K-Medoids Clustering

The C++ implmentation for K-Medoids clustering

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Chapter 1

k-medoids

It includes the iterative or median-based medoid refinement similar to what k-medoids defined. To confirm to the regulations of other clustering techniques and cluster representatives, we choose the **iterative medoid refinement**.

2 k-medoids

Chapter 2

Class Index

2.1 Class List

Here are the classes, structs, unions and interfaces with brief descriptions:

KMedoids .											 													1
Parameter .											 													13
TimeRecord	er .										 													14

4 Class Index

Chapter 3

File Index

3.1 File List

Here is a list of all files with brief descriptions:

KMedoids.cpp	17
KMedoids.h	18
main.cpp	18

6 File Index

Chapter 4

Class Documentation

4.1 KMedoids Class Reference

#include <KMedoids.h>

Public Member Functions

- KMedoids (const Parameter &pm, const Eigen::MatrixXf &data, const int &numOfClusters)
- ∼KMedoids (
- void getMedoids (FeatureLine &fline, const int &normOption, Silhouette &sil, TimeRecorder &tr) const

Public Attributes

int numOfClusters

Private Member Functions

- · void getInitCenter (MatrixXf &initialCenter, const MetricPreparation &object, const int &normOption) const
- void computeMedoids (MatrixXf ¢erTemp, const vector< vector< int > > &neighborVec, const int &normOption, const MetricPreparation &object) const

Private Attributes

- · int initialStates
- bool isSample
- Eigen::MatrixXf data

4.1.1 Detailed Description

Definition at line 47 of file KMedoids.h.

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4.1.2 Constructor & Destructor Documentation

4.1.2.1 KMedoids::KMedoids (const Parameter & pm, const Eigen::MatrixXf & data, const int & numOfClusters)

Definition at line 17 of file KMedoids.cpp.

4.1.2.2 KMedoids::∼KMedoids ()

Definition at line 30 of file KMedoids.cpp.

```
31 {
32
33 }
```

4.1.3 Member Function Documentation

4.1.3.1 void KMedoids::computeMedoids (MatrixXf & centerTemp, const vector < vector < int > > & neighborVec, const int & normOption, const MetricPreparation & object) const [private]

Definition at line 360 of file KMedoids.cpp.

```
364 {
365
        centerTemp = MatrixXf(numOfClusters,data.cols());
        366
367
368
        #pragma omp parallel for schedule(static) num_threads(8)
369
370
            for (int i=0;i<neighborVec.size();++i)</pre>
371
372
                const vector<int>& clusMember = neighborVec[i];
373
                const int& clusSize = clusMember.size();
MatrixXf mutualDist = MatrixXf::Zero(clusSize, clusSize);
374
375
                /*mutualDist to store mutual distance among lines of each cluster */
376
                for(int j=0;j<clusSize;++j)</pre>
377
                {
378
                    for(int k=j+1;k<clusSize;++k)</pre>
379
                        mutualDist(j,k) = getDisimilarity(data,clusMember[j],
380
381
                            clusMember[k], normOption, object);
                        mutualDist(k, j) = mutualDist(j,k);
382
383
384
                }
385
386
                float minL1_norm = FLT_MAX, rowSummation;
387
                int index = -1;
388
                for(int j=0;j<clusSize;++j)</pre>
389
390
                    rowSummation = mutualDist.row(j).sum();
391
                    if (rowSummation<minL1_norm)</pre>
392
393
                        minL1 norm = rowSummation;
394
                        index = j;
395
396
397
                centerTemp.row(i) = data.row(clusMember[index]);
398
399
        }
400
401
        else//use Weiszfeld's algorithm to get geometric median
```

```
402
            //reference at https://en.wikipedia.org/wiki/Geometric_median
403
404
            MatrixXf originCenter = centerTemp;
405
        #pragma omp parallel for schedule(static) num_threads(8)
406
            for(int i=0;i<numOfClusters;++i)</pre>
407
408
                const vector<int>& clusMember = neighborVec[i];
409
                const int& clusSize = clusMember.size();
410
                float distToCenter, distInverse, percentage = 1.0;
411
                int tag = 0;
                while (tag<=10&&percentage>=0.02)
412
413
                    VectorXf numerator = VectorXf::Zero(data.cols());
414
415
                    VectorXf previous = centerTemp.row(i);
416
                     float denominator = 0;
417
                     for(int j=0;j<clusSize;++j)</pre>
418
419
                         distToCenter = getDisimilarity(centerTemp.row(i),
                                data, clusMember[j], normOption, object);
420
                         distInverse = (distToCenter>1.0e-8)?1.0/distToCenter:1.0e8;
421
422
                         numerator += data.row(clusMember[j])*distInverse;
423
                         denominator += distInverse;
424
                    centerTemp.row(i) = numerator/denominator;
425
426
                    percentage = (centerTemp.row(i)-previous).norm()/previous.norm();
427
428
429
            }
430
        }
431 }
```

4.1.3.2 void KMedoids::getInitCenter (MatrixXf & initialCenter, const MetricPreparation & object, const int & normOption)
const [private]

Definition at line 329 of file KMedoids.cpp.

```
332 {
333
        switch(initialStates)
334
335
        case 1:
           Initialization::generateRandomPos(initialCenter, data.cols(), data,
336
     numOfClusters);
337
           break;
338
339
        default:
340
       case 2:
            Initialization::generateFromSamples(initialCenter, data.cols(), data,
341
      numOfClusters);
342
           break;
343
344
       case 3:
            Initialization::generateFarSamples(initialCenter, data.cols(), data,
345
      numOfClusters, normOption, object);
346
           break;
347
348
        std::cout << "Initialization completed!" << std::endl;</pre>
349 }
```

4.1.3.3 void KMedoids::getMedoids (FeatureLine & fline, const int & normOption, Silhouette & sil, TimeRecorder & tr) const

Definition at line 44 of file KMedoids.cpp.

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```
56
       int *storage = new int[numOfClusters]; // used to store number inside each cluster
       MatrixXf centerTemp;
58
       int tag = 0;
59
       std::vector< std::vector<int> > neighborVec(numOfClusters,
60
                                                       std::vector<int>());
61
62 /* perform K-means with different metrics */
       std::cout << "K-medoids start!" << std::endl;</pre>
64
       const int& Row = data.rows();
6.5
       const int& Column = data.cols();
       struct timeval start, end;
66
67
       gettimeofday (&start, NULL);
       std::vector<int> recorder(Row); //use to record which cluster the row belongs to
68
69
70
       71
72
73
74
           memset(storage, 0, sizeof(int) *numOfClusters);
75
           centerTemp = clusterCenter;
76
77
       /\star clear streamline indices for each cluster \star/
78
       #pragma omp parallel for schedule(static) num_threads(8)
    for (int i = 0; i < numOfClusters; ++i)</pre>
79
80
81
                neighborVec[i].clear();
82
83
84
       #pragma omp parallel num_threads(8)
85
            #pragma omp for nowait
86
                for (int i = 0; i < Row; ++i)
88
                    int clusTemp;
89
                    float dist = FLT_MAX;
float tempDist;
90
91
                    for (int j = 0; j < numOfClusters; ++j)</pre>
92
93
                        tempDist = getDisimilarity(clusterCenter.row(j),
95
                                      data,i,normOption,object);
96
                         if(tempDist<dist)</pre>
97
                             dist = tempDist;
98
99
                             clusTemp = j;
100
101
102
                     recorder[i] = clusTemp;
103
                 #pragma omp critical
104
105
106
                         storage[clusTemp]++;
107
                         neighborVec[clusTemp].push_back(i);
108
109
                 }
110
111
112
            computeMedoids(centerTemp, neighborVec, normOption, object);
113
114
            moving = FLT_MIN;
115
116
        /\star measure how much the current center moves from original center \star/
117
        #pragma omp parallel for reduction(max:moving) num_threads(8)
118
             for (int i = 0; i < numOfClusters; ++i)</pre>
119
120
                 if(storage[i]>0)
121
122
                     tempMoving = (centerTemp.row(i)-clusterCenter.row(i)).norm();
                     clusterCenter.row(i) = centerTemp.row(i);
123
124
                     if (moving<tempMoving)</pre>
125
                         moving = tempMoving;
126
                 }
127
             . std::cout << "K-means iteration " << ++tag << " completed, and moving is " << moving << "!" << std::endl;
128
129
        }while (abs (moving-before) /before >= 1.0e-2 && tag < 20/* && moving > 5.0*/);
130
131
132
        double delta;
133
        tr.eventList.push_back("For norm ");
134
        \verb|tr.timeList.push_back(to_string(normOption)+"\n");|\\
135
136
137
        std::multimap<int,int> groupMap;
138
        float entropy = 0.0;
139
        float probability;
140
        vector<int> increasingOrder(numOfClusters);
        for (int i = 0; i < numOfClusters; ++i)</pre>
141
142
```

```
143
            groupMap.insert(std::pair<int,int>(storage[i],i));
144
             if(storage[i]>0)
145
146
                 probability = float(storage[i])/float(Row);
147
                 entropy += probability*log2f(probability);
148
            }
149
        }
150
        int groupNo = 0;
151
152
        for (std::multimap<int,int>::iterator it = groupMap.begin(); it != groupMap.end(); ++it)
153
154
             if(it->first>0)
155
             {
156
                 increasingOrder[it->second] = (groupNo++);
157
158
159
        entropy = -entropy/log2f(groupNo);
160
161
        /* finish tagging for each group */
162
163
         /* record labeling information */
164
        // IOHandler::generateGroups(neighborVec);
165
166
167
        // set cluster group number and size number
168 #pragma omp parallel for schedule(static) num_threads(8)
169
        for (int i = 0; i < Row; ++i)</pre>
170
171
             fline.group[i] = increasingOrder[recorder[i]];
             fline.totalNum[i] = storage[recorder[i]];
172
173
174
175
        float shortest, toCenter, farDist;
176
        int shortestIndex = 0, tempIndex = 0, furthestIndex = 0;
177
        std::vector<int> neighborTemp;
178
        /\star choose cloest and furthest streamlines to centroid streamlines \star/
179
        for (int i = 0; i < numOfClusters; ++i)</pre>
180
181
182
             if(storage[i]>0)
183
184
                 neighborTemp = neighborVec[i];
185
                 shortest = FLT_MAX;
186
                 farDist = FLT_MIN;
187
188
189
                 for (int j = 0; j < storage[i]; ++j)</pre>
190
                     // j-th internal streamlines
191
                     tempIndex = neighborTemp[j];
192
193
                     toCenter = getDisimilarity(clusterCenter.row(i), data,
194
                                  tempIndex, normOption, object);
195
                     if(!isSample)
196
197
                         if (toCenter<shortest)
198
                         {
199
                              shortest = toCenter;
200
                              shortestIndex = tempIndex;
201
202
203
                     /* update the farthest index to centroid */
204
                     if(toCenter>farDist)
205
                     {
                          farDist = toCenter;
206
207
                         furthestIndex = tempIndex;
208
209
                 if(!isSample)
210
211
                     fline.closest.push_back(ExtractedLine(shortestIndex,increasingOrder[i]));
212
                 fline.furthest.push_back(ExtractedLine(furthestIndex,increasingOrder[i]));
213
214
215
216
        std::vector<float> closeSubset;
        /* based on known cluster centroid, save them as vector for output */
for (int i = 0; i < numOfClusters; ++i)
217
218
219
220
             if(storage[i]>0)
221
222
                 for (int j = 0; j < Column; ++j)
223
224
                     closeSubset.push_back(clusterCenter(i, j));
225
226
                 fline.centerMass.push_back(MeanLine(closeSubset,increasingOrder[i]));
227
                 closeSubset.clear();
228
             }
229
        }
```

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```
230
        delete[] storage;
231
        std::cout << "Has taken closest and furthest out!" << std::endl;</pre>
232
233
234 /* Silhouette computation started */
235
        std::cout << "The finalized cluster size is: " << groupNo << std::endl;</pre>
236
237
         if (groupNo<=1)</pre>
238
239
240
         /* if the dataset is not PBF, then should record distance matrix for Gamma matrix compution */
241
        if(!isPBF)
242
243
             deleteDistanceMatrix(data.rows());
244
245
             std::ifstream distFile(("../dataset/"+to_string(normOption)).c_str(), ios::in);
246
             if(distFile.fail())
247
             {
248
                 distFile.close();
                 getDistanceMatrix(data, normOption, object);
249
250
                  std::ofstream distFileOut(("../dataset/"+to_string(normOption)).c_str(), ios::out);
251
                  for(int i=0;i<data.rows();++i)</pre>
2.52
253
                      for(int j=0; j < data.rows(); ++j)</pre>
254
255
                          distFileOut << distanceMatrix[i][j] << " ";</pre>
256
257
                      distFileOut << std::endl;
258
259
                 distFileOut.close();
260
261
             else
262
263
                 std::cout << "read distance matrix..." << std::endl;</pre>
264
                 distanceMatrix = new float*[data.rows()];
265
             #pragma omp parallel for schedule(static) num_threads(8)
    for (int i = 0; i < data.rows(); ++i)</pre>
266
267
268
                 {
269
                      distanceMatrix[i] = new float[data.rows()];
270
                 int i=0, j;
string line;
271
272
273
                 stringstream ss;
274
                 while (getline (distFile, line))
275
276
                      i=0:
2.77
                      ss.str(line);
278
                      while (ss>>line)
279
280
                           if(i==j)
281
                              distanceMatrix[i][j]=0;
282
                          else
283
                               distanceMatrix[i][j] = std::atof(line.c_str());
284
                          ++j;
285
                      ++i;
286
                      ss.str("");
287
288
                      ss.clear();
289
290
                 distFile.close();
291
             }
292
293
294
         tr.eventList.push_back("Final cluster number is : ");
295
        tr.timeList.push_back(to_string(groupNo));
296
297
         ValidityMeasurement vm;
298
        vm.computeValue(normOption, data, fline.group, object, isPBF);
299
300
         tr.eventList.push_back("Kmedoids Validity measure is: ");
301
         stringstream fc_ss;
302
         fc_ss << vm.f_c;
303
        tr.timeList.push_back(fc_ss.str());
304
305
         //groupNo record group numbers */
306
        gettimeofday(&start, NULL);
307
308
        sil.computeValue(normOption, data, Row, Column, fline.group, object, groupNo,
      isPBF):
309
        std::cout << "Silhouette computation completed!" << std::endl;</pre>
310
311
         gettimeofday(&end, NULL);
312
         delta = ((end.tv_sec - start.tv_sec) * 1000000u + end.tv_usec - start.tv_usec) / 1.e6;
313
        tr.eventList.push_back("Evaluation analysis would take: ");
tr.timeList.push_back(to_string(delta)+"s");
314
315
```

```
316
317  /* write value of the silhouette class */
318     IOHandler::writeReadme(entropy, sil, "For norm "+to_string(normOption));
319 }
```

4.1.4 Member Data Documentation

4.1.4.1 Eigen::MatrixXf KMedoids::data [private]

Definition at line 107 of file KMedoids.h.

4.1.4.2 int KMedoids::initialStates [private]

Definition at line 95 of file KMedoids.h.

4.1.4.3 bool KMedoids::isSample [private]

Definition at line 102 of file KMedoids.h.

4.1.4.4 int KMedoids::numOfClusters

Definition at line 85 of file KMedoids.h.

The documentation for this class was generated from the following files:

- KMedoids.h
- KMedoids.cpp

4.2 Parameter Struct Reference

```
#include <KMedoids.h>
```

Public Member Functions

- Parameter (const int &initialization, const bool &isSample)
- Parameter ()
- ∼Parameter ()

Public Attributes

- · int initialization
- bool isSample

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4.2.1 Detailed Description

Definition at line 20 of file KMedoids.h.

4.2.2 Constructor & Destructor Documentation

```
4.2.2.1 Parameter::Parameter (const int & initialization, const bool & isSample) [inline]
```

Definition at line 24 of file KMedoids.h.

```
25 : initialization(initialization), isSample(
    isSample)
26 {}
```

```
4.2.2.2 Parameter::Parameter() [inline]
```

Definition at line 27 of file KMedoids.h.

```
28 {}
```

```
4.2.2.3 Parameter::∼Parameter() [inline]
```

Definition at line 29 of file KMedoids.h.

```
30 {}
```

4.2.3 Member Data Documentation

4.2.3.1 int Parameter::initialization

Definition at line 22 of file KMedoids.h.

4.2.3.2 bool Parameter::isSample

Definition at line 23 of file KMedoids.h.

The documentation for this struct was generated from the following file:

• KMedoids.h

4.3 TimeRecorder Struct Reference

```
#include <KMedoids.h>
```

Public Attributes

- std::vector < string > eventList
- std::vector< string > timeList

4.3.1 Detailed Description

Definition at line 37 of file KMedoids.h.

4.3.2 Member Data Documentation

4.3.2.1 std::vector<string> TimeRecorder::eventList

Definition at line 39 of file KMedoids.h.

4.3.2.2 std::vector<string> TimeRecorder::timeList

Definition at line 40 of file KMedoids.h.

The documentation for this struct was generated from the following file:

• KMedoids.h

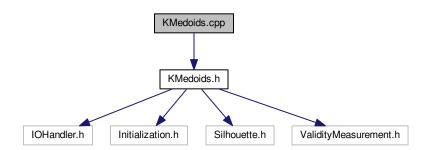
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Chapter 5

File Documentation

5.1 KMedoids.cpp File Reference

#include "KMedoids.h"
Include dependency graph for KMedoids.cpp:



Variables

• bool isPBF

5.1.1 Variable Documentation

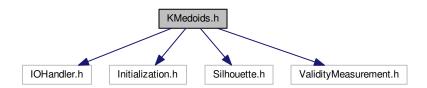
5.1.1.1 bool isPBF

Definition at line 16 of file main.cpp.

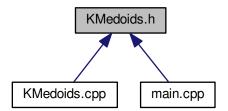
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5.2 KMedoids.h File Reference

```
#include "IOHandler.h"
#include "Initialization.h"
#include "Silhouette.h"
#include "ValidityMeasurement.h"
Include dependency graph for KMedoids.h:
```



This graph shows which files directly or indirectly include this file:



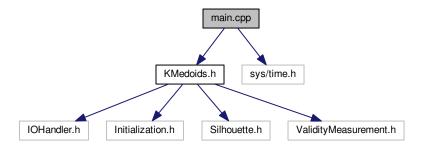
Classes

- struct Parameter
- struct TimeRecorder
- class KMedoids

5.3 main.cpp File Reference

```
#include "KMedoids.h"
#include <sys/time.h>
```

Include dependency graph for main.cpp:



Functions

- void featureExtraction (const int &argc, char **argv)
- void performKMedoids (const string &fileName, const std::vector< std::vector< float >> &dataVec, const int &dimension, const string &fullName, const KMedoids &kmedoid, const int &normOption, Silhouette &sil, TimeRecorder &tr)
- · void recordInitilization (const Parameter &pm, const int &sampleOption)
- int main (int argc, char *argv[])

Variables

- · bool isPBF
- bool readCluster

5.3.1 Function Documentation

5.3.1.1 void featureExtraction (const int & argc, char ** argv)

Definition at line 78 of file main.cpp.

```
80 {
      while (number!=3)
81
          83
84
                    << "data_dimension(3)" << endl;
8.5
          exit(1);
86
87
88
      const string& strName = string("../dataset/")+string(argv[1]);
      const int& dimension = atoi(argv[2]);
90
      /\star check whether it is a PBF data set \star/
91
      std::cout << "It is a PBF dataset? 1. Yes, 0. No." << std::endl;</pre>
92
      int isPBFInput;
93
      std::cin >> isPBFInput;
      assert(isPBFInput==1||isPBFInput==0);
      isPBF = (isPBFInput==1);
97
      /\star check whether it is a Pathline data set or not \star/
98
99
      bool isPathlines:
100
       std::cout << "It is a Pathline? 1.Yes, 0. No" << std::endl;
       std::cin >> isPBFInput;
```

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```
102
       assert(isPBFInput==1||isPBFInput==0);
103
       isPathlines = (isPBFInput==1);
104
105
       int vertexCount;
106
107 /*-
                      108
       Parameter pm;
109
110
       std::cout << "Please choose initialization option for seeds:" << std::endl</pre>
                << "1.chose random positions, 2.Chose from samples, 3.k-means++ sampling" << endl;
111
       std::cin >> pm.initialization;
112
       assert(pm.initialization==1||pm.initialization==2||pm.
113
     initialization==3);
114
115
       int sampleOption;
       116
117
118
       std::cin >> sampleOption;
119
       assert(sampleOption==1||sampleOption==2);
120
       if (sampleOption==1)
121
          pm.isSample = true;
122
       else if(sampleOption==2)
123
         pm.isSample = false;
124
125
       if (isPathlines)
126
          sampleOption = 1;
127
       else
128
           std::cout << "choose a sampling method for the dataset?" << std::endl</pre>
129
                    << "1.directly filling with last vertex; 2. uniform sampling." << std::endl;</pre>
130
131
           std::cin >> sampleOption;
132
133
       assert(sampleOption==1||sampleOption==2);
134
135
       std::cout << "Please choose cluster number method, 0.user input, 1.read clustering: " << std::endl;
136
       int clusterInput;
137
       std::cin >> clusterInput;
138
       assert(clusterInput==0 || clusterInput==1);
139
       readCluster = (clusterInput==1);
140
141 /*---
                     -----*/
142
       TimeRecorder tr:
143
144
145
       std::unordered_map<int,int> clusterMap;
146
       if(readCluster)
147
148
           IOHandler::readClusteringNumber(clusterMap, "cluster_number");
149
150
151
       /* a Silhouette method to estimate the clustering effect */
152
       Silhouette silhou;
153
154
       struct timeval start, end;
155
       double timeTemp;
156
       int maxElements;
157
158
       gettimeofday(&start, NULL);
159
       std::vector< std::vector<float> > dataVec;
160
       IOHandler::readFile(strName, dataVec, vertexCount, dimension, maxElements);
161
       //IOHandler::readFile(pbfPath, dataVec, vertexCount, dimension, 128000, 1500);
162
       gettimeofday(&end, NULL);
       163
164
165
       tr.eventList.push_back("I-O file reader takes: ");
166
       tr.timeList.push_back(to_string(timeTemp)+"s");
167
168
       stringstream ss;
       ss << strName << "_differentNorm_full.vtk";
169
170
       const string& fullName = ss.str();
171
       IOHandler::printVTK(ss.str(), dataVec, vertexCount, dimension);
172
       ss.str("");
173
174
       Eigen::MatrixXf data;
175
       std::vector<float> averageS;
176
177
       if (sampleOption==1)
178
          IOHandler::expandArray(data, dataVec, dimension, maxElements);
179
       else if(sampleOption==2)
180
           IOHandler::sampleArray(data, dataVec, dimension, maxElements);
181
182
       /★ 0: Euclidean Norm
           1: Fraction Distance Metric
183
184
           2: piece-wise angle average
185
           3: Bhattacharyya metric for rotation
186
           4: average rotation
           5: signed-angle intersection
187
```

```
6: normal-direction multivariate distribution
            7: Bhattacharyya metric with angle to a fixed direction
189
190
            8: Piece-wise angle average \times standard deviation
191
            9: normal-direction multivariate un-normalized distribution
192
            10: x*y/|x||y| borrowed from machine learning
193
            11: cosine similarity
            12: Mean-of-closest point distance (MCP)
194
195
            13: Hausdorff distance min_max(x_i,y_i)
196
            14: Signature-based measure from http://ieeexplore.ieee.org/stamp/stamp.jsp?tp=&arnumber=6231627
197
            15: Procrustes distance take from http://ieeexplore.ieee.org/stamp/stamp.jsp?tp=&arnumber=6787131
            16: entropy-based distance metric taken from http://vis.cs.ucdavis.edu/papers/pg2011paper.pdf
198
             17: time-series MCP distance from https://www.sciencedirect.com/science/article/pii/
199
      S0097849318300128
                for pathlines only
200
201
202
203
        KMedoids kmedoid(pm, data, -1);
204
205
        recordInitilization(pm, sampleOption);
206
207
        for (int i = 0; i <= 17; i++)
208
209
            if (isPathlines)
210
211
                if (i!=0 && i!=1 && i!=2 && i!=4 && i!=12 && i!=13 && i!=14 && i!=15 && i!=17)
212
                    continue;
213
214
            else
215
216
                if (i!=0 && i!=1 && i!=2 && i!=4 && i!=12 && i!=13 && i!=14 && i!=15)
217
                    continue:
218
            }
219
220
            if(readCluster)
221
                kmedoid.numOfClusters = clusterMap[i];
222
            else
223
            {
224
                std::cout << "Please input a cluster number (>=2) for norm " << i << " in [2, " ^{\prime\prime}
225
                         << dataVec.size() << "]: " << std::endl;
226
                std::cin >> kmedoid.numOfClusters;
227
            }
228
            gettimeofday(&start, NULL);
ss << strName << "_KMedoids";</pre>
229
230
            performKMedoids(ss.str(), dataVec, dimension, fullName, kmedoid, i, silhou, tr);
231
232
233
            gettimeofday(&end, NULL);
                                      - start.tv_sec) * 1000000u + end.tv_usec - start.tv_usec) / 1.e6;
234
            timeTemp = ((end.tv_sec
            tr.eventList.push_back("Direct K_Means operation time for norm "+to_string(i)+" takes: ");
235
            tr.timeList.push_back(to_string(timeTemp)+"s");
236
237
            if(silhou.sData.empty())
238
                silhou.sAverage = 0;
239
240
            IOHandler::writeReadme(tr.eventList, tr.timeList, kmedoid.numOfClusters);
            tr.eventList.clear();
241
242
            tr.timeList.clear();
            silhou.reset();
244
245 }
```

5.3.1.2 int main (int argc, char * argv[])

Definition at line 65 of file main.cpp.

```
66 {
67     featureExtraction(argc, argv);
68     return 0;
69 }
```

5.3.1.3 void performKMedoids (const string & fileName, const std::vector< std::vector< float >> & dataVec, const int & dimension, const string & fullName, const KMedoids & kmedoid, const int & normOption, Silhouette & sil, TimeRecorder & tr)

Definition at line 260 of file main.cpp.

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```
268 {
269
       FeatureLine fl(dataVec);
270
       kmedoid.getMedoids(fl, normOption, sil, tr);
271
2.72
       std::vector<std::vector<float> > closestStreamline, furthestStreamline;
273
       std::vector<int> closestCluster, furthestCluster, meanCluster;
274
       int closestPoint, furthestPoint;
275
       IOHandler::assignVec(closestStreamline, closestCluster, fl.closest,
276
                           closestPoint, dataVec);
2.77
       IOHandler::assignVec(furthestStreamline, furthestCluster, fl.furthest,
278
                           furthestPoint, dataVec);
279
280
281 /* get the average rotation of the extraction */
282
       std::vector<float> closestRotation, furthestRotation;
283
       const float& closestAverage = getRotation(closestStreamline, closestRotation);
       const float& furthestAverage = getRotation(furthestStreamline, furthestRotation);
284
285
286
       tr.eventList.push_back("Average rotation of closest for K-medoids clustering on norm "
287
                              + to_string(normOption) + " is: ");
288
       tr.timeList.push_back(to_string(closestAverage));
289
       290
291
       tr.timeList.push_back(to_string(furthestAverage));
292
293 /*
      finish the rotation computation \star/
294
295
       IOHandler::assignVec(meanCluster, fl.centerMass);
296
       IOHandler::printVTK(fileName+string("_norm")+to_string(normOption)+string("_mean.vtk"),
297
                           fl.centerMass,
298
                          fl.centerMass.size()*fl.centerMass[0].minCenter.size()/dimension.
       dimension, sil.sCluster);
IOHandler::printVTK(fileName+"_norm"+to_string(normOption)+"_closest.vtk",
299
300
301
                          closestStreamline, closestPoint/dimension, dimension,
       closestCluster, sil.sCluster);
IOHandler::printVTK(fileName+"_norm"+to_string(normOption)+"_furthest.vtk",
302
303
                          furthestStreamline, furthestPoint/dimension, dimension, furthestCluster, sil.sCluster);
304
305
306
       std::cout << "Finish printing vtk for k-means clustering result!" << std::endl;</pre>
307
       308
309
       //IOHandler::writeReadme(fl.closest, fl.furthest, normOption);
310
311
312
       IOHandler::printToFull(dataVec, sil.sData, "norm"+to_string(normOption)+"_SValueLine",
313
                             fullName, 3);
       314
315
316 }
```

5.3.1.4 void recordinitilization (const Parameter & pm, const int & sampleOption)

Definition at line 325 of file main.cpp.

```
327 {
        std::ofstream readme("../dataset/README", ios::out | ios::app);
328
329
         if(readme.fail())
330
             std::cout << "cannot create README file!" << std::endl;
331
332
             exit(1):
333
334
335
        readme << std::endl;</pre>
336
        readme << "Initial centroid is: ";</pre>
        if (pm.initialization==1)
337
             readme << pm.initialization << ".random initialization"
338
339
                    << std::endl;
340
        else if(pm.initialization==2)
341
           readme << pm.initialization << ".sample initialization"</pre>
342
                    << std::endl;
        else if(pm.initialization==3)
    readme << pm.initialization << ".kmedoids++ initialization"</pre>
343
344
                     << std::endl;
345
346
347
        readme << "Medoid is: ";</pre>
348
         if(pm.isSample)
             readme << pm.isSample << ".inside samples" << std::endl;</pre>
349
350
        else
351
             readme << pm.isSample << ".from iterations" << std::endl;</pre>
352
```

```
353     readme << "Sampling is: ";
354     if(sampleOption==1)
355         readme << sampleOption << ".directly filling" << std::endl;
356     else if(sampleOption==2)
357         readme << sampleOption << ".uniformly sampling" << std::endl;
358
359     readme.close();
360
361 }</pre>
```

5.3.2 Variable Documentation

5.3.2.1 bool isPBF

Definition at line 16 of file main.cpp.

5.3.2.2 bool readCluster

Definition at line 21 of file main.cpp.

5.4 README.md File Reference

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