

# Praktikum Extraction Feature (Local Binary Pattern)

Hero Yudo Martono

Mei 2016

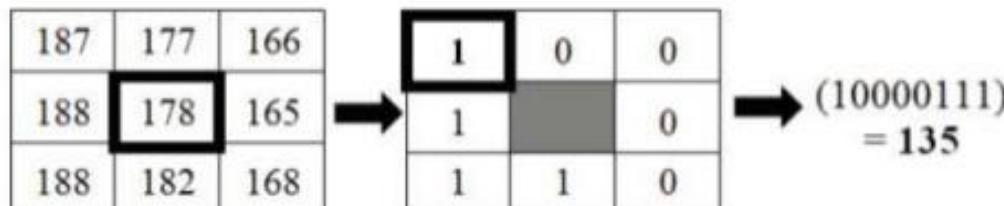
# Local Binary Pattern

## Local binary patterns

$$LBP(x_c, y_c) = \sum_{n=0}^7 s(l_n - l_c)2^n$$

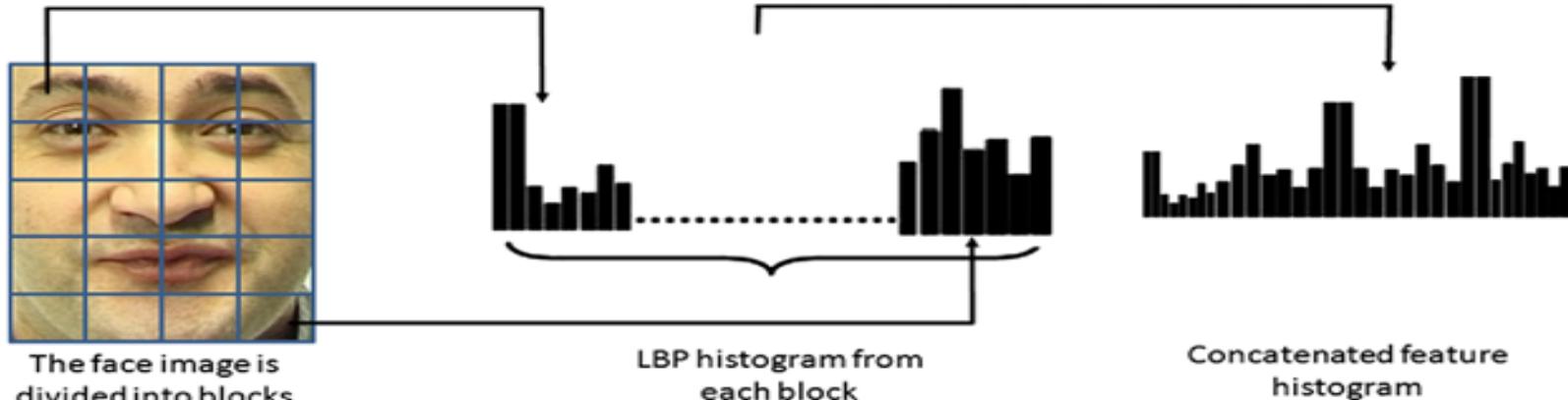
$$s(k) = \begin{cases} 1 & \text{if } k \geq 0 \\ 0 & \text{if } k < 0 \end{cases}$$

$l_n$  : Corresponds to the central pixel value  
 $l_c$  : The 8-neigbor pixels values



From a window with nine pixels of the image is defined soon after labeling where binary values larger than the center pixel receives 1 and 0 otherwise then the value in decimal, binary labels.

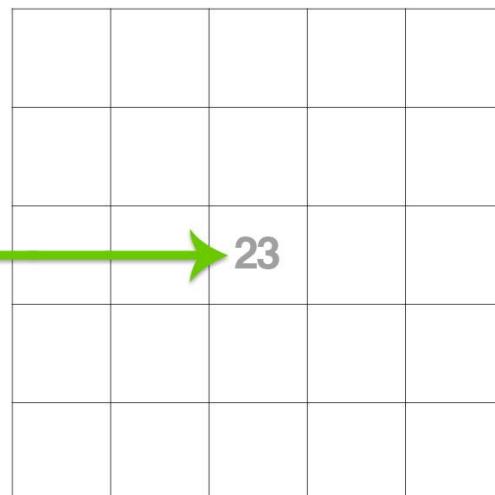
# Local Binary Pattern



Input Image

5	4	2	2	1
3	5	8	1	3
2	5	4	1	2
4	3	7	2	7
1	4	4	2	6

Output LBP Image



1	1	0
1	X	0
0	1	0

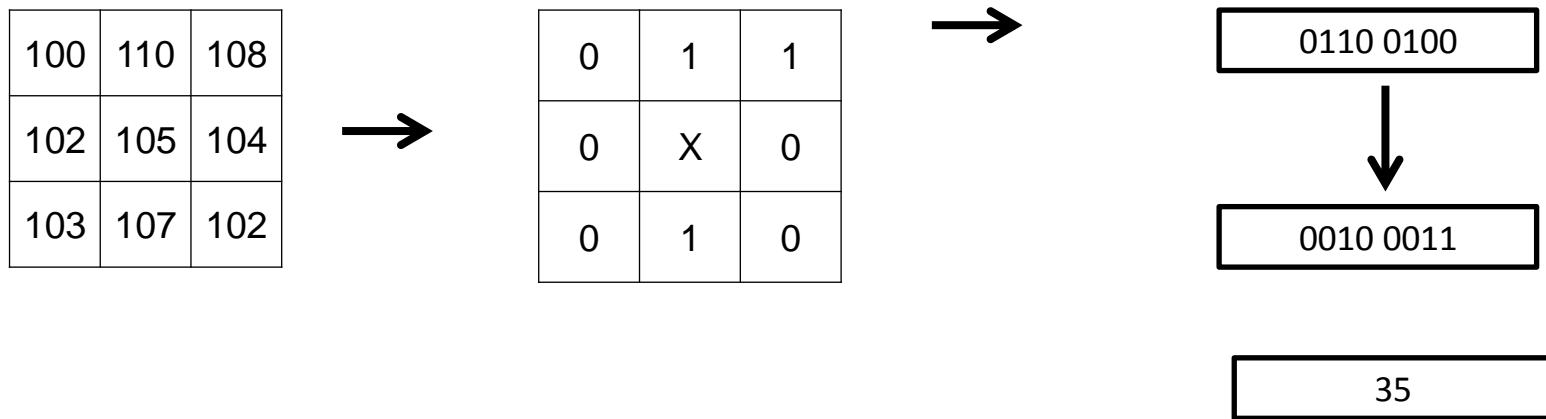
1100 0101

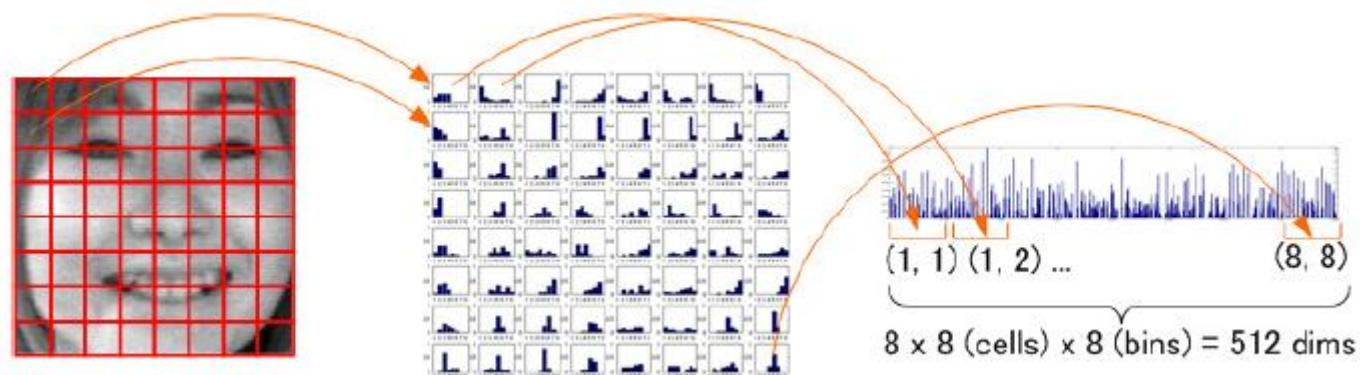
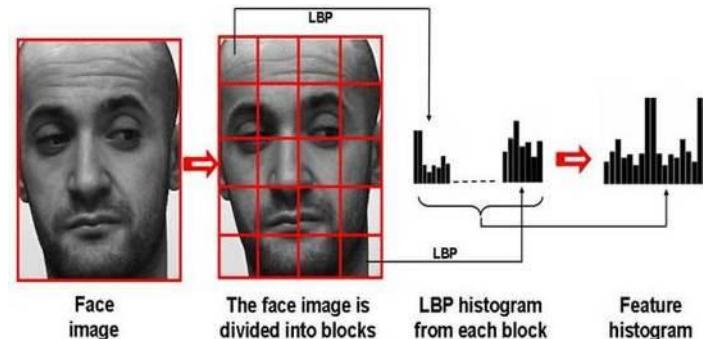
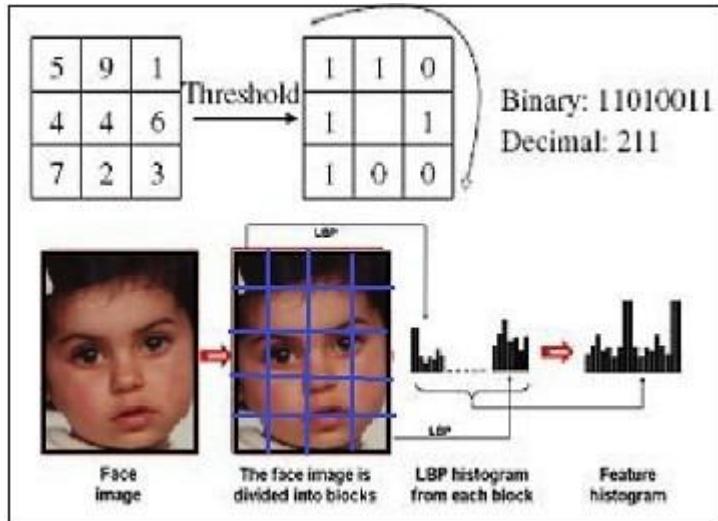
0001 0111

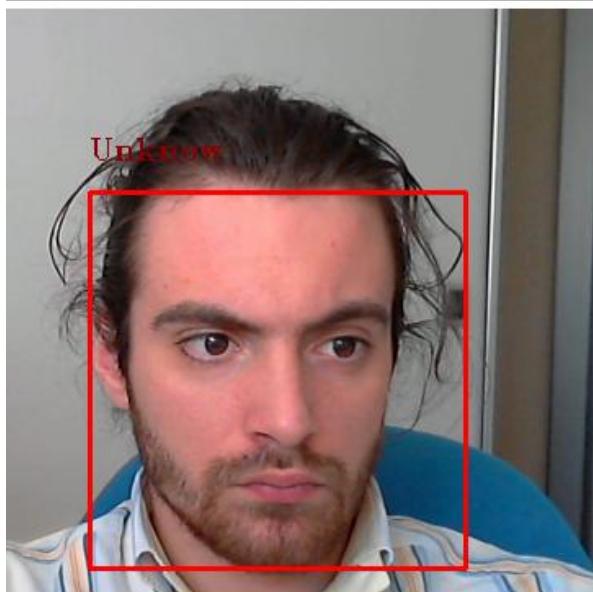
# Question

100	110	108
102	105	104
103	107	102

# Answer

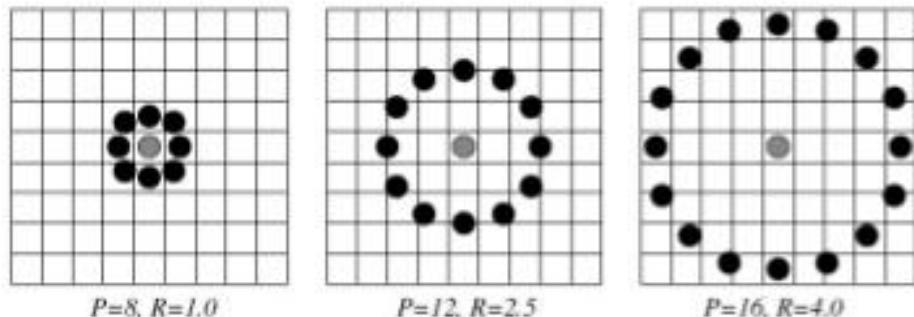
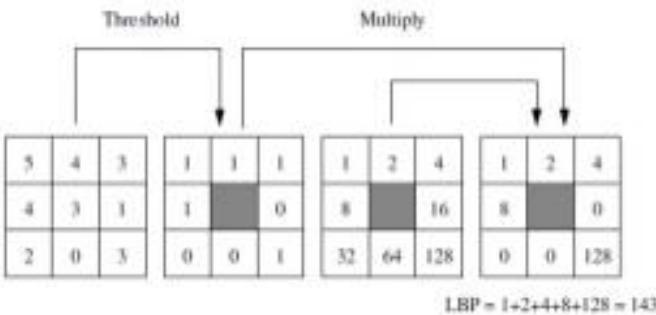




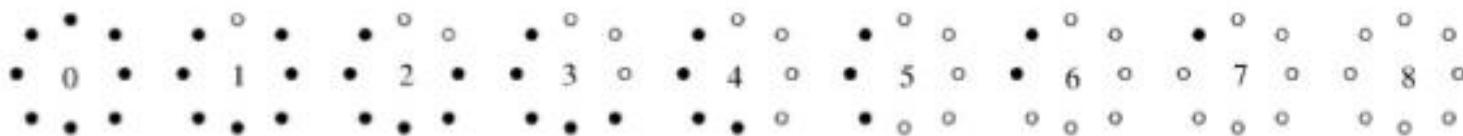


## SEGMENTATION I: STRUCTURE-EMPHASIZING LBP FILTER

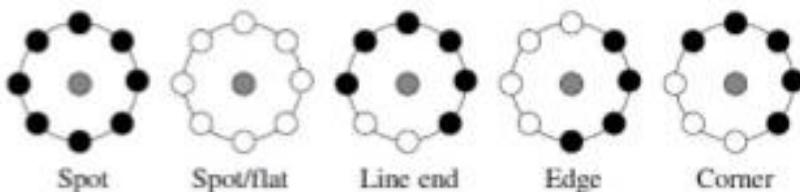
### LOCAL BINARY PATTERN:



### ROTATION INVARIANT UNIFORM LBPS:

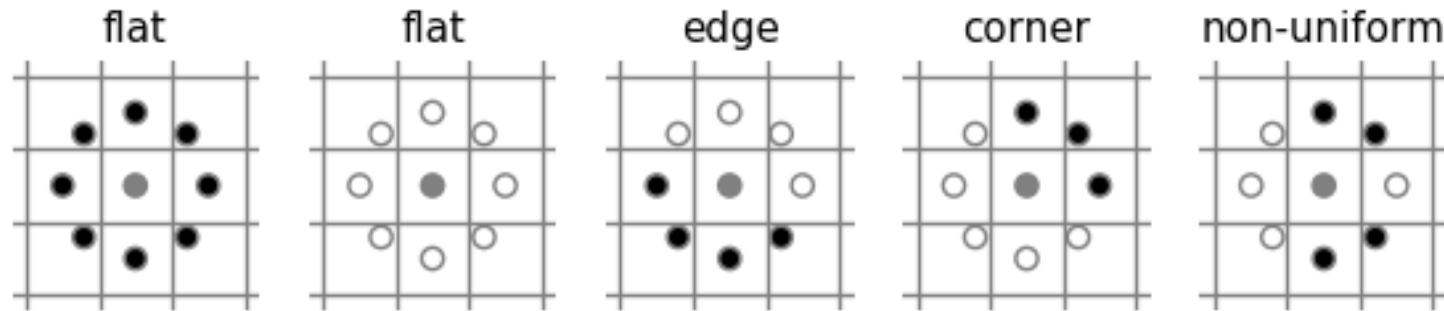


### TEXTURE PRIMITIVES:



IM OJALA ET AL., „MULTIRESOLUTION GRAY-SCALE AND ROTATION INVARIANT TEXTURE CLASSIFICATION WITH LOCAL BINARY PATTERNS“, IEEE TRANSACTIONS ON PATTERN ANALYSIS AND MACHINE INTELLIGENCE, VOL 24, NO. 7, JULY 2002.

# Local Binary Pattern



# Rotation variance

- We define formula U which value of an LBP pattern is defined as the number of spatial transitions (bitwise 0/1 changes) in that pattern.

$$U(LBP_{P,R}) = |s(g_{P-1} - g_c) - s(g_0 - g_c)| + \sum_{p=1}^{P-1} |s(g_p - g_c) - s(g_{p-1} - g_c)|$$

0	1	1
1		0
0	0	0

01110000  
 $U(LBP_{P,R}) = 2$

1	1	1
1		0
1	0	1

11110101  
 $U(LBP_{P,R}) = 4$

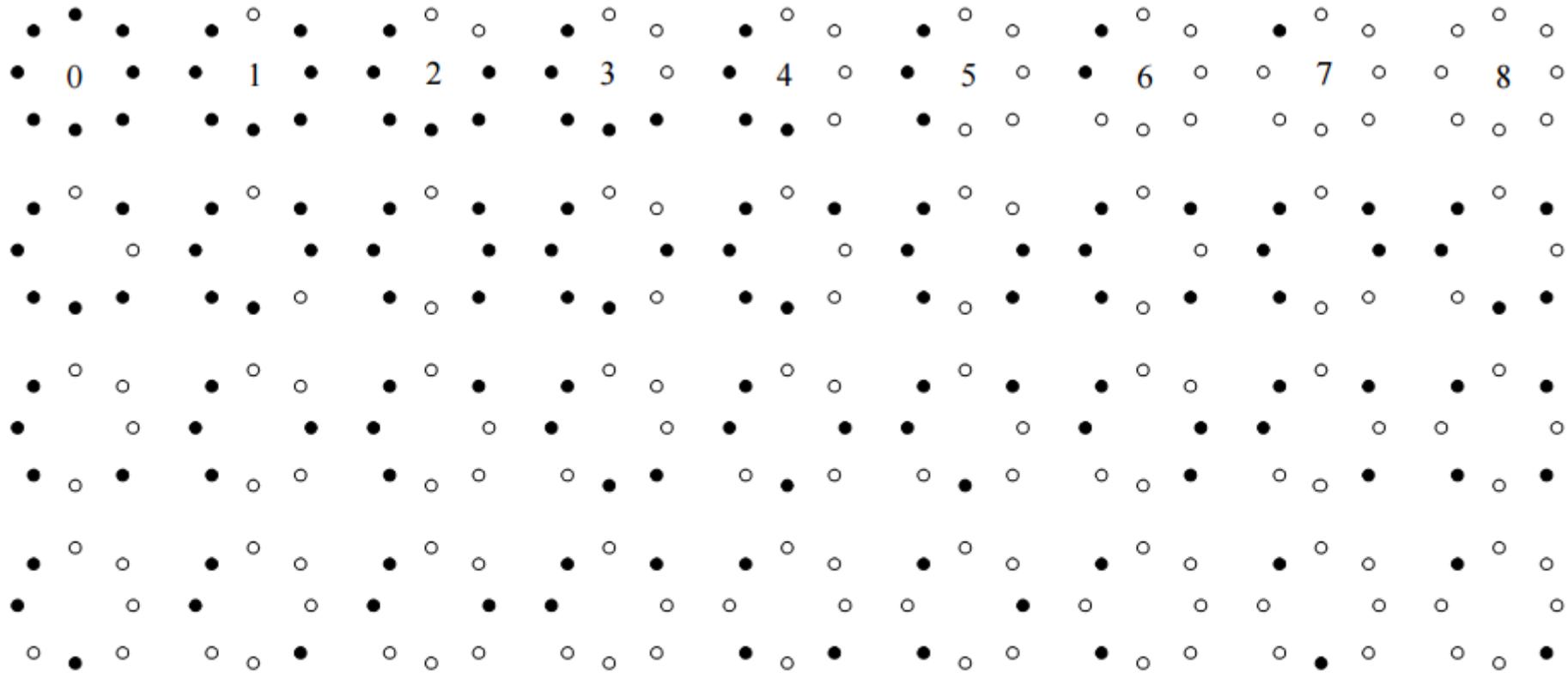


Fig. 2. The 36 unique rotation invariant binary patterns that can occur in the circularly symmetric neighbor set of  $LBP_{8,R}^{ri}$ . Black and white circles correspond to bit values of 0 and 1 in the 8-bit output of the operator. The first row contains the nine ‘uniform’ patterns, and the numbers inside them correspond to their unique  $LBP_{8,R}^{riu2}$  codes.

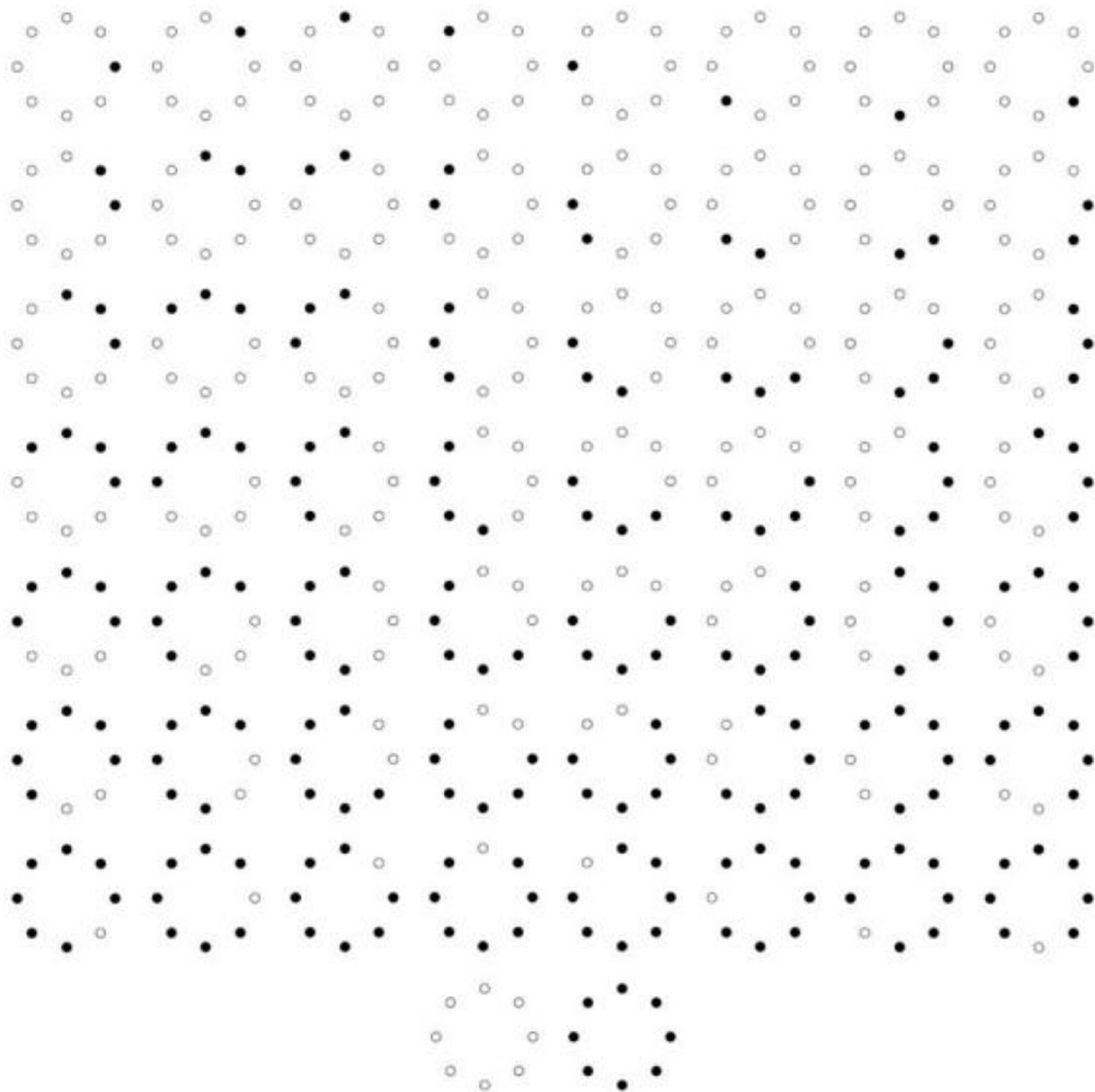


Fig. 3. Uniform LBP patterns when  $P=8$ . The black and white dots represent the bit values of 1 and 0 in the 8-bit output of the LBP operator.

# Multiresolution Gray Scale and Rotation Invariant Texture Classification with Local Binary Patterns

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<http://www.ee.oulu.fi/research/imag/texture>

$$T \approx t(s(g_0 - g_c), s(g_1 - g_c), \dots, s(g_{P-1} - g_c)) \quad (5)$$

where

$$s(x) = \begin{cases} 1, & x \geq 0 \\ 0, & x < 0 \end{cases} \quad (6)$$

$$LBP_{P,R} = \sum_{p=0}^{P-1} s(g_p - g_0) 2^p \quad (7)$$

# Multiresolution Gray Scale and Rotation Invariant Texture Classification with Local Binary Patterns

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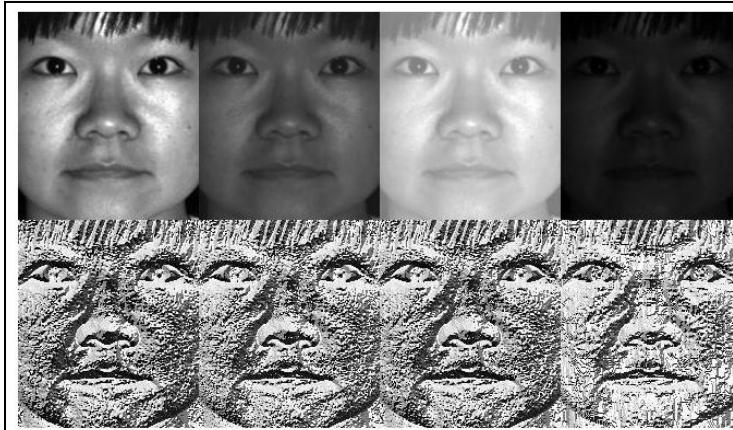
{skidi, mkp, topioli}@ee.oulu.fi

<http://www.ee.oulu.fi/research/imag/texture>

$$LBP_{P,R}^{ri} = \min\{ROR(LBP_{P,R}, i) \mid i = 0, 1, \dots, P-1\} \quad (8)$$

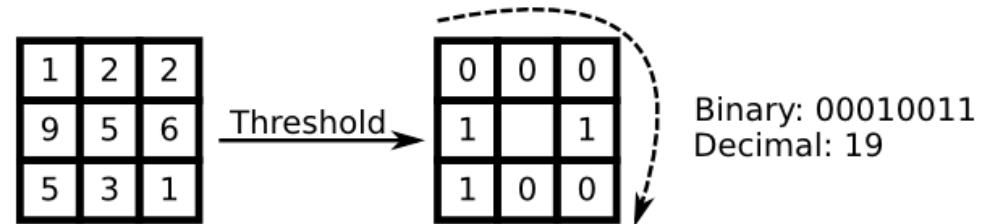
Fig. 2. The 36 unique rotation invariant binary patterns that can occur in the circularly symmetric neighbor set of  $LBP_{8,R}^{ri}$ . Black and white circles correspond to bit values of 0 and 1 in the 8-bit output of the operator. The first row contains the nine ‘uniform’ patterns, and the numbers inside them correspond to their unique  $LBP_{8,R}^{riu2}$  codes.

$$VAR_{P,R} = \frac{1}{P} \sum_{p=0}^{P-1} (g_p - \mu)^2 \quad , \text{ where } \mu = \frac{1}{P} \sum_{p=0}^{P-1} g_p \quad (11)$$



## Local Binary Patterns Histograms in OpenCV

```
1  /*
2   * Copyright (c) 2011. Philipp Wagner <bytefish[at]gmx[dot]de>.
3   * Released to public domain under terms of the BSD Simplified license.
4   *
5   * Redistribution and use in source and binary forms, with or without
6   * modification, are permitted provided that the following conditions are met:
7   *   * Redistributions of source code must retain the above copyright
8   *     notice, this list of conditions and the following disclaimer.
9   *   * Redistributions in binary form must reproduce the above copyright
10  *     notice, this list of conditions and the following disclaimer in the
11  *     documentation and/or other materials provided with the distribution.
12  *   * Neither the name of the organization nor the names of its contributors
13  *     may be used to endorse or promote products derived from this software
14  *     without specific prior written permission.
15  *
16  * See <http://www.opensource.org/licenses/bsd-license>
17 */
18
19 #include "opencv2/core/core.hpp"
20 #include "opencv2/contrib/contrib.hpp"
21 #include "opencv2/highgui/highgui.hpp"
22
```



## Algorithmic Description

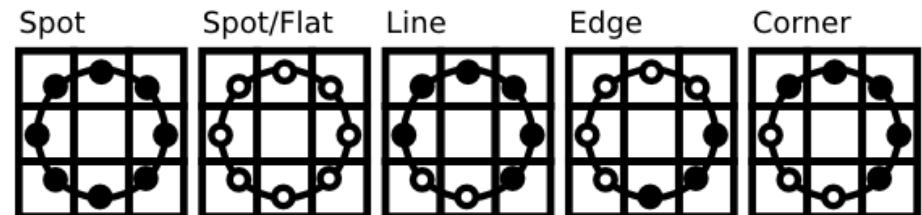
A more formal description of the LBP operator can be given as:

$$LBP(x_c, y_c) = \sum_{p=0}^{P-1} 2^p s(i_p - i_c)$$

, with  $(x_c, y_c)$  as central pixel with intensity  $i_c$ ; and  $i_p$  being the intensity of the neighbor pixel.  $s$  is the sign function defined as:

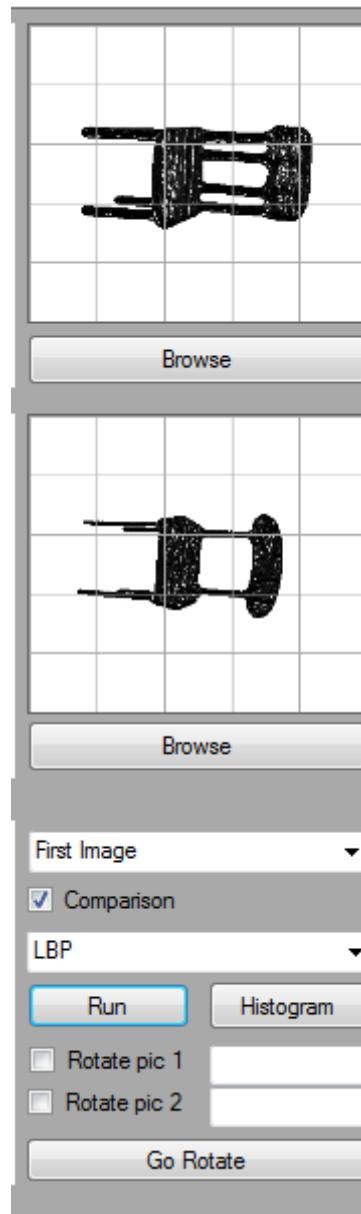
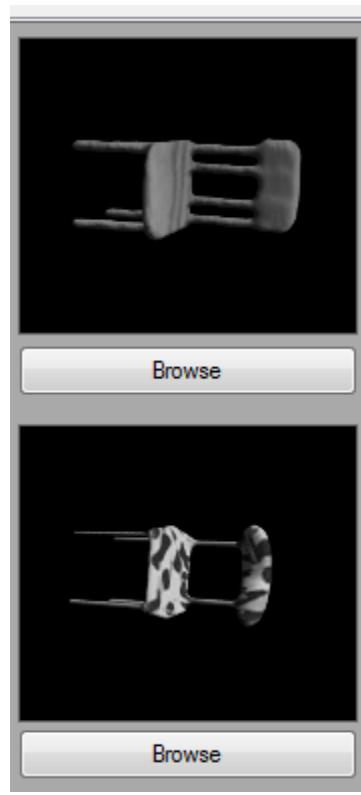
$$s(x) = \begin{cases} 1 & \text{if } x \geq 0 \\ 0 & \text{else} \end{cases} \quad (1)$$

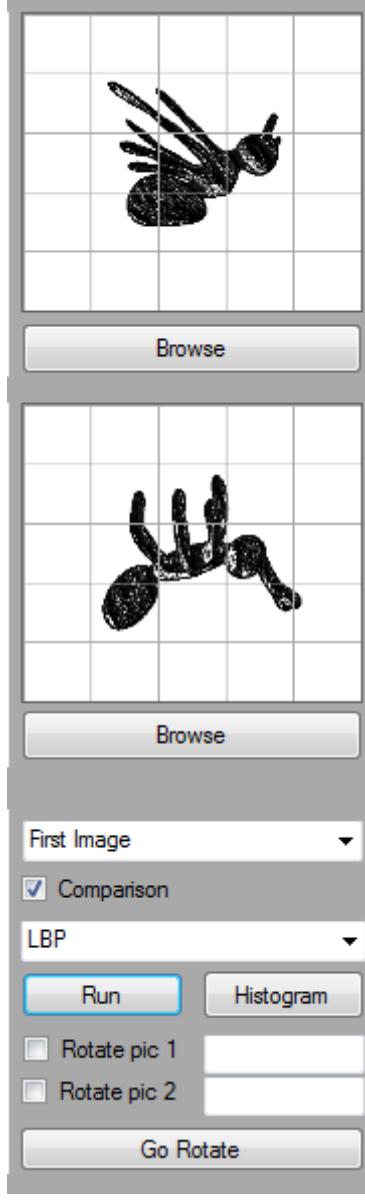
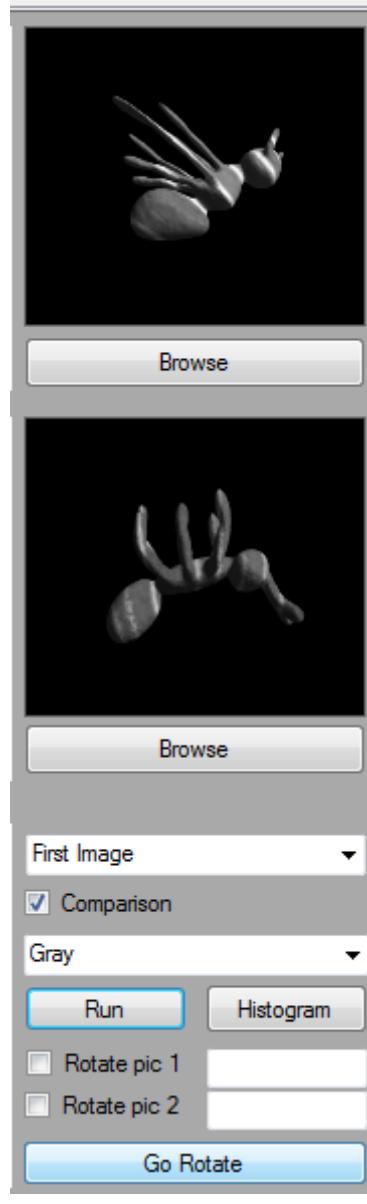
This description enables you to capture very fine grained details in images. In fact the authors were able to compete with state of the art results for texture classification. A fixed neighborhood fails to encode details differing in scale. So the operator was extended to use a variable neighborhood in [AHP04]. The idea is to align the neighborhood to the local orientation, which enables to capture the following neighborhoods:



For a given Point  $(x_c, y_c)$  the position of the neighbor  $(x_p, y_p)$ ,  $p \in P$  can be calculated by:

$$\begin{aligned} x_p &= x_c + R \cos\left(\frac{2\pi p}{P}\right) \\ y_p &= y_c - R \sin\left(\frac{2\pi p}{P}\right) \end{aligned}$$



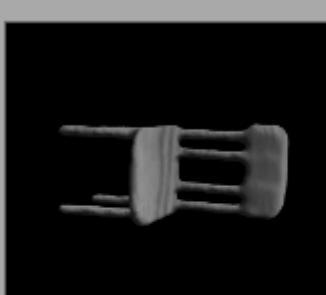


 Browse

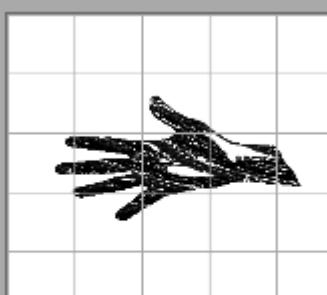
 Browse

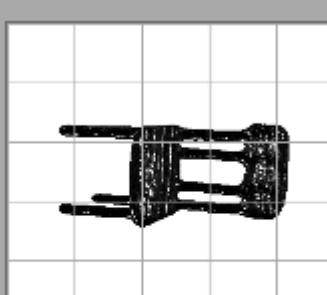
First Image ▾  
 Comparison  
LBP  
   
 Rotate pic 1   
 Rotate pic 2

 Browse

 Browse

First Image ▾  
 Comparison  
Gray  
   
 Rotate pic 1   
 Rotate pic 2

 Browse

 Browse

First Image ▾  
 Comparison  
LBP  
   
 Rotate pic 1   
 Rotate pic 2



Browse



Browse



Browse

A binary (black and white) image representation of the hand skeleton from the first row, showing the main structural elements.

All

Comparison

Sobel

**Run**      Histogram

Rotate pic 1

Rotate pic 2

Rotate pic 3

Go Rotate

Browse

A binary image representation of the hand skeleton from the second row, showing the main structural elements.

Browse

A binary image representation of the hand skeleton from the third row, showing the main structural elements.

All

Comparison

LBP

**Run**      Histogram

Rotate pic 1

Rotate pic 2

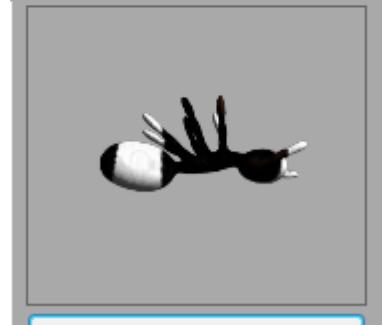
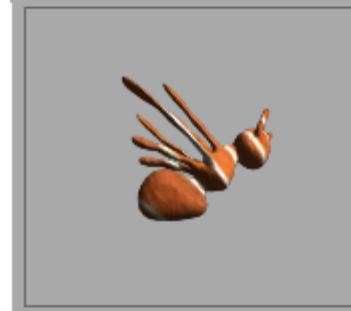
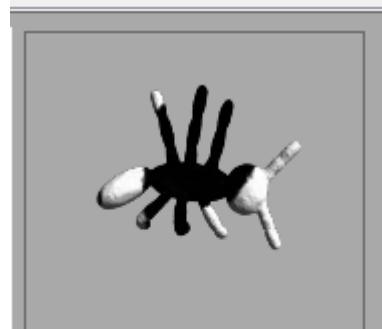
Rotate pic 3

Go Rotate

Browse

A binary image representation of the hand skeleton from the fourth row, showing the main structural elements.

Browse



All

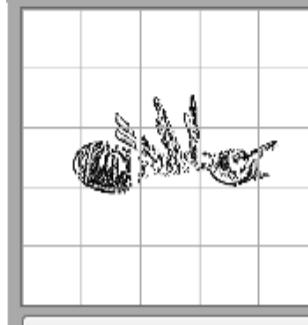
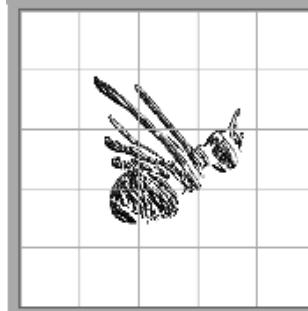
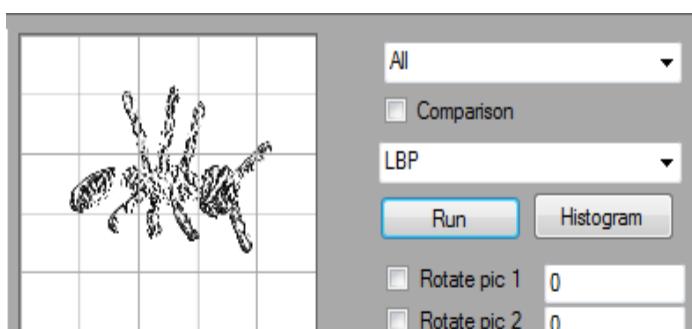
Comparison

Sobel

Rotate pic 1 0

Rotate pic 2 0

Rotate pic 3



All

Comparison

LBP

Rotate pic 1 0

Rotate pic 2 0

Rotate pic 3

```
//1=first LBP
//2=rotation invariant uniform , 9 features
//3=riu 36 unique
//4=texture primitives
//5=rotation variance
int num_patchLebar = 5;
int num_patchTinggi = 5;
int[, ,] binLBP1a = new int[num_patchLebar, num_patchTinggi, 256];
int[, ,] binLBP1b = new int[num_patchLebar, num_patchTinggi, 256];
int[, ,] binLBP1c = new int[num_patchLebar, num_patchTinggi, 256];
int[, ,] binLBP2a = new int[num_patchLebar, num_patchTinggi, 9];
int[, ,] binLBP2b = new int[num_patchLebar, num_patchTinggi, 9];
int[, ,] binLBP2c = new int[num_patchLebar, num_patchTinggi, 9];
int[, ,] binLBP3a = new int[num_patchLebar, num_patchTinggi, 36];
int[, ,] binLBP3b = new int[num_patchLebar, num_patchTinggi, 36];
int[, ,] binLBP3c = new int[num_patchLebar, num_patchTinggi, 36];
Class1 action = new Class1();
Bitmap bmp1 = (Bitmap)boxHis1.Image;
Bitmap bmp2 = (Bitmap)boxHis2.Image;
Bitmap bmp3 = (Bitmap)boxHis3.Image;
```

```
//caseSwitch4 = comboBox4.SelectedIndex;
switch (caseSwitch4)
{
    case 0: Console.WriteLine("All");
        binLBP1a = action.getLBP(bmp1, binLBP1a, 1, num_patchLebar, num_patchTinggi);
        outputBitmap1 = action.getOutputBitmap();
        boxHis1.Image = outputBitmap1;
        binLBP1b = action.getLBP(bmp2, binLBP1b, 1, num_patchLebar, num_patchTinggi);
        outputBitmap2 = action.getOutputBitmap();
        boxHis2.Image = outputBitmap2;
        binLBP1c = action.getLBP(bmp3, binLBP1c, 1, num_patchLebar, num_patchTinggi);
        outputBitmap3 = action.getOutputBitmap();
        boxHis3.Image = outputBitmap3;
        break;
    case 1: Console.WriteLine("First Image");
        binLBP1a = action.getLBP(bmp1, binLBP1a, 1, num_patchLebar, num_patchTinggi);
        outputBitmap1 = action.getOutputBitmap();
        boxHis1.Image = outputBitmap1;
        break;
    case 2: Console.WriteLine("Second Image");
        binLBP1b = action.getLBP(bmp2, binLBP1b, 1, num_patchLebar, num_patchTinggi);
        outputBitmap2 = action.getOutputBitmap();
        boxHis2.Image = outputBitmap2;
        break;
    case 3: Console.WriteLine("Third Image");
        binLBP1c = action.getLBP(bmp3, binLBP1c, 1, num_patchLebar, num_patchTinggi);
        outputBitmap3 = action.getOutputBitmap();
        boxHis3.Image = outputBitmap3;
        break;
}
```

```
public int[, ,] getLBP(Bitmap bmp, int[, ,] binLBP, int p, int lebar, int tinggi)
{
    Color pixelColor;
    outputBitmap = new Bitmap(bmp.Width, bmp.Height);
    int[] typeLBP = new int[2];
    for (int j = 0; j < tinggi; j++)
    {
        for (int i = 0; i < lebar; i++)
        {
            int batas_x1 = i*(int)bmp.Width / lebar +1;
            int batas_x2 = (i+1) *(int)bmp.Width / lebar -1;
            int batas_y1 = j*(int)bmp.Height / tinggi +1;
            int batas_y2 = (j+1) *(int)bmp.Height / tinggi -1;

            for (int y = batas_y1; y < batas_y2; y++)
            {
                for (int x = batas_x1; x < batas_x2; x++)
                {
                    pixelColor = bmp.GetPixel(x, y);
                    //mendapatkan nilai pola di tiap pixel
                    int value = getValueLBP(outputBitmap, bmp, x, y);

                    //memeriksa jenis type LBP
                    typeLBP = getTypeLBP(typeLBP, value, p);

                    //mendapatkan nilai histogram
                    if (typeLBP[0] == 1) binLBP[i, j, typeLBP[1]]++;

                }//end of x
            }//end of y

        }//end of i
    }//end of j
    Console.WriteLine("LBP Finished");
    return binLBP;
}
```

```
public int getMinShiftLBP(int[] polaLBP){...}
public int getValueLBP(Bitmap outputBitmap, Bitmap bmp, int x, int y)
{
    int value = 0;
    int[] polaLBP = new int[8];

    for (int i = 0; i < 8; i++)
    {
        switch (i)
        {
            case 0: if (bmp.GetPixel(x - 1, y - 1).R >= bmp.GetPixel(x, y).R) polaLBP[7] = 1; else polaLBP[7] = 0; break;
            case 1: if (bmp.GetPixel(x , y - 1).R >= bmp.GetPixel(x, y).R) polaLBP[6] = 1; else polaLBP[6] = 0; break;
            case 2: if (bmp.GetPixel(x + 1, y - 1).R >= bmp.GetPixel(x, y).R) polaLBP[5] = 1; else polaLBP[5] = 0; break;
            case 3: if (bmp.GetPixel(x + 1, y ).R >= bmp.GetPixel(x, y).R) polaLBP[4] = 1; else polaLBP[4] = 0; break;
            case 4: if (bmp.GetPixel(x +1, y+1 ).R >= bmp.GetPixel(x, y).R) polaLBP[3] = 1; else polaLBP[3] = 0; break;
            case 5: if (bmp.GetPixel(x , y + 1).R >= bmp.GetPixel(x, y).R) polaLBP[2] = 1; else polaLBP[2] = 0; break;
            case 6: if (bmp.GetPixel(x - 1, y + 1).R >= bmp.GetPixel(x, y).R) polaLBP[1] = 1; else polaLBP[1] = 0; break;
            case 7: if (bmp.GetPixel(x - 1, y ).R >= bmp.GetPixel(x, y).R) polaLBP[0] = 1; else polaLBP[0] = 0; break;
        }
    }

    value = getMinShiftLBP(polaLBP);
    outputBitmap.SetPixel(x, y, Color.FromArgb(value,value,value));
    return value;
}
```

```
public Bitmap getOutputBitmap() {return outputBitmap;}

public int getMinShiftLBP(int[] polaLBP)
{
    int minimal = 255;
    int temp = 0;
    for (int i = 0; i < 8; i++)
    {
        temp = polaLBP[7];
        polaLBP[7] = polaLBP[6];
        polaLBP[6] = polaLBP[5];
        polaLBP[5] = polaLBP[4];
        polaLBP[4] = polaLBP[3];
        polaLBP[3] = polaLBP[2];
        polaLBP[2] = polaLBP[1];
        polaLBP[1] = polaLBP[0];
        polaLBP[0] = temp;

        int value = 0;
        for (int j = 0; j < 8; j++)
        {
            value += ((int)Math.Pow(2, j)) * polaLBP[j];
        }
        if (minimal > value) minimal = value;
    }
    return minimal;
}
```

```
public int[] getTypeLBP(int[] typeLBP, int value, int p){  
    typeLBP[0] = 0;  
    typeLBP[1] = 10;  
  
    switch (p)  
{  
  
        //LBP jenis first LBP dengan 255 bin  
        case 1: typeLBP[0] = 1;  
                  typeLBP[1] = value;  
                  break;  
        //LBP rotation invariant uniform , 9 feature  
        case 2: typeLBP[0] = 1;  
                  if (value == 255) { typeLBP[1] = 0; }  
                  else if (value == 127) { typeLBP[1] = 1; }  
                  else if (value == 63) { typeLBP[1] = 2; }  
                  else if (value == 31) { typeLBP[1] = 3; }  
                  else if (value == 15) { typeLBP[1] = 4; }  
                  else if (value == 7) { typeLBP[1] = 5; }  
                  else if (value == 3) { typeLBP[1] = 6; }  
                  else if (value == 1) { typeLBP[1] = 7; }  
                  else if (value == 0) { typeLBP[1] = 8; }  
                  else { typeLBP[0] = 0; typeLBP[1] = 0; }  
                  break;  
  
        //36 unique rotation invariant uniform  
        case 3:  
                  typeLBP[0] = 1;  
                  if (value == 255) { typeLBP[1] = 0; }  
                  else if (value == 127) { typeLBP[1] = 1; }  
                  else if (value == 63) { typeLBP[1] = 2; }  
                  else if (value == 31) { typeLBP[1] = 3; }  
                  else if (value == 15) { typeLBP[1] = 4; }  
                  else if (value == 7) { typeLBP[1] = 5; }  
                  else if (value == 3) { typeLBP[1] = 6; }  
                  else if (value == 1) { typeLBP[1] = 7; }  
                  else if (value == 0) { typeLBP[1] = 8; }  
    }  
}
```

```
        else if (value == 95) { typeLBP[1] = 9; }
        else if (value == 111) { typeLBP[1] = 10; }
        else if (value == 119) { typeLBP[1] = 11; }
        else if (value == 47) { typeLBP[1] = 12; }
        else if (value == 79) { typeLBP[1] = 13; }
        else if (value == 55) { typeLBP[1] = 14; }
        else if (value == 87) { typeLBP[1] = 15; }
        else if (value == 103) { typeLBP[1] = 16; }
        else if (value == 91) { typeLBP[1] = 17; }

        else if (value == 23) { typeLBP[1] = 18; }
        else if (value == 39) { typeLBP[1] = 19; }
        else if (value == 71) { typeLBP[1] = 20; }
        else if (value == 27) { typeLBP[1] = 21; }
        else if (value == 43) { typeLBP[1] = 22; }
        else if (value == 75) { typeLBP[1] = 23; }
        else if (value == 51) { typeLBP[1] = 24; }
        else if (value == 83) { typeLBP[1] = 25; }
        else if (value == 85) { typeLBP[1] = 26; }

        else if (value == 11) { typeLBP[1] = 27; }
        else if (value == 19) { typeLBP[1] = 28; }
        else if (value == 35) { typeLBP[1] = 29; }
        else if (value == 67) { typeLBP[1] = 30; }
        else if (value == 21) { typeLBP[1] = 31; }
        else if (value == 37) { typeLBP[1] = 32; }
        else if (value == 5) { typeLBP[1] = 33; }
        else if (value == 9) { typeLBP[1] = 34; }
        else if (value == 17) { typeLBP[1] = 35; }
        |
        else { typeLBP[0] = 0; typeLBP[1] = 0; }
        break;
    }
    return typeLBP;
}
```

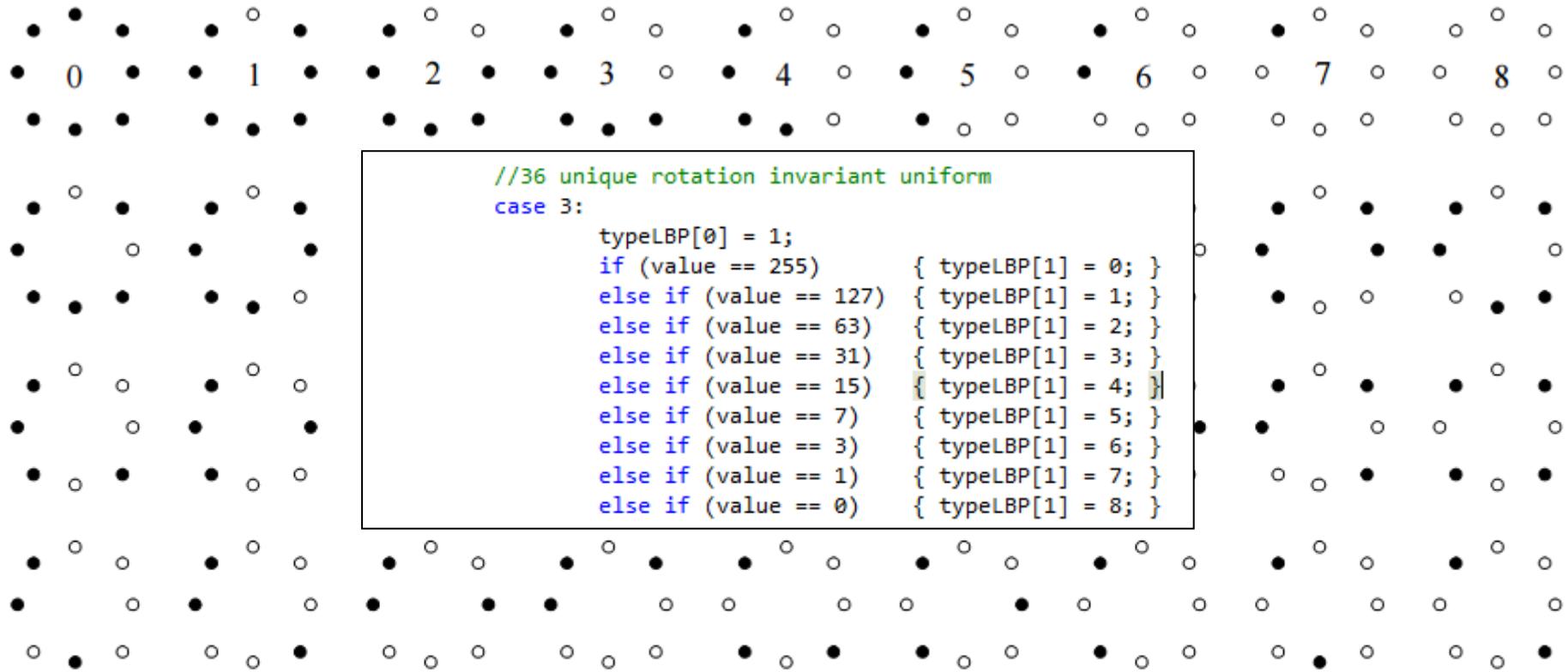


Fig. 2. The 36 unique rotation invariant binary patterns that can occur in the circularly symmetric neighbor set of  $LBP_{8,R}^{ri}$ . Black and white circles correspond to bit values of 0 and 1 in the 8-bit output of the operator. The first row contains the nine ‘uniform’ patterns, and the numbers inside them correspond to their unique  $LBP_{8,R}^{riu2}$  codes.

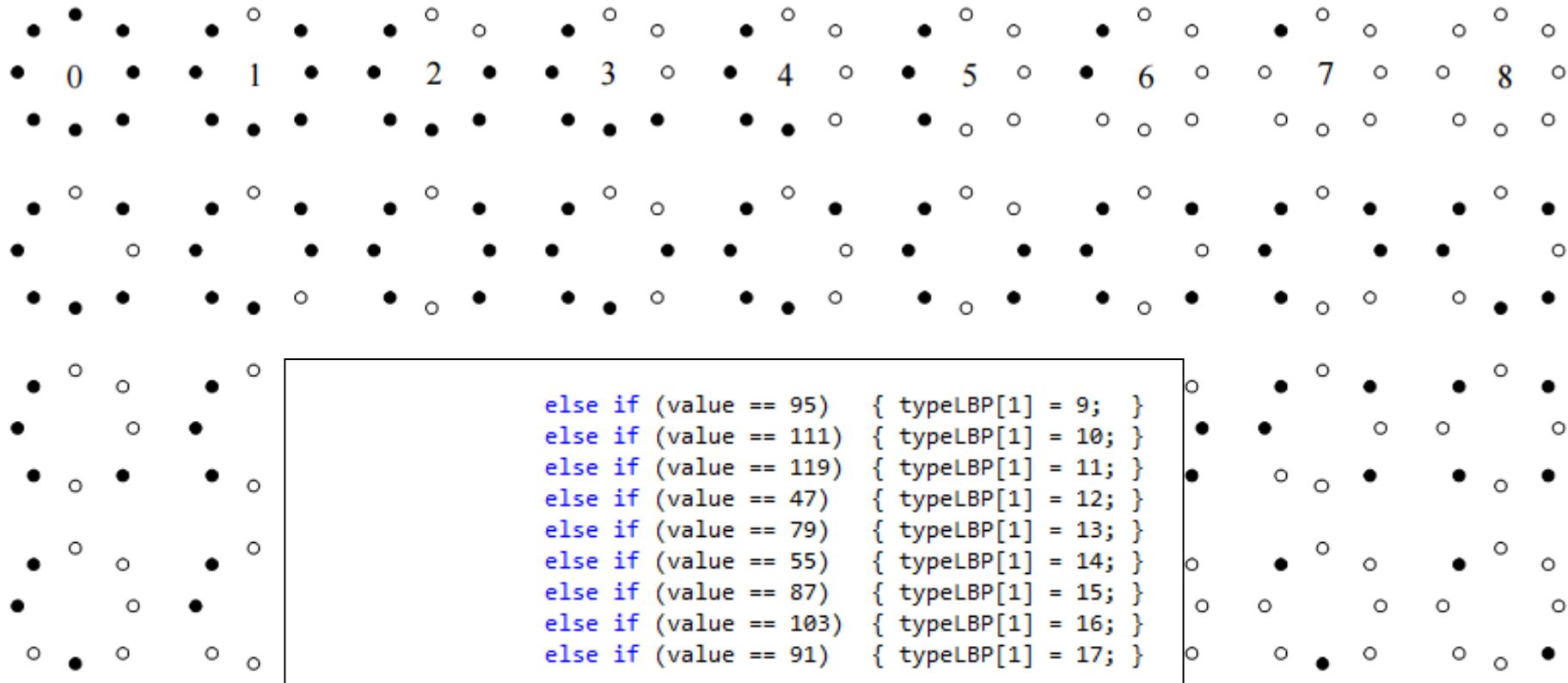
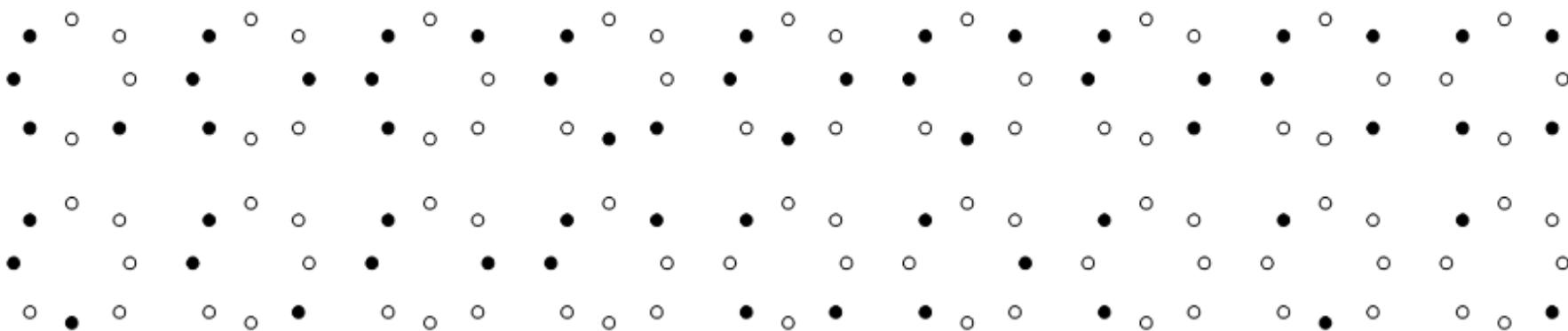
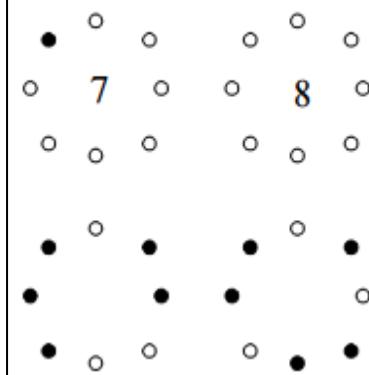
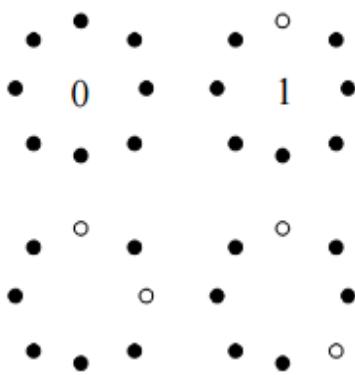


Fig. 2. The 36 unique rotation invariant binary patterns that can occur in the circularly symmetric neighbor set of  $LBP_{8,R}^{ri}$ . Black and white circles correspond to bit values of 0 and 1 in the 8-bit output of the operator. The first row contains the nine ‘uniform’ patterns, and the numbers inside them correspond to their unique  $LBP_{8,R}^{riu2}$  codes.

```
        else if (value == 23) { typeLBP[1] = 18; }
        else if (value == 39) { typeLBP[1] = 19; }
        else if (value == 71) { typeLBP[1] = 20; }
        else if (value == 27) { typeLBP[1] = 21; }
        else if (value == 43) { typeLBP[1] = 22; }
        else if (value == 75) { typeLBP[1] = 23; }
        else if (value == 51) { typeLBP[1] = 24; }
        else if (value == 83) { typeLBP[1] = 25; }
        else if (value == 85) { typeLBP[1] = 26; }

        else if (value == 11) { typeLBP[1] = 27; }
        else if (value == 19) { typeLBP[1] = 28; }
        else if (value == 35) { typeLBP[1] = 29; }
        else if (value == 67) { typeLBP[1] = 30; }
        else if (value == 21) { typeLBP[1] = 31; }
        else if (value == 37) { typeLBP[1] = 32; }
        else if (value == 5) { typeLBP[1] = 33; }
        else if (value == 9) { typeLBP[1] = 34; }
        else if (value == 17) { typeLBP[1] = 35; }

        |
        else { typeLBP[0] = 0; typeLBP[1] = 0; }
        break;
    }
    return typeLBP;
}
```



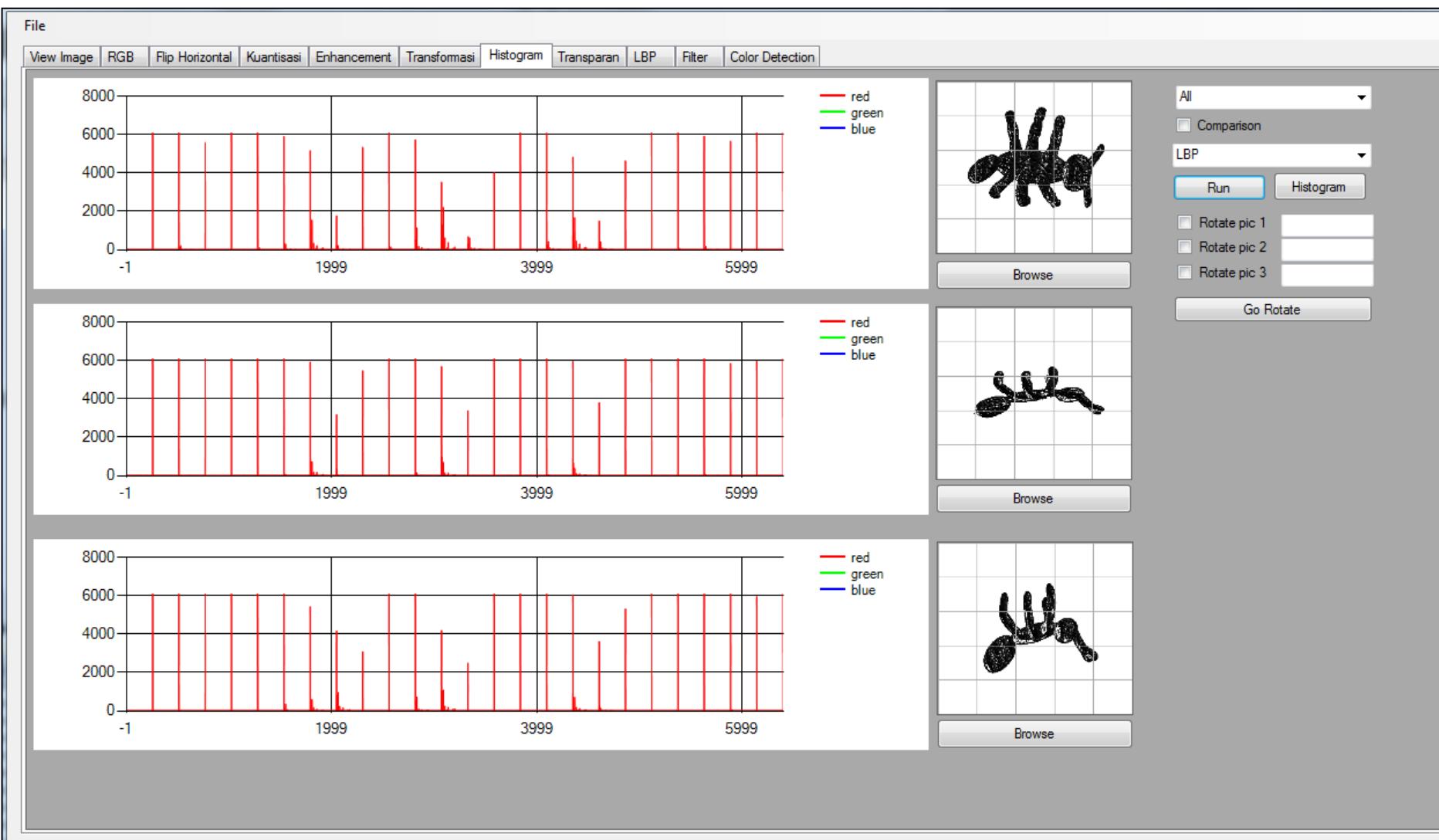
```
//caseSwitch4 = comboBox4.SelectedIndex;
switch (caseSwitch4)
{
    case 0: Console.WriteLine("All");
        binLBP1a = action.getLBP(bmp1, binLBP1a, 1, num_patchLebar, num_patchTinggi);
        outputBitmap1 = action.getOutputBitmap();
        boxHis1.Image = outputBitmap1;
        binLBP1b = action.getLBP(bmp2, binLBP1b, 1, num_patchLebar, num_patchTinggi);
        outputBitmap2 = action.getOutputBitmap();
        boxHis2.Image = outputBitmap2;
        binLBP1c = action.getLBP(bmp3, binLBP1c, 1, num_patchLebar, num_patchTinggi);
        outputBitmap3 = action.getOutputBitmap();
        boxHis3.Image = outputBitmap3;
        setHistogram(binLBP1a, 1, num_patchTinggi, num_patchLebar);
        setHistogram(binLBP1b, 2, num_patchTinggi, num_patchLebar);
        setHistogram(binLBP1c, 3, num_patchTinggi, num_patchLebar);

        break;
    case 1: Console.WriteLine("First Image");
        binLBP1a = action.getLBP(bmp1, binLBP1a, 1, num_patchLebar, num_patchTinggi);
        outputBitmap1 = action.getOutputBitmap();
        boxHis1.Image = outputBitmap1;
        setHistogram(binLBP1a, 1, num_patchTinggi, num_patchLebar);
        break;
    case 2: Console.WriteLine("Second Image");
        break;
}
```

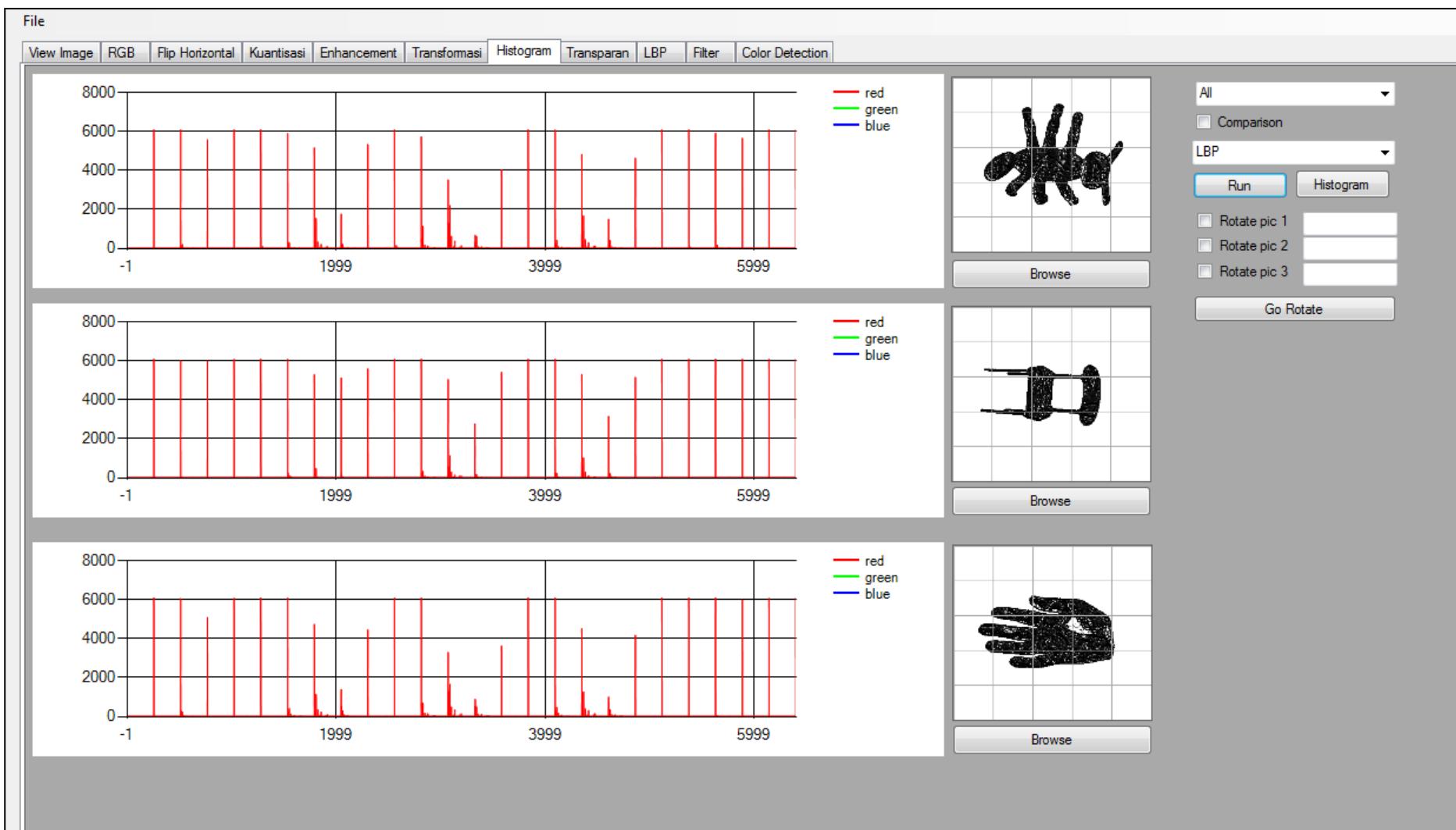
```
private void setHistogram(int[,] histogram, int num, int numY, int numX)
{
    switch (num)
    {
        case 1: chart1.Series["red"].Points.Clear(); chart2.Series["red"].Points.Clear(); chart3.Series["red"].Points.Clear(); break;
        case 2: chart1.Series["green"].Points.Clear(); chart2.Series["green"].Points.Clear(); chart3.Series["green"].Points.Clear(); break;
        case 3: chart1.Series["blue"].Points.Clear(); chart2.Series["blue"].Points.Clear(); chart3.Series["blue"].Points.Clear(); break;
    }

    for (int y = 1; y < numY-1; y++)
    {
        for (int x = 1; x < numX-1; x++)
        {
            for (int i = 0; i < 256; i++)
            {
                switch (num)
                {
                    case 1: this.chart1.Series["red"].Points.AddXY(((y * 5) + x) * 256 + i, histogram[y, x, i]); break;
                    case 2: this.chart2.Series["red"].Points.AddXY(((y * 5) + x) * 256 + i, histogram[y, x, i]); break;
                    case 3: this.chart3.Series["red"].Points.AddXY(((y * 5) + x) * 256 + i, histogram[y, x, i]); break;
                }
            }
        }
    }
}
```

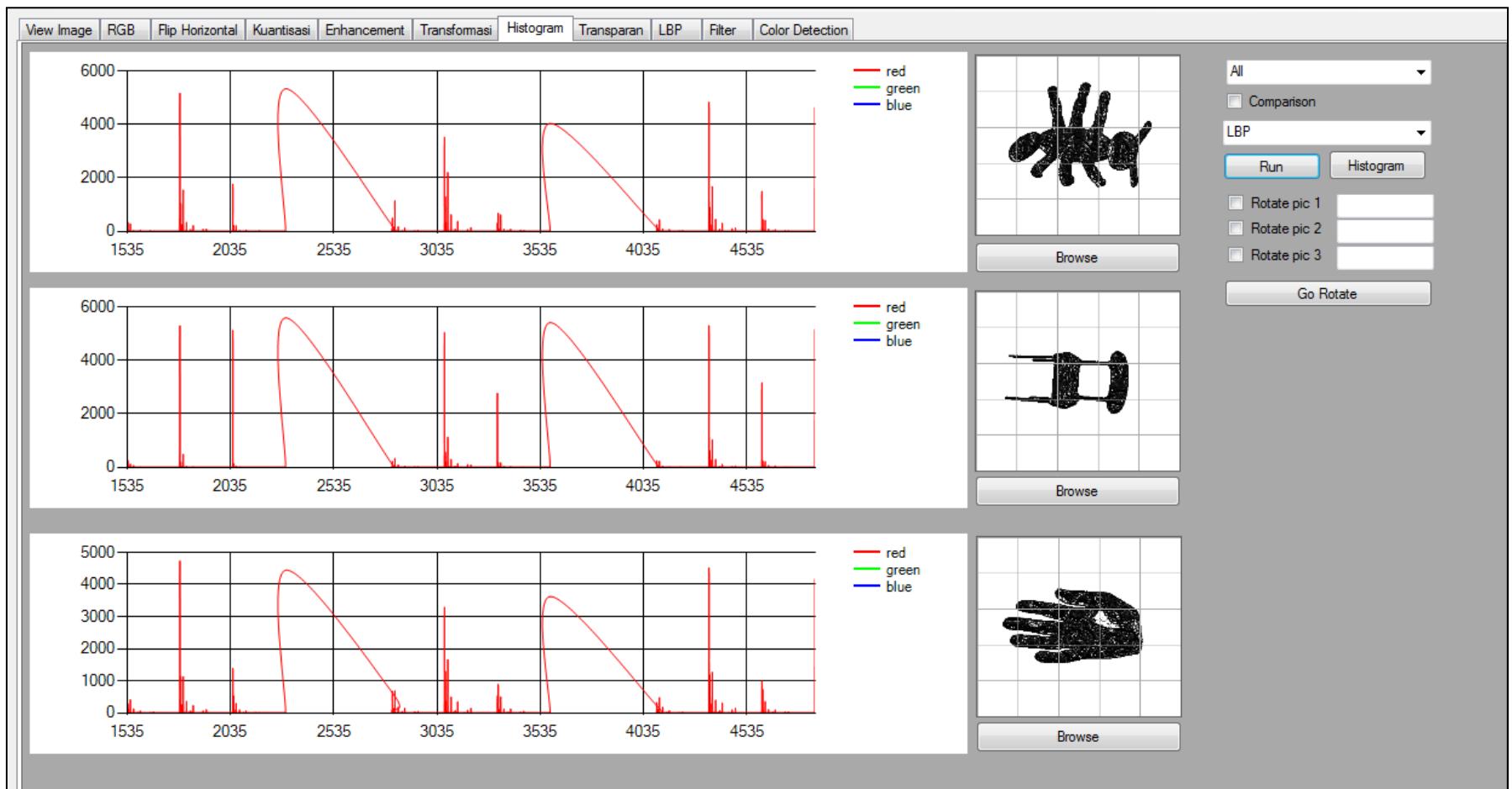
# LBP type-1



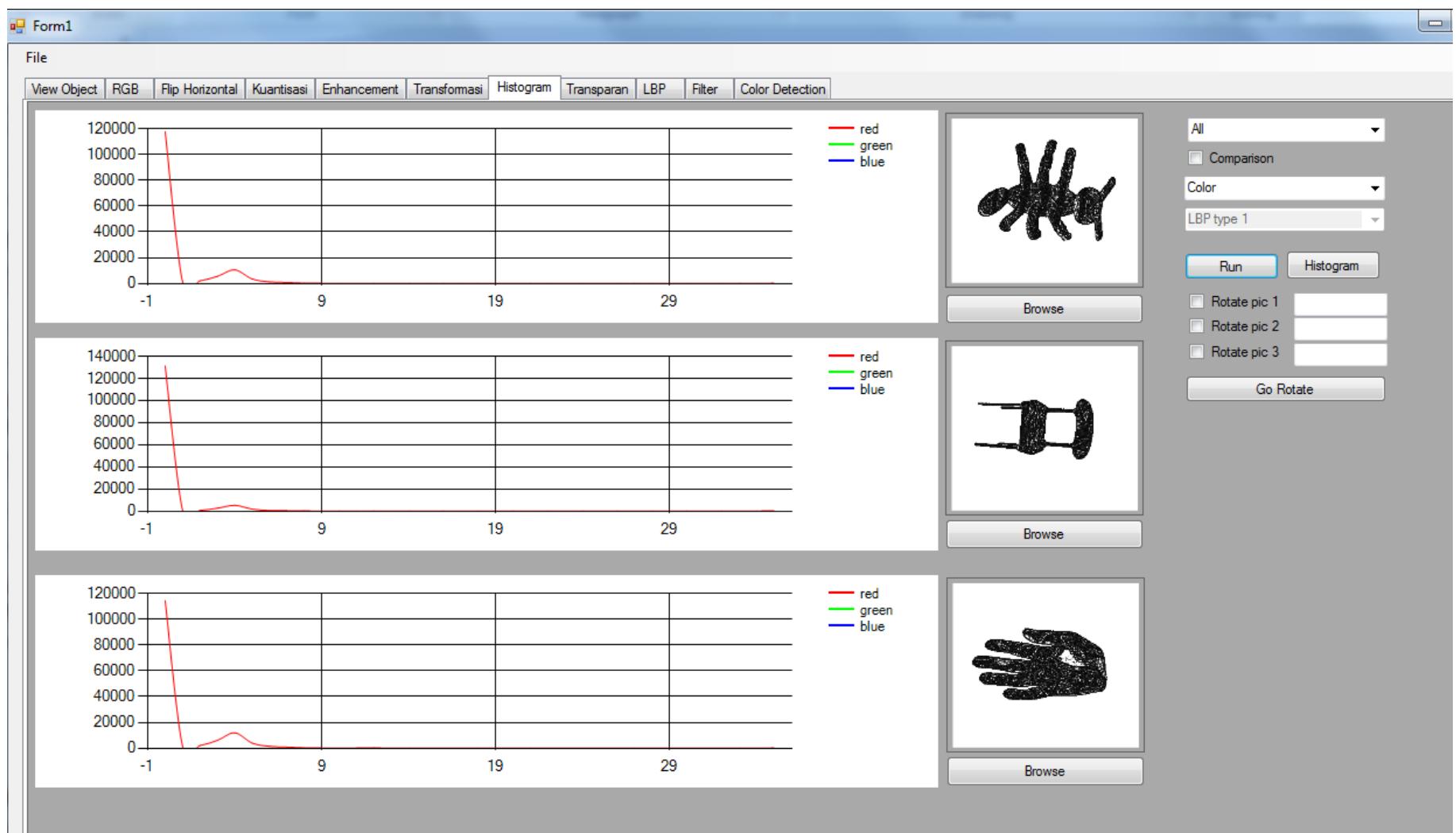
# LBP type-1



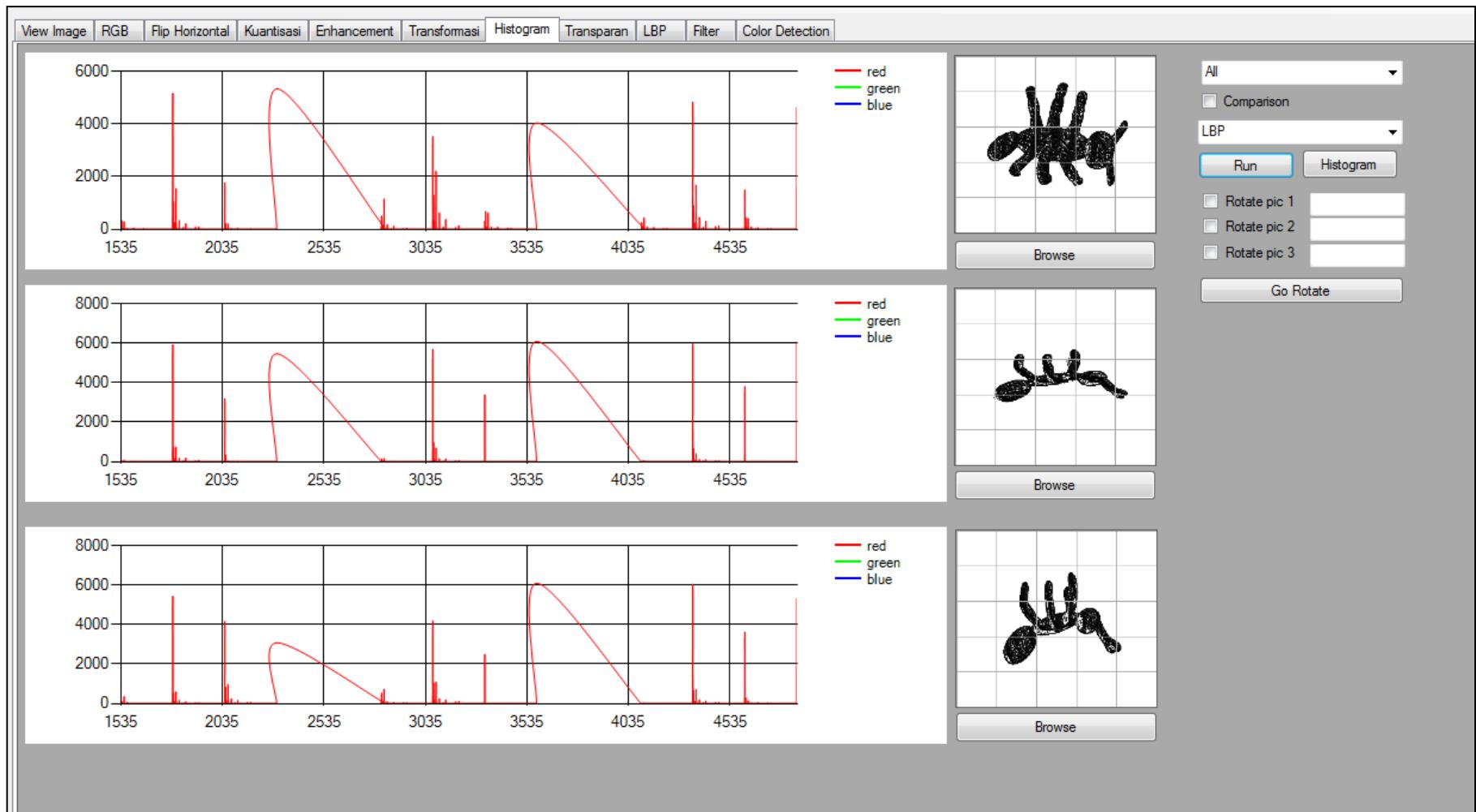
# LBP type-1



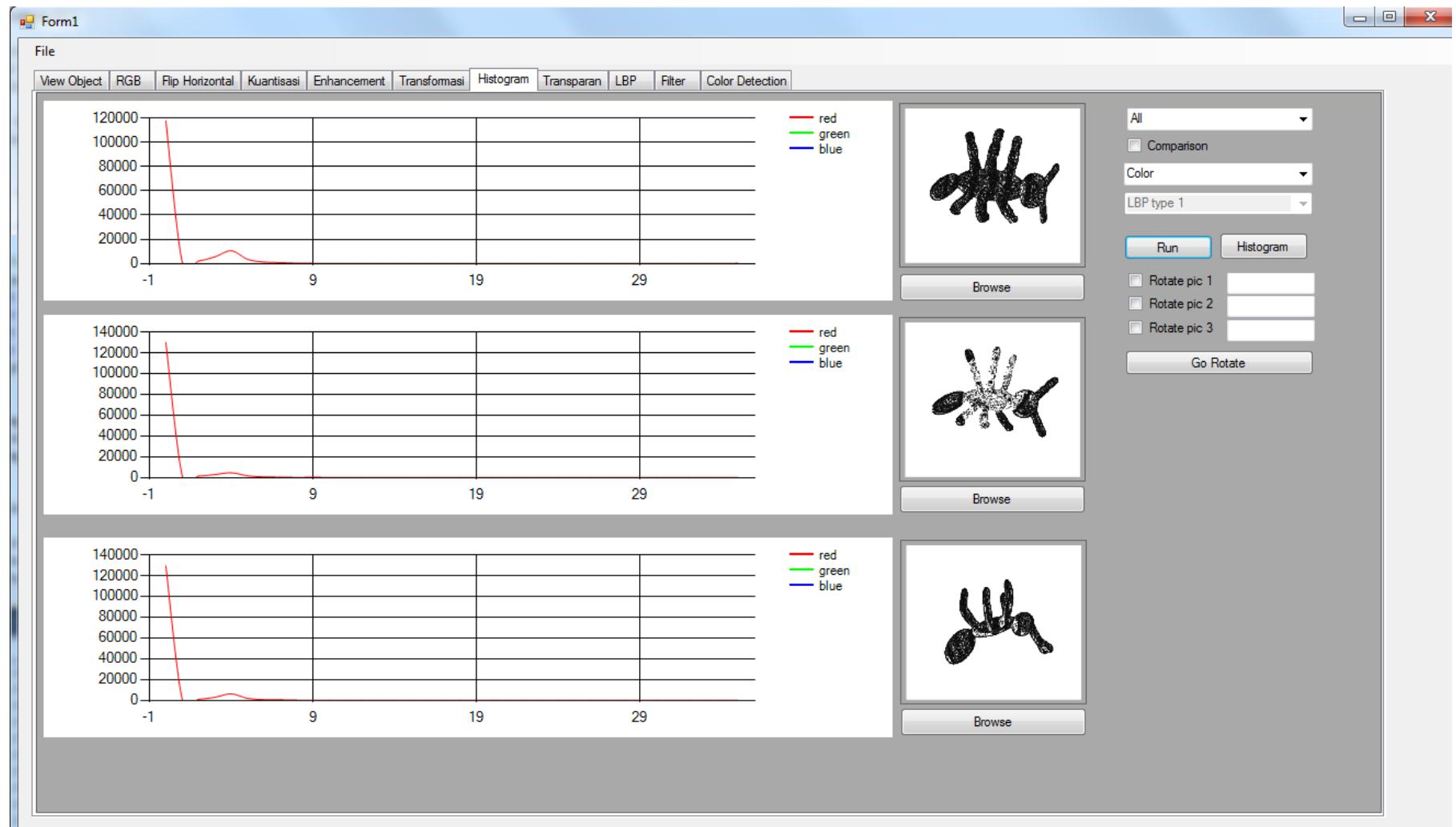
# LBP type-2

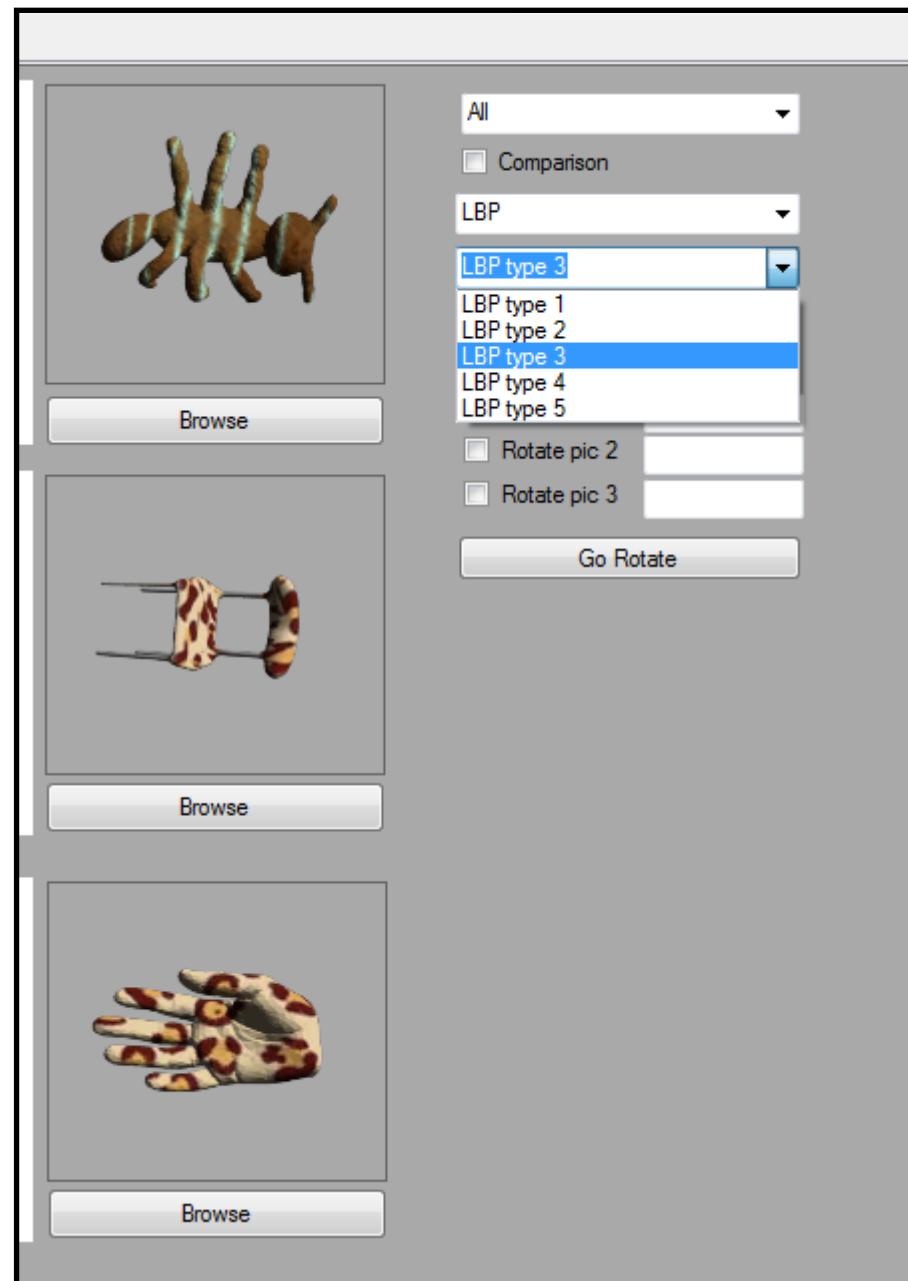
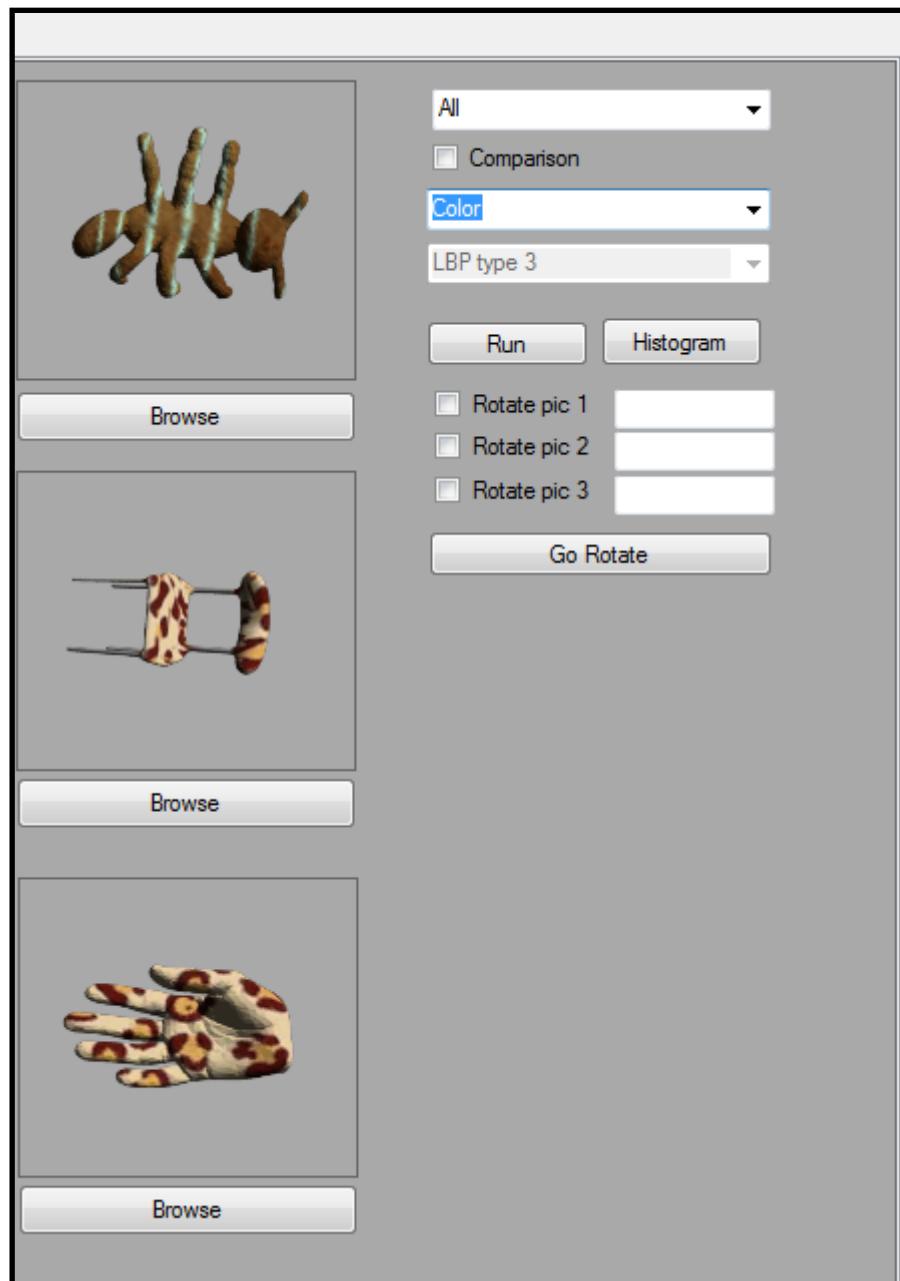


# LBP type-1



# LBP type-2





End