

NATIONAL TAIPEI UNIVERSITY OF
TECHNOLOGY

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245765 - ADVANCED DIGITAL IMAGE PROCESSING

HW#3 Grey Level Transformation & Histogram Equalization

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Problem 1 Grey Level Transformation (C/C++) (40%)

- a. Enhance the image cat_bright.raw and cat_dark.raw by Power-Law and Piecewise-Linear transformation that learned in class. Show the best parameters, the gray-level transform curve and output images. (Figure, 20%; Discussion, 10%)

Ans

Piecewise-Linear transformation

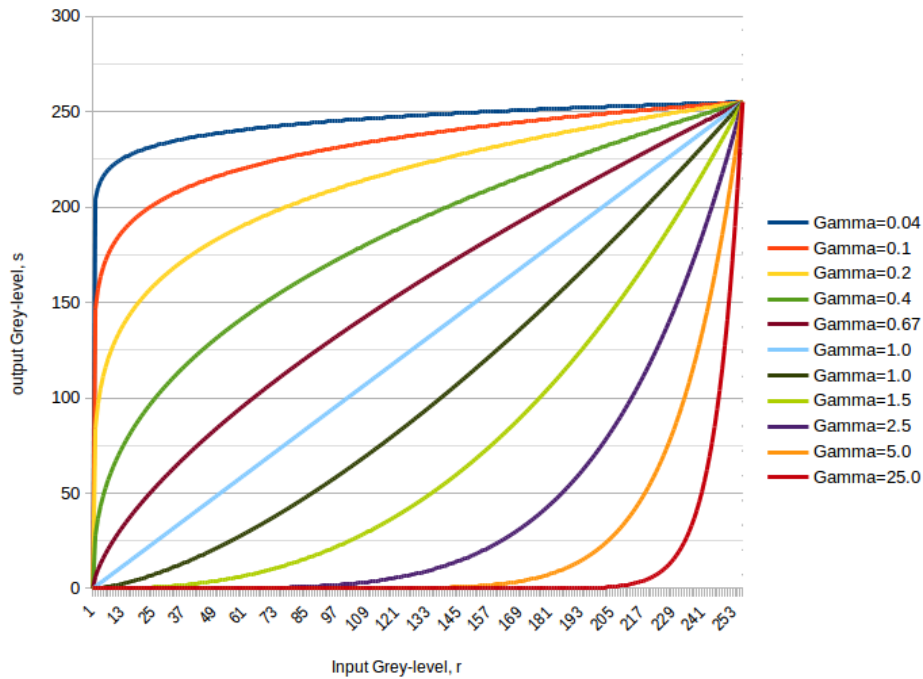
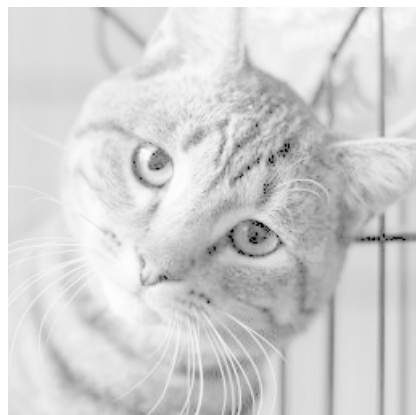
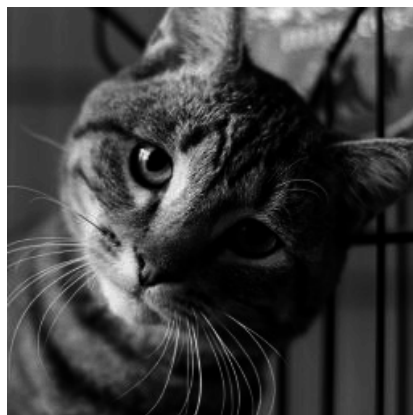


Figure 1: Power-Law Transformation in different Gamma.

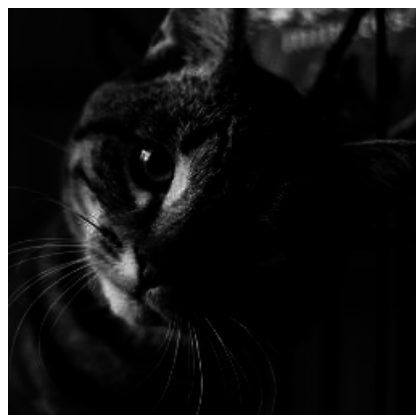


(a) Cat bright image source.



(b) Power-Law Transformation.

Figure 2: Power-Law Transformation bright image with best **Gamma 10.0**.



(a) Cat dark image source.



(b) Power-Law Transformation.

Figure 3: Power-Law Transformation bright image with best **Gamma 0.20**.

Piecewise-Linear transformation

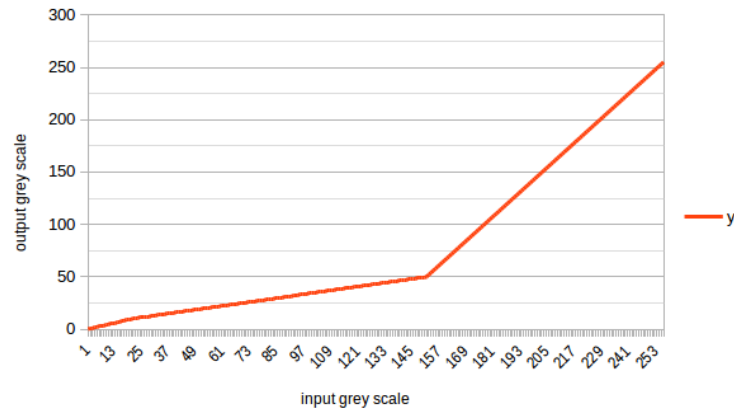


Figure 4: Power-Law Transformation in different Gamma.



(a) Cat bright image source.

(b) Transformed image.

Figure 5: Piecewise-Linear transformation bright image with **Figure 4 curve**.

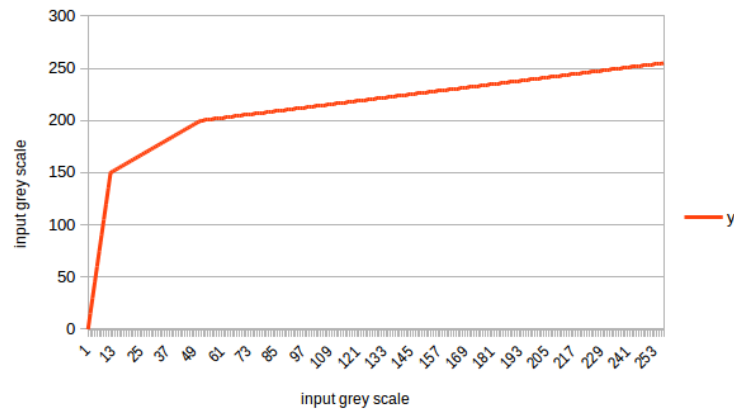
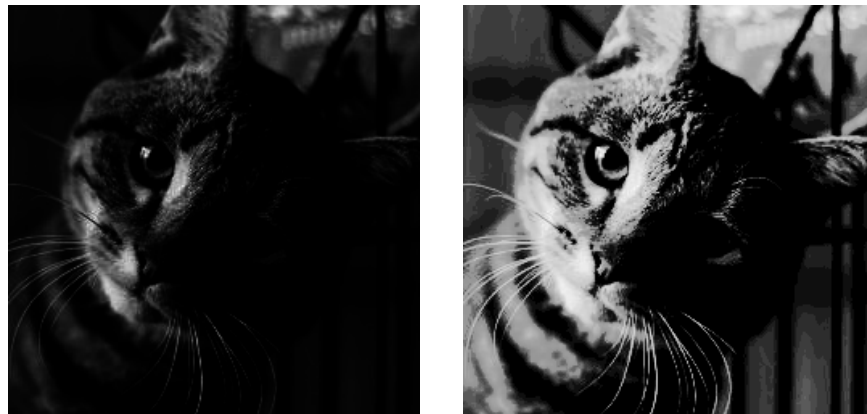


Figure 6: Power-Law Transformation in different Gamma.



(a) Cat dark image source.

(b) Transformed image.

Figure 7: Piecewise-Linear transformation dark image with **Figure 6** curve.

- b. Compare and discuss the results obtained by the two methods and explain the difference. (Discussion, 10%)

Ans

Source code for Problem 1

grey_level_transformation.hpp

```
1 #include <iostream>
2 #include <fstream>
3 #include <opencv2/opencv.hpp>
```

```

4 #include <opencv2/highgui/highgui.hpp>
5
6 const std::string SAVE_IMG_FOLDER = "../result_img/";
7 const double GAMMAS[] = {0.04, 0.1, 0.2, 0.4, 0.67, 1.0, 1.5, 2.5, 5.0, 10.0,
8     25.0};
9
10 void loadRawFile(cv::Mat &dst_img, std::string file_path, int width, int
11     height);
12 void showImage(std::string win_name, cv::Mat &show_img);
13 void saveImage(cv::Mat &img, std::string folder, std::string file_name);
14 double powerLaw(double L, double c, double r, double gamma);
15 void PowerLawTransformation(cv::Mat &src, cv::Mat &dst, double gamma);
16 void showAllImages(std::vector<cv::Mat> &list, std::string prefix);
17 void saveAllImages(std::vector<cv::Mat> &list, std::string floder, std::
18     string prefix);
19 void plotCurves(cv::Mat &plot, std::vector<std::vector<cv::Point2f> >
20     curvesPoints);
21 double linearFunc(uint8_t value, cv::Point2f r1s1, cv::Point2f r2s2, double L
22     );
23 void piecewiseLinearTF(cv::Mat &src_img,
24     cv::Mat &dst_img,
25     cv::Point2f r1s1,
26     cv::Point2f r2s2);
27 void writeCSV( std::string folder,
28     std::string file_name,
29     std::vector<std::vector<cv::Point2f> > curvesPoints);
30 void writeCSV( std::string folder,
31     std::string file_name,
32     std::vector<cv::Point2f> curvesPoints);

```

grey_level_transformation.cpp

```

1 #include "grey_level_transformation.hpp"
2
3 void loadRawFile(cv::Mat &dst_img, std::string file_path, int width, int
4     height)
5 {
6     std::FILE* f = std::fopen(file_path.c_str(), "rb");
7     // std::vector<char> buf(width*height); // char is trivially copyable
8     unsigned char buf[width][height];
9     std::fread(&buf[0], sizeof buf[0], width*height, f);
10    for (int i = 0; i < dst_img.rows; i++)
11    {
12        for (int j = 0; j < dst_img.cols; j++)
13        {
14            dst_img.at<char>(i, j) = buf[i][j];
15        }
16    }
17    std::fclose(f);
18 }

```

```

18
19 void showImage(std::string win_name, cv::Mat &show_img)
20 {
21     static int win_move_x = 50;
22     static int win_move_y = 50;
23     cv::namedWindow(win_name, 0);
24     cv::resizeWindow(win_name, show_img.cols, show_img.rows);
25     cv::moveWindow(win_name, win_move_x, win_move_y);
26     cv::imshow(win_name, show_img); //display Image
27     win_move_x += show_img.cols;
28     if (win_move_x > 1920-256)
29     {
30         win_move_x = 50;
31         win_move_y += (show_img.rows+35);
32     }
33 }
34
35 void saveImage(cv::Mat &img, std::string folder, std::string file_name)
36 {
37     std::string save_file = folder + file_name + ".png";
38     cv::imwrite(save_file, img);
39 }
40
41 double powerLaw(double L, double c, double r, double gamma)
42 {
43     return L * c * pow(r / L, gamma);
44 }
45
46 void PowerLawTransformation(cv::Mat &src, cv::Mat &dst, double gamma)
47 {
48     double c = 1.0;
49     double L = 255;
50     for (int i = 0; i < src.rows; i++)
51     {
52         for (int j = 0; j < src.cols; j++)
53         {
54             double src_value = src.at<unsigned char>(i, j);
55             double dst_value = powerLaw(L, c, src_value, gamma);
56             dst.at<char>(i, j) = (char) dst_value;
57         }
58     }
59 }
60
61 void showAllImages(std::vector<cv::Mat> &list, std::string prefix)
62 {
63     for (int i = 0; i < list.size(); i++)
64     {
65         std::string gamma = std::to_string(GAMMAS[i]);
66         gamma.erase ( gamma.find_last_not_of('0') + 2, std::string::npos );

```

```

67     showImage(prefix + " " + gamma + "gamma", list[i]);
68 }
69 }
70
71 void saveAllImages(std::vector<cv::Mat> &list, std::string floder, std::
    string prefix)
72 {
73     for (int i = 0; i < list.size(); i++)
74     {
75         std::string gamma = std::to_string(GAMMAS[i]);
76         gamma.erase ( gamma.find_last_not_of('0') + 2, std::string::npos );
77         std::string save_file = floder + prefix + gamma + ".png";
78         cv::imwrite(save_file, list[i]);
79     }
80 }
81
82 void plotCurves(cv::Mat &plot, std::vector<std::vector<cv::Point2f> >
    curvesPoints)
83 {
84     for (int i = 0; i < curvesPoints.size(); i++)
85     {
86         cv::Mat curve(curvesPoints[i], true);
87         curve.convertTo(curve, CV_32S); //adapt type for polylines
88         polylines(plot, curve, false, cv::Scalar(255), 2, CV_AA);
89     }
90 }
91
92 double linearFunc(uint8_t value, cv::Point2f r1s1, cv::Point2f r2s2, double L
    = 255)
93 {
94     if (value >= 0 && value < r1s1.x)
95     {
96         double m = r1s1.y / r1s1.x;
97         return m*value;
98     }
99     else if(value >= r1s1.x && value < r2s2.x)
100     {
101         double m = (r1s1.y - r2s2.y) / (r1s1.x - r2s2.x);
102         double c = r1s1.y - m * r1s1.x;
103         return m * value + c;
104     }
105     else if(value >= r2s2.x)
106     {
107         double m = (L - r2s2.y) / (L - r2s2.x);
108         double c = r2s2.y - m * r2s2.x;
109         return m * value + c;
110     }
111     else
112     {

```



```

113     return -1;
114 }
115 }
116
117 void piecewiseLinearTF(cv::Mat &src_img,
118                      cv::Mat &dst_img,
119                      cv::Point2f r1s1,
120                      cv::Point2f r2s2)
121 {
122     for (int i = 0; i < src_img.rows; i++)
123     {
124         for (int j = 0; j < src_img.cols; j++)
125         {
126             dst_img.at<char>(i, j) = linearFunc(src_img.at<char>(i, j), r1s1, r2s2)
127         }
128     }
129 }
130
131 void writeCSV( std::string folder,
132               std::string file_name,
133               std::vector<std::vector<cv::Point2f>> curvesPoints)
134 {
135     std::ofstream myfile(folder+file_name+".csv");
136     myfile << "x";
137     for (int i = 0; i < curvesPoints.size(); i++)
138     {
139         myfile << ",y" + std::to_string(i);
140     }
141     myfile << std::endl;
142     for (int i = 0; i < curvesPoints[0].size(); i++)
143     {
144         myfile << curvesPoints[0][i].x << ",";
145         for (int j = 0; j < curvesPoints.size(); j++)
146         {
147             myfile << curvesPoints[j][i].y;
148             if (curvesPoints.size()-1 != j)
149             {
150                 myfile << ",";
151             }
152         }
153         myfile << std::endl;
154     }
155     myfile.close();
156 }
157 void writeCSV( std::string folder,
158               std::string file_name,
159               std::vector<cv::Point2f> curvesPoints)
160 {

```

```

161 std::ofstream myfile(folder+file_name+".csv");
162 myfile << "x,y" << std::endl;
163 for (int i = 0; i < curvesPoints.size(); i++)
164 {
165     myfile << curvesPoints[i].x << "," << curvesPoints[i].y << std::endl;
166 }
167 myfile.close();
168 }
169
170 int main(int argc, char **argv)
171 {
172     cv::Mat cat_b_src(256, 256, CV_8UC1);
173     cv::Mat cat_d_src(256, 256, CV_8UC1);
174     loadRawFile(cat_b_src, "../images/cat_bright.raw", 256, 256);
175     loadRawFile(cat_d_src, "../images/cat_dark.raw", 256, 256);
176
177     // Power-Law Transformation
178     std::vector<cv::Mat> cat_b_img_lst;
179     std::vector<cv::Mat> cat_d_img_lst;
180     std::vector<std::vector<cv::Point2f>> > curvesPoints;
181     for (int i = 0; i < sizeof(GAMMAS)/sizeof(double); i++)
182     {
183         cv::Mat cat_b_transtormed(256, 256, CV_8UC1);
184         cv::Mat cat_d_transtormed(256, 256, CV_8UC1);
185         PowerLawTransformation(cat_b_src, cat_b_transtormed, GAMMAS[i]);
186         PowerLawTransformation(cat_d_src, cat_d_transtormed, GAMMAS[i]);
187         cat_b_img_lst.push_back(cat_b_transtormed);
188         cat_d_img_lst.push_back(cat_d_transtormed);
189         // insert data to curve
190         std::vector<cv::Point2f> curvePoints;
191         for (int j = 0; j < 256; j++)
192         {
193             cv::Point2f point(j, powerLaw(255, 1.0, j, GAMMAS[i]));
194             curvePoints.push_back(point);
195         }
196         curvesPoints.push_back(curvePoints);
197     }
198     cv::Mat plot_img(256, 256, CV_8UC1, cv::Scalar(0));
199     plotCurves(plot_img, curvesPoints);
200
201     // Piecewise-Linear Transformation
202     cv::Mat cat_b_plt(256, 256, CV_8UC1);
203     cv::Mat cat_d_plt(256, 256, CV_8UC1);
204     piecewiseLinearTF(cat_b_src, cat_b_plt, cv::Point2f(20,10), cv::Point2f
        (150,50));
205     piecewiseLinearTF(cat_d_src, cat_d_plt, cv::Point2f(10,150), cv::Point2f
        (50,200));
206     std::vector<cv::Point2f> piecewise_curve_bright;
207     std::vector<cv::Point2f> piecewise_curve_dark;

```

```

208     for (int i = 0; i < 256; i++)
209     {
210         piecewise_curve_bright.push_back(cv::Point2f(i, linearFunc(i, cv::Point2f(
211             20, 10), cv::Point2f(150,50))));
212         piecewise_curve_dark.push_back(cv::Point2f(i, linearFunc(i, cv::Point2f(
213             10, 150), cv::Point2f(50,200))));
214     }
215
216     // showImage("Power Law", plot_img);
217     // showAllImages(cat_b_img_lst, "cat b");
218     // showAllImages(cat_d_img_lst, "cat d");
219     // showImage("src cat bright", cat_b_src);
220     // showImage("PLT cat bright", cat_b_plt);
221     // showImage("src cat dark", cat_d_src);
222     // showImage("PLT cat dark", cat_d_plt);
223     writeCSV("../result_plot_data/", "Power-Law", curvesPoints);
224     writeCSV("../result_plot_data/", "piecewise_curve_bright",
225         piecewise_curve_bright);
226     writeCSV("../result_plot_data/", "piecewise_curve_dark",
227         piecewise_curve_dark);
228     saveAllImages(cat_b_img_lst, "../result_img/problem1/power_law/", "
229         cat_bright");
230     saveAllImages(cat_d_img_lst, "../result_img/problem1/power_law/", "cat_dark
231         ");
232     saveImage(cat_b_src, "../result_img/problem1/", "cat_bright_src");
233     saveImage(cat_b_plt, "../result_img/problem1/", "cat_bright_plt");
234     saveImage(cat_d_src, "../result_img/problem1/", "cat_dark_src");
235     saveImage(cat_d_plt, "../result_img/problem1/", "cat_dark_plt");
236     cv::waitKey(0);
237     return 0;
238 }

```

Problem 2 Histogram Equalization (C/C++) (60%)

- a. Plot the histogram of livingroom_bright.raw and livingroom_dark.raw. Discuss the difference among these histograms. (Figure, 10%; Discussion, 10%)

Ans

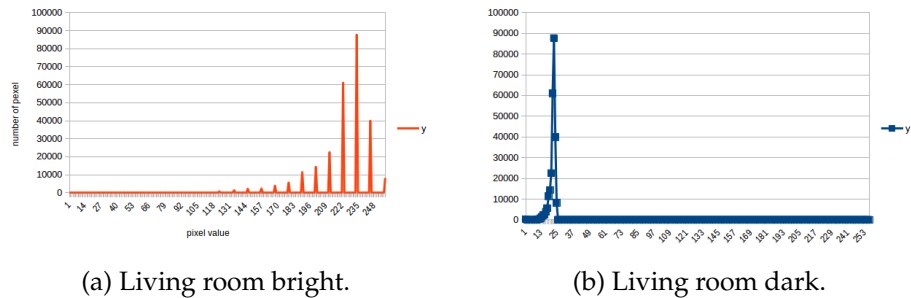


Figure 8: Histogram of living room image

- b. Perform histogram equalization on livingroom_bright.raw and livingroom_dark.raw. Plot their histograms after equalization and compare the results, will the result be the same and why? (Figure, 10%; Discussion, 10%)

Ans

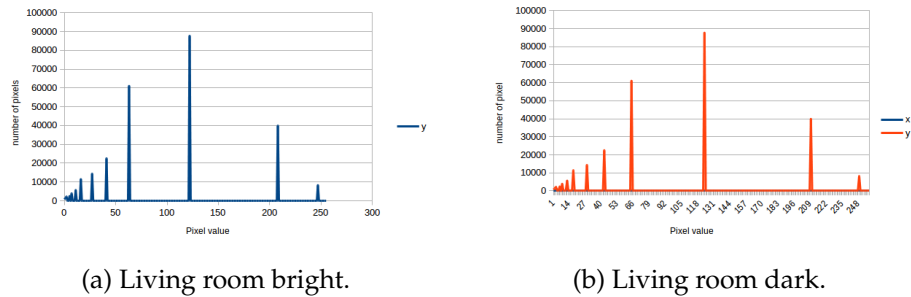


Figure 9: Histogram of living room image

- c. If you perform histogram equalization on `cat_bright.raw` and `cat_dark.raw`, will the result look good? Show the output images and explain what causes this situation and how to improve it. (Figure, 10%, Discussion, 10%)

Ans



(a) Cat dark image source.



(b) Transformed image.

Figure 10: Piecewise-Linear



(a) Cat dark image source.



(b) Transformed image.

Figure 11: Piecewise-Linear

Source code for Problem 1

histogram_equalization.hpp

```
1 #include <iostream>
2 #include <fstream>
```

```

3 #include <opencv2/opencv.hpp>
4 #include <opencv2/highgui/highgui.hpp>
5
6 class HistogramEq
7 {
8     public:
9         std::vector<int> histogram;
10        std::vector<int> cdf;
11        std::vector<int> v_map;
12        int cdf_min;
13        int L;
14        int pixel_num;
15        HistogramEq(cv::Mat &src_img, int L);
16        std::vector<int> getHistogram(cv::Mat &src_img, int L);
17        std::vector<int> getCDF();
18        int getHv(int v);
19        std::vector<int> getEqHistogram();
20        void ComputeVmap(std::vector<int> &v_map);
21        cv::Mat getEqImage(cv::Mat &img_src);
22 };

```

histogram_equalization.cpp

```

1 #include "histogram_equalization.hpp"
2
3 void loadRawFile(cv::Mat &dst_img, std::string file_path, int width, int
    height)
4 {
5     std::FILE* f = std::fopen(file_path.c_str(), "rb");
6     // std::vector<char> buf(width*height); // char is trivially copyable
7     unsigned char buf[width][height];
8     std::fread(&buf[0], sizeof buf[0], width*height, f);
9     for (int i = 0; i < dst_img.rows; i++)
10     {
11         for (int j = 0; j < dst_img.cols; j++)
12         {
13             dst_img.at<char>(i, j) = buf[i][j];
14         }
15     }
16     std::fclose(f);
17 }
18
19 void showImage(std::string win_name, cv::Mat &show_img)
20 {
21     static int win_move_x = 50;
22     static int win_move_y = 50;
23     cv::namedWindow(win_name, 0);
24     cv::resizeWindow(win_name, show_img.cols, show_img.rows);
25     cv::moveWindow(win_name, win_move_x, win_move_y);
26     cv::imshow(win_name, show_img); //display Image

```

```

27 win_move_x += show_img.cols;
28 if (win_move_x > 1920-256)
29 {
30     win_move_x = 50;
31     win_move_y += (show_img.rows+35);
32 }
33 }
34
35 void writeCSV( std::string folder,
36               std::string file_name,
37               std::vector<int> curvesPoints)
38 {
39     std::ofstream myfile(folder+file_name+".csv");
40     myfile << "x,y" << std::endl;
41     for (int i = 0; i < curvesPoints.size(); i++)
42     {
43         myfile << i << "," << curvesPoints[i] << std::endl;
44     }
45     myfile.close();
46 }
47
48 void saveImage(cv::Mat &img, std::string folder, std::string file_name)
49 {
50     std::string save_file = folder + file_name + ".png";
51     cv::imwrite(save_file, img);
52 }
53
54 HistogramEq::HistogramEq(cv::Mat &src_img, int L=256)
55 {
56     this->histogram = this->getHistogram(src_img, L);
57     this->cdf = this->getCDF();
58     this->L = L;
59     this->pixel_num = src_img.cols * src_img.rows;
60     this->ComputeVmap(this->v_map);
61 }
62
63 std::vector<int> HistogramEq::getHistogram(cv::Mat &src_img, int L=256)
64 {
65     std::vector<int> his(L, 0.0);
66     for (int i = 0; i < src_img.rows; i++)
67     {
68         for (int j = 0; j < src_img.cols; j++)
69         {
70             his[src_img.at<uint8_t>(i, j)] += 1.0;
71         }
72     }
73     return his;
74 }
75

```

```

76 std::vector<int> HistogramEq::getCDF()
77 {
78     std::vector<int> his_src = this->histogram;
79     std::vector<int> cdf(his_src.size());
80     int cdf_count = his_src[0];
81     int cdf_min = 0;
82     for (int i = 0; i < his_src.size(); i++)
83     {
84         cdf[i] = cdf_count;
85         if (cdf_min == 0 && cdf_count != 0) cdf_min = cdf_count;
86         cdf_count += his_src[i];
87     }
88     this->cdf_min = cdf_min;
89     return cdf;
90 }
91
92 int HistogramEq::getHv(int v)
93 {
94     return ((double)(this->cdf[v] - this->cdf_min) / (double)(this->pixel_num))
95         * (this->L - 1);
96 }
97
98 std::vector<int> HistogramEq::getEqHistogram()
99 {
100     std::vector<int> eq_his(this->histogram.size());
101     for (int i = 0; i < eq_his.size(); i++)
102     {
103         eq_his[this->getHv(i)] = this->histogram[i];
104     }
105     return eq_his;
106 }
107
108 void HistogramEq::ComputeVmap(std::vector<int> &v_map)
109 {
110     v_map.resize(this->histogram.size());
111     for (int i = 0; i < this->histogram.size(); i++)
112     {
113         v_map[i] = this->getHv(i);
114     }
115 }
116
117 cv::Mat HistogramEq::getEqImage(cv::Mat &img_src)
118 {
119     cv::Mat eq_img(img_src.rows, img_src.cols, CV_8UC1);
120     for (int i = 0; i < img_src.rows; i++)
121     {
122         for (int j = 0; j < img_src.cols; j++)
123         {
124             eq_img.at<char>(i, j) = this->v_map[img_src.at<uint8_t>(i, j)];
125         }
126     }
127 }

```



```

124     }
125 }
126 return eq_img;
127 }
128
129 int main(int argc, char **argv)
130 {
131     cv::Mat lvroom_b_src(512, 512, CV_8UC1);
132     cv::Mat lvroom_d_src(512, 512, CV_8UC1);
133     loadRawFile(lvroom_b_src, "../images/livingroom_bright.raw", 512, 512);
134     loadRawFile(lvroom_d_src, "../images/livingroom_dark.raw", 512, 512);
135     HistogramEq hiseq_living_b = HistogramEq(lvroom_b_src);
136     HistogramEq hiseq_living_d = HistogramEq(lvroom_d_src);
137     writeCSV("../result_plot_data/", "livingRoomBrightHis", hiseq_living_b.
        histogram);
138     writeCSV("../result_plot_data/", "livingRoomDarkHis", hiseq_living_d.
        histogram);
139     writeCSV("../result_plot_data/", "livingRoomBrightEqHis", hiseq_living_b.
        getEqHistofram());
140     writeCSV("../result_plot_data/", "livingRoomDarkEqHis", hiseq_living_d.
        getEqHistofram());
141     cv::Mat lvroom_b_eq_img = hiseq_living_b.getEqImage(lvroom_b_src);
142     cv::Mat lvroom_d_eq_img = hiseq_living_d.getEqImage(lvroom_d_src);
143     saveImage(lvroom_b_src, "../result_img/problem2/", "livingroom_bright_src")
        ;
144     saveImage(lvroom_b_eq_img, "../result_img/problem2/", "
        livingroom_eq_bright_src");
145     saveImage(lvroom_d_src, "../result_img/problem2/", "livingroom_dark_src");
146     saveImage(lvroom_d_eq_img, "../result_img/problem2/", "
        livingroom_eq_dark_src");
147     showImage("livingroom bright", lvroom_b_src);
148     showImage("livingroom eq bright", lvroom_b_eq_img);
149     showImage("livingroom dark", lvroom_d_src);
150     showImage("livingroom eq dark", lvroom_d_eq_img);
151     cv::waitKey(0);
152     return 0;
153 }

```