Size: %lu.\n", validationData->size());
205
206
      }
207
      void DataHandler::countClasses()
208
209
          int count = 0;
210
          for (unsigned i = 0; i < dataArray->size(); i++)
211
212
          {
               if (classFromInt.find(dataArray->at(i)->getLabel()) ==
213
      classFromInt.end())
214
               {
215
                   classFromInt[dataArray->at(i)->getLabel()] = count;
                   dataArray->at(i)->setEnumeratedLabel(count);
216
217
                   count++;
218
               }
219
               else
               {
220
                   dataArray->at(i)->setEnumeratedLabel(classFromInt[dataArray-
221
      >at(i)->getLabel()]);
               }
222
223
          }
224
225
          class_counts = count;
          for (Data* data : *dataArray)
226
               data->setClassVector(class counts);
227
          printf("Successfully Extraced %d Unique Classes.\n", class counts);
228
229
      }
230
231
      void DataHandler::normalize()
232
      {
```

```
233
           std::vector<double> mins, maxs;
           // fill min and max lists
234
235
           Data* d = dataArray \rightarrow at(0);
236
           for (auto val : *d->getFeatureVector())
237
238
               mins.push back(val);
239
               maxs.push_back(val);
240
           }
241
242
243
           for (int i = 1; i < dataArray->size(); i++)
244
245
               d = dataArray->at(i);
               for (int j = 0; j < d->getFeatureVectorSize(); j++)
246
247
                   double value = (double)d->getFeatureVector()->at(j);
248
                   if (value < mins.at(j)) mins[j] = value;</pre>
249
                   if (value > maxs.at(j)) maxs[j] = value;
250
               }
251
252
           }
253
           // normalize data array
254
255
           for (int i = 0; i < dataArray->size(); i++)
256
           {
257
               dataArray->at(i)->setNormalizedFeatureVector(new
       std::vector<double>());
               dataArray->at(i)->setClassVector(class_counts);
258
259
               for (int j = 0; j < dataArray->at(i)->getFeatureVectorSize();
      j++)
               {
260
                   if (maxs[j] - mins[j] == 0) dataArray->at(i)-
261
      >appendToFeatureVector(0.0);
262
                   else
263
                       dataArray->at(i)->appendToFeatureVector(
                           (double)(dataArray->at(i)->getFeatureVector()->at(j)
264
      - mins[j]) / (maxs[j] - mins[j]));
265
               }
           }
266
267
      }
268
      int DataHandler::getClassCounts()
269
270
      {
           return class_counts;
271
272
      }
273
      int DataHandler::getDataArraySize()
274
275
276
           return dataArray->size();
```

```
277
      }
      int DataHandler::getTrainingDataSize()
278
279
          return trainingData->size();
280
281
      }
      int DataHandler::getTestDataSize()
282
283
      {
284
          return testData->size();
285
      int DataHandler::getValidationSize()
286
287
      {
288
          return validationData->size();
289
      }
290
      uint32 t DataHandler::format(const unsigned char* bytes)
291
292
293
          return (uint32_t)((bytes[0] << 24) |</pre>
294
               (bytes[1] << 16) |
               (bytes[2] << 8)
295
              (bytes[3]));
296
      }
297
298
299
      std::vector<Data*>* DataHandler::getTrainingData()
300
      {
          return trainingData;
301
302
      }
303
      std::vector<Data*>* DataHandler::getTestData()
304
      {
305
          return testData;
306
      }
      std::vector<Data*>* DataHandler::getValidationData()
307
308
      {
309
          return validationData;
310
      }
311
312
      std::map<uint8_t, int> DataHandler::getClassMap()
313
      {
314
          return classFromInt;
315
      }
316
317
      void DataHandler::print()
318
      {
          printf("Training Data:\n");
319
          for (auto data : *trainingData)
320
321
          {
322
              for (auto value : *data->getNormalizedFeatureVector())
323
              {
                   printf("%.3f,", value);
324
```

```
325
              }
326
              printf(" -> %d\n", data->getLabel());
327
328
          return;
329
          printf("Test Data:\n");
330
          for (auto data : *testData)
331
332
              for (auto value : *data->getNormalizedFeatureVector())
333
334
                  printf("%.3f,", value);
335
336
              printf(" -> %d\n", data->getLabel());
337
338
          }
339
          printf("Validation Data:\n");
340
          for (auto data : *validationData)
341
342
          {
              for (auto value : *data->getNormalizedFeatureVector())
343
344
                  printf("%.3f,", value);
345
346
347
              printf(" -> %d\n", data->getLabel());
          }
348
349
      }
350
351
```

## 2.结果输出

今天只看了一个C++ ML的视频,效率低下,赶紧找回状态!