Computer Engineering Case Study – Image Features Extraction using Gray Level Cooccurrence Matrix (GLCM)

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STEP 1: Problem Identification and Statement

The problem is extracting the features, such as contrast, energy, and homogeneity, from a file containing image data/pixel information.

STEP 2: Gathering of Information and Input and Output Description

Gray Level Co-occurrence Matrix (GLCM) represents the spatial relationships of pixels in the image. GLCM examines the spatial relationship among pixels and defines how frequently a combination of pixels is present in an image in a given direction $\boldsymbol{\theta}$ and distance \boldsymbol{d} . Using GLCM, you can derive several statistics like 'contrast,' 'energy,' and 'homogeneity.' These statistics provide information about the texture of an image.

<u>Creating GLCM from image pixel information:</u>

Before creating GLCM, we should find the maximum gray level in the image- as the dimensions of the GLCM depend on the maximum gray level in an image. The dimensions of GLCM should be set as the maximum value plus one.

For the values inside GLCM, the figure below illustrates the process used to create the GLCM from an image with 8 gray levels.

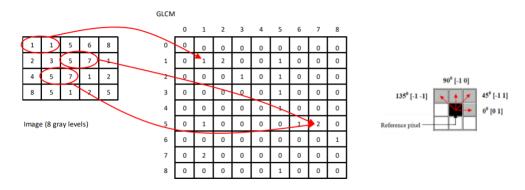


Figure 1 Input Image and the generated GLCM with θ = 0, and d = 1

In the output GLCM, element (1,1) contains the value 1 because there is only one instance in the input image where two horizontally adjacent pixels have the values 1 and 1, respectively. Element (1,2) contains the value 2 because there are two instances where two horizontally adjacent pixels have values 1 and 2. Element (1,3) in the GLCM has the value 0 because there are no instances of two horizontally adjacent pixels with the values 1 and 3.

Creating normalized GLCM from the GLCM matrix:

A normalized GLCM matrix has the same dimension as the GLCM matrix. The values inside the GLCM matrix at a given point (i,j) is equal to the value of the point in GLCM that has the same location divided by the sum of values in GLCM. Look equation below:

$$p(i,j) = \frac{M(i,j)}{\sum_{i,j} M(i,j)}$$

<u>Finding the values of the attributes of an image (contrast, energy, homogeneity)</u> <u>using normalized GLCM matrix: a</u>

The attributes can be calculated using these equations where p(i,j) is the value in the Normalized GLCM matrix at location (i,j):

Contrast

$$contrast = \sum_{i,j} |i - j|^2 \times p(i,j)$$

Energy

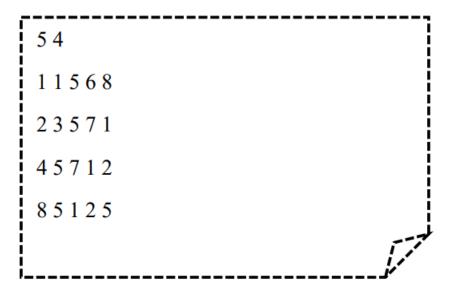
$$energy = \sum_{i,j} p(i,j)^2$$

• Homogeneity (Similarity)

$$homogeneity = \sum_{i,j} \frac{p(i,j)}{1 + |i-j|^2}$$

Dealing with Files:

The image data information is going to be passed by file. The data in the file is assumed to have the dimensions of the image stored in the first line as (columns, rows), followed by the pixel information. Look example below:



Furthermore, it is assumed that the file contains at least information of size <u>2X2</u> and that all the values inside are <u>positive integers</u>.

Note: The file will be given by the user. Our algorithm is concerned with running the calculation from the information in the file not producing it.

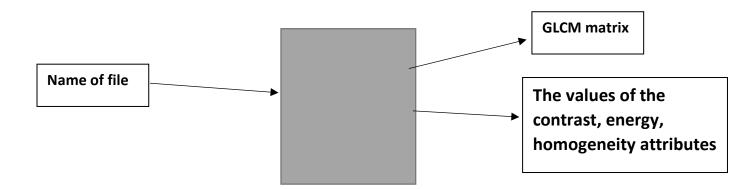
This will be organized through a menu where it is going to ask the user what function of the program they want to work with, namely (1) Create and normalize the GLCM matrix (2) Compute the statistical parameters of the texture – we assume for this function that the user wants to see the results as well, so they are printed when the user calls this function(3) Print the GLCM matrix- the normalized matrix will not be printed(4) quit the program. It is important to mention that the program will ask the user for a file name even before the user gets to the menu, and unless the user gives a valid file name, they will not be able to access the menu. They can choose to exit the program by typing 0.

In case the user selects the first option from the menu (Create and normalize the GLCM matrix), the program is going to create the GLCM matrix and create

another identical matrix that will be normalized. The program then returns to the main menu. If the user selects the second option and they did not create the GLCM matrix, the program will print a message stating that they should create the matrix first. If they choose the second option and the matrix has been created, the program is going to calculate the attributes (energy, homogeneity, and contrast) of the image using the normalized GLCM and print these attributes. The program then returns to the main menu. If the user selects the third option and they did not create the GLCM matrix, the program will print a message stating that they should create the matrix first. If they choose the third option and the matrix has been created, the program will print the GLCM matrix. If the user selects the exit option, the program prints a terminating message and quits the program.

I/O description:

The program will take three inputs and produce one output:



STEP3: Test Cases and Algorithm Design:

A) Test cases

The values of the attributes were calculated using website <u>mathworks</u>.

Test case #1:

File: "image.txt"

5 4

11568

23571

45712

85125

File Name Input [String]	Menu input [String]	Output	Menu input [String]	Output	Menu Input [String]
image.txt	1	Done	2	Contrast: 8.93	3
				Energy: 0.086	
				Homogeneity:	
				0.3762	

Continue

Output	Go back to menu	Output
00000000	4	Thanks for using our
012001000		program
000101000		
000001000		
000001000		
010000120		
000000001		
02000000		
000001000		

Test case #2:

File: "image.txt"

10 10

Please create 1 Done GLCM before
calculating attributes

Continue

Menu Input[string]	Output	Menu Input	Output
3	223213	2	Contrast: 6.12
	152433		Energy: 0.0358
	121324		Homogeneity: 0.4428
	524441		
	501323		
	143220		

Test case #3:

File: "image.txt"

3 3

123

954

File Name Input [String]	Output	File Name Input [String]	Menu Input [String]
Yousef.txt	Error. The file doesn't exist. Please	0	Thanks for using our porgram
	try again		

Test case #4:

File: "image.txt"

3 3

123

954

File Name Input [String]	Menu Input [String]	Output	Menu input [String]	Output	Menu input [String]	Output
Image.txt	1	done	3	GLCM matrix:	4	Thanks for using our
						program
				000000000		
				0010000000		
				0001000000		
				000000000		
				000000000		
				0000100000		
				0000001100		
				000000000		
				000000000		
				0000010000		

B) Algorithm (Pseudocode)

Include the iostream, cmath, fstream, libraries

Initialize function CreateMatrix void with a parameter containing two double pointer type int, and two integers

Initialize function CreateNormalized void with a parameter containing one double pointer type int, one double pointer type double, and one integer.

Initialize functions printMatritype void with a parameter containing one double pointer type int, and one integer.

Initialize functions contrast, homogeneity, and Energy void with a parameter containing one double pointer type double with one integer.

Initialize function importImage that returns a double pointer type int with parameter containing 3 references to integer variables

Main function

Declare two bool variables repeat and GLCMcreated. Initialize repeat to true and GLCMcreated to false.

Declare two double pointers type int GLCM and image

Declare double pointer type double

Declare three int variables max, rows, and columns and initialize them to Ω

Declare string variable choice and initialize to an empty string. Print a message explaining the program.

Give the variable image the value returned by calling the function importImage with parameter row, columns, and max

Initialize GLCM double pointer to point to an array of pointers type int of size equal to one plus \max

Initialize normalizedGLCM double pointer to point to an array of pointers type double of size equal to one plus max

Start for loop that iterates max plus 1 times

initialize pointer at position i of GLCM to point to an array of integer size max plus 1, have all the values in integer array equal to 0

initialize pointer at position i of NormalizedGLCM to point to an array of doubles size max plus 1, have all the values in the array of doubles to equal $\mathbf{0}$

end loop

Start loop while choice string variable isn't equal to 4 $$\operatorname{\textsc{Display}}$ a message that explains the options of the menu and ask user for input choice

input value from user and store it in variable choice

if choice is equal to 1

call createMatrix-pass GLCM, image, rows, and columns - and createNormalized- pass GLCM, Normalized, and max- functions

set GLCMcreated to true

else if choice is equal to 2

if GLCMcreated is true

 $\,$ call contrast, Energy, and Homogeneity functionspass normalized GLCM, and max for each

if GLCM is not true

 $$\operatorname{print}$ a message stating that the user should create the GLCM first

else if choice is equal to 3

if GLCMcreated is true

call printMatrix- pass GLCM and max

if GLCM is not true

 $$\operatorname{print}$ a message stating that the user should create the GLCM first

else if choice is 4

print a message thanking the user

else choice is equal to anything else

display message that asks the user to input one of the options $% \left(1\right) =\left(1\right) \left(1\right) +\left(1\right) \left(1\right) \left(1\right) +\left(1\right) \left(1\right) \left($

End loop

Free double pointer variable image GLCM and normalized

End main

Start createMatrix function type void with parameters two double pointer type int: GLCM and image, two integer: rows and columns.

Start for loop with variable i that iterate rows number of times

Start for loop with variable j that interates one less than columns number of times

Increment the in GLCM that has dimensions where row: is the value in image array that has position (i,j) and column: the value in image array that has position (i,j+1) by one

End function

Start createNormalized function type void with parameters one double pointer type int GLCM, one double pointer type double NormalizedGLCM, and an integer max.

Declare variable type double called sum and equal it to 0 $$\operatorname{Start}$ nested for loop with variables i and j where each loop iterates max plus one number of times

Increment sum by the value in GLCM that has position (i,j)

End Nested loop

Start nested for loop with variables i and j where each loop iterates max plus one number of times

Make value in normalized GLCM with positions (i,j) equal to the value in GLCM position (i,j) devided by the sum

End nested loop

End function

Start void printMatrix function with parameters double pointer type int ${\tt GLCM}$ and integer variable ${\tt max}$

 $\hbox{Start for loop with variables i that iterates } \max \ \hbox{plus one number}$ of times

Print value of GLCM that with location (i,j)

End loop
Print new line

End loop

End function

Start void function contrast with double pointer type double NormalziedGLCM and integer max

Declare variable type double contrast and intalize it to 0

Start nested for loop with variables i and j where each loop iterates max plus one number of times

 $\hbox{Increment contrast by the square absolute difference between i and j times the value of Normalized GLCM at (i,j)} \\$

End nested loop

Print contrast value

End function

Start void function Energy with double pointer type double NormalziedGLCM and integer $\ensuremath{\mathsf{max}}$

Declare variable type double Energy and intalize it to 0

Start nested for loop with variables i and j where each loop iterates max plus one number of times

Increment energy by the square of the value of Normalized GLCM at (i,j) $% \left(\frac{1}{2}\right) =\frac{1}{2}\left(\frac{1}{2}\right) +\frac{1}{2}\left(\frac{1}{2}\right) +\frac{1$

End nested loop

Print energy value

End function

Start void function Homogenity with double pointer type double Normalzied GLCM and integer $\ensuremath{\mathsf{max}}$

Declare variable type double homogeneity and intalize it to ${\tt O}$

Start nested for loop with variables i and j where each loop iterates max plus one number of times

Increment homogeneity by value of Normalized GLCM at (i,j) devided by 1 plus the square absolute difference between i and j

End nested loop

Print energy value

End function

Start importImage function with parameter reference location to integers row, columns and max

Declare double pointer type int

Declare ifstream variable file

Declare string variable nameFile

Display a message asking the user for file name input (or 0 if they want to exit the program) $\,$

Input value from the user and store it in nameFile

Open file using the nameFile string variable

Start while loop that keeps iterating as long as opening file failed

If nameFile is equal to 0

Exit program

 $\,$ Display error message that no file with that name exist and asking the user to input another name

Input value from the user and store it in nameFile

Open file using the nameFile string variable

```
End Loop
      Input values from file into columns and rows
      Initialize image pointer to point to an array of pointers type int with
size rows
      Start for loop that iterate rows number of time with variable i
            Set pointer in location i of image array of pointer to point to
an array of integers size columns
            Start loop that iterate columns number of time with variable j
                  Input from file into the value of image with location i,j
                  If value of image with location i, j greater than max
                        Then set max to equal this value
            End loop
     End loop
      Close file
      return double pointer variable image
End function
```

Step 4: Implementation

//Initilizing functions:

```
/*
Name: Yousef Al-Jazzazi
netlD: ya2225
Asssignment 2 for CPE class with prof. Mohammad Eid
Date: November 13th 2022
Project name: Computer Engineering Case Study – Image Features Extraction using Gray Level Cooccurrence
Matrix (GLCM)
Description: The program takes a file that contains the pixel information of an image and use changes it to Gray
level coocurrence Matrix
to find some of the features of the image

*/
#include <iostream>
#include <fstream>
#include <fstream>
using namespace std;
```

```
void createMatrix(int** GLCM, int** image, int rows, int columns);
void createNormalized(int** GLCM, double** normalized, int max);
void printMatrix(int** GLCM, int max);
void contrast(double** NormalizedGLCM, int max);
void Homogenity(double** NormalizedGLCM, int max);
void Energy(double** NormalizedGLCM, int max);
// A helper function to import the image, take the values into a 2D array, and returns the pointer for the 2D
int** importImage(int& rows, int& columns, int& max);
int main() {
        //Initalize variables
        bool repeat = true, GLCMCreated = false;
        int **image = NULL, **GLCM = NULL;
        double** normalizedGLCM = NULL;
        int max(0), rows(0), columns(0);
        string choice = "";
        //Explain the program for the user and ask for the file- inside importImage function
        cout << "Hello User!!!\nThis program is designed to take input file that has the values in pixels of an
image"
                 << " and creat a GLCM matrix and then use the GLCM matrix to find some of the attributes of
the image" << endl;
        image = importImage(rows, columns, max);
        //Initialize GLCM and normalizedGLCM with dimension max +1, and initalize all the values to be 0
        GLCM = new int^* [max + 1];
        normalizedGLCM = new double* [max + 1];
        for (int i = 0; i < max + 1; i++) {
                 GLCM[i] = new int[max + 1] \{0\};
                 normalizedGLCM[i] = new double[max + 1] {0};
        }
        //The menu will be called continuesly until repeat is false which is when the user choice is 4
        while (choice != "4") {
                 cout << "There are 3 functions of the program."</pre>
                         << "\nPress 1 to create and normalize GLCM matrix"
                         << "\nPress 2 Compute the statistical parameters of the texture"
                         << "\nPress 3 Print the GLCM matrix"
                          << "\nPress 4 to exit the code" <<endl;
                 //I choose the combination of string and if statement rather than an switch statement because
                 //in the case a user input a string in an int, it will result in a failed comand with an infinite loop
                 cin >> choice;
                 if (choice == "1") {
```

```
createNormalized(GLCM, normalizedGLCM, max);
                          GLCMCreated = true;
                          cout << "Done\n\n" << endl;
                 else if (choice == "2")
                          //Only call function if GLCM was created
                          if (GLCMCreated) {
                                  contrast(normalizedGLCM, max);
                                  Energy(normalizedGLCM, max);
                                  Homogenity(normalizedGLCM, max);
                          }
                          else
                                  cout << "Please create GLCM before calculating attributes" << endl;</pre>
                 else if (choice == "3") {
                          //Only Print GLCM if GLCM was created
                          if (GLCMCreated)
                                  printMatrix(GLCM, max);
                          else
                                  cout << "Please create GLCM before printing" << endl;</pre>
                 else if (choice == "4") {
                          cout << "Thanks for using our porgram" << endl;</pre>
                 }
                 else
                          cout << "Please input one of the options" << endl;
        }
                 //Freeing the image 2D array
                 for (int i = 0; i < rows; i++)
                          delete[] image[i];
                 delete[] image;
                 //Freeing the GLCM and normalizedGLCM arrays
                 for (int i = 0; i < max + 1; i++)
                          delete[] GLCM[i], normalizedGLCM[i];
                 delete[] GLCM, normalizedGLCM;
        return(0);
}
void createMatrix(int** GLCM, int** image,int rows, int columns) {
        //Using the maximum found in the image 2D array to initalize a GLCM 2D array where all values are
zero
        //Traverse through the image 2D array and imputting the nessessary values into GLCM 2D array
        for (int i = 0; i < rows; i++) {
                 for (int j = 0; j < columns - 1; j++) {
                          ++GLCM[image[i][j]][image[i][j + 1]];
```

createMatrix(GLCM, image, rows, columns);

```
}
        }
}
void createNormalized(int** GLCM, double** NormalizedGLCM, int max) {
         //Find the sum by traversing through GLCM
         double sum(0);
         for (int i = 0; i < max + 1; i++) {
                 for (int j = 0; j < max + 1; j++) {
                           sum += GLCM[i][j];
                 }
        }
         //Creating NormalizedGLCM
         for (int i = 0; i < max + 1; i++) {
                 for (int j = 0; j < max + 1; j++) {
                           //If sum is zero then it will print this message
                           if (sum == 0) {
                                   cout << "Normalized was not created successfully" << endl;
                                   return;
                          }
                           NormalizedGLCM[i][j] = GLCM[i][j] / sum;
                 }
        }
}
void printMatrix(int** GLCM, int max) {
         cout << "GLCM matrix:\n\n";</pre>
         //Printing GLCM matrix
         for (int i = 0; i < max + 1; i++) {
                 for (int j = 0; j < max + 1; j++) {
                           cout << GLCM[i][j] << " ";
                 }
                 cout << "\n";
        }
}
//A function that Finds the contrast and prints it
void contrast(double** NormalizedGLCM, int max) {
         double contrast(0);
         for (int i = 0; i < max + 1; i++) {
                 for (int j = 0; j < max + 1; j++) {
                          contrast += pow(abs(i - j), 2) * NormalizedGLCM[i][j];
                 }
```

```
cout << "\nContrast: " << contrast << endl;</pre>
}
//A function that Finds the Energy and prints it
void Energy(double** NormalizedGLCM, int max) {
        double energy(0);
        for (int i = 0; i < max + 1; i++) {
                 for (int j = 0; j < max + 1; j++) {
                          energy += NormalizedGLCM[i][j] * NormalizedGLCM[i][j];
                 }
        }
        cout << "Energy: " << energy << endl;
}
//A function that Finds the homogenity and prints it
void Homogenity(double** NormalizedGLCM, int max) {
        double homogenity(0);
        for (int i = 0; i < max + 1; i++) {
                 for (int j = 0; j < max + 1; j++) {
                          homogenity += (NormalizedGLCM[i][j] / (1 + pow(abs(i - j), 2)));
                 }
        cout << "Homogeneity: " << homogenity << endl;
}
//the function takes rows, columns, and max variables as refrences to implement changing on them
//We passed them as refrence rather than creating as pointers as pointers gives felxibility(with complexity) that
is not needed in this case
int** importImage(int& rows, int& columns, int& max) {
        int** image;
        ifstream file;
        string nameFile;
        cout << "Before starting, please enter the name of the first file: (Press 0 to exit program)" << endl;
        cin >> nameFile;
        file.open(nameFile, ios::in);
        //if the name inputed by the user doesnt work, keep asking the user for a valid name.
        //The user can opt out of the porgram by inputting a 0
        while (file.fail()) {
                 if (nameFile == "0") {
                          cout << "Thanks for using our porgram" << endl;
                          exit(1);
                 }
```

```
cerr << "Error. The file doesn't exist. Please try again" << endl;
                  cin >> nameFile;
                  file.open(nameFile, ios::in);
        }
         file >> columns >> rows;
         image = new int*[rows];
         //Inputting the values into a 2D image array and finding the maximum value
         for (int i = 0; i < rows; i++) {
                  image[i] = new int[columns];
                  for (int j = 0; j < \text{columns}; j++) {
                           file >> image[i][j];
                           if (image[i][j] > max)
                                    max = image[i][j];
                  }
File.close();
         // return a pointer for the 2D array
         return image;
}
```

Step 5: Test Cases and verification

Errors: I noticed that the value of homogeneity calculated through website mathworks gave a different value. After further inspection, it appeared that the website used a different equation for homogeneity. The values of homogeneity produced by my program was compared to other peers, and it appears that all of us got the same value- verifying that my program runs correctly

Test #1:

File: "image.txt"
5 4
1 1 5 6 8

23571 45712 85125

```
Microsoft Visual Studio Debug Console
                                                                                               ×
This program is designed to take input file that has the values in pixels of an image and creat a GLCM \scriptstyle 
atrix and then use the GLCM matrix to find some of the attributes of the image
Before starting, please enter the name of the first file: (Press 0 to exit program)
image.txt
There are 3 functions of the program.
Press 1 to create and normalize GLCM matrix
Press 2 Compute the statistical parameters of the texture
Press 3 Print the GLCM matrix
Press 4 to exit the code
Done
There are 3 functions of the program.
Press 1 to create and normalize GLCM matrix
Press 2 Compute the statistical parameters of the texture
Press 3 Print the GLCM matrix
Press 4 to exit the code
Contrast: 8.9375
Energy: 0.0859375
Homogeneity: 0.291981
There are 3 functions of the program.
Press 1 to create and normalize GLCM matrix
Press 2 Compute the statistical parameters of the texture
Press 3 Print the GLCM matrix
Press 4 to exit the code
GLCM matrix:
000000000
012001000
000101000
000001000
000001000
010000120
000000001
020000000
000001000
There are 3 functions of the program.
Press 1 to create and normalize GLCM matrix
Press 2 Compute the statistical parameters of the texture
Press 3 Print the GLCM matrix
Press 4 to exit the code
Thanks for using our porgram
C:\Users\user\source\repos\Assignmnet2\x64\Debug\Assignmnet2.exe (process 10224) exited with code 0.
Press any key to close this window . . .
```

Test #2:

File: "image.txt"

```
Hello User!!!
This program is designed to take input file that has the values in pixels of an image and creat a GLCM matrix and then use the GLCM matrix to find some of the attributes of the image

Before starting, please enter the name of the first file: (Press 0 to exit program)
gg.txt
Error. The file doesn't exist. Please try again
image.txt
There are 3 functions of the program.
Press 1 to create and normalize GLCM matrix
Press 2 Compute the statistical parameters of the texture
Press 3 Print the GLCM matrix
Press 4 to exit the code
Please create GLCM before calculating attributes
There are 3 functions of the program.
Press 1 to create and normalize GLCM matrix
Press 2 Compute the statistical parameters of the texture
Press 3 Print the GLCM matrix
Press 4 to exit the code
Done
There are 3 functions of the program.
Press 1 to create and normalize GLCM matrix
Press 2 Compute the statistical parameters of the texture
Press 3 Print the GLCM matrix
Press 4 to exit the code
GLCM matrix:
2 2 3 2 1 3
1 5 2 4 3 3 1 2 1 3 2 4
5 2 4 4 4 1
5 0 1 3 2 3
1 4 3 2 2 0
There are 3 functions of the program.
Press 1 to create and normalize GLCM matrix
Press 2 Compute the statistical parameters of the texture
Press 3 Print the GLCM matrix
Press 4 to exit the code
Contrast: 6.12222
Energy: 0.0358025
Homogeneity: 0.364651
```

Test # 3:

File: "image.txt"

33

123

954

```
Hello User!!!
This program is designed to take input file that has the values in pixels of an image and creat a GLCM m atrix and then use the GLCM matrix to find some of the attributes of the image
Before starting, please enter the name of the first file: (Press 0 to exit program)
Yousef.txt
Error. The file doesn't exist. Please try again
0
Thanks for using our porgram
C:\Users\user\source\repos\Assignmnet2\x64\Debug\Assignmnet2.exe (process 22868) exited with code 1.
Press any key to close this window . . .
```

Test #4:

File: "image.txt"

3 3

123

954

```
X
Microsoft Visual Studio Debug Console
                                                                                         Hello User!!!
This program is designed to take input file that has the values in pixels of an image and creat a GLCM m
atrix and then use the GLCM matrix to find some of the attributes of the image
Before starting, please enter the name of the first file: (Press 0 to exit program)
image.txt
There are 3 functions of the program.
Press 1 to create and normalize GLCM matrix
Press 2 Compute the statistical parameters of the texture
Press 3 Print the GLCM matrix
Press 4 to exit the code
Done
There are 3 functions of the program.
Press 1 to create and normalize GLCM matrix
Press 2 Compute the statistical parameters of the texture
Press 3 Print the GLCM matrix
Press 4 to exit the code
GLCM matrix:
00000000000
0010000000
0001000000
0000000000
00000000000
0000100000
0000001100
0000000000
0000000000
0000010000
There are 3 functions of the program.
Press 1 to create and normalize GLCM matrix
Press 2 Compute the statistical parameters of the texture
Press 3 Print the GLCM matrix
Press 4 to exit the code
Thanks for using our porgram
```