# CS517 Digital Image Processing Assignment 4

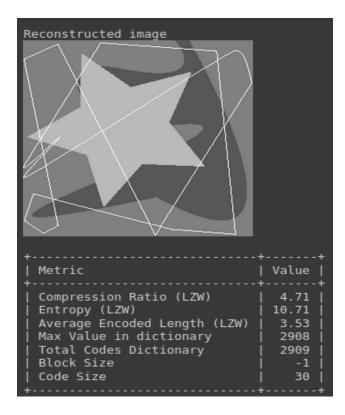
LZW Compression

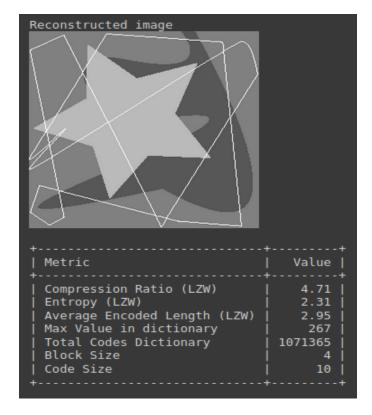
**Submitted to: Dr. Puneet Goyal** 

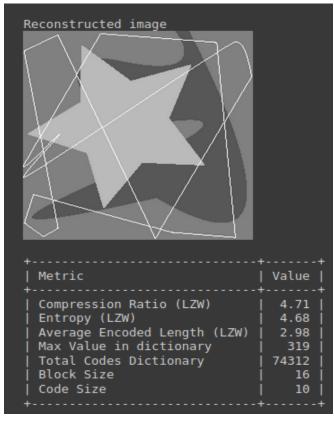
Submitted by: Jadhav Abhilasha S (2022CSM1001)

# **LZW Compression Analysis:**

#### Image: Fig81a.tif







All the formed images are reconstructed images of the original images. I have changed the block size and given different dictionary sizes to show that the LZW compression is lossless. From the matrices we can observe that increasing the block size will increase the number of encoded data hence we need a larger dictionary to store encoded data of a particular block.

## Image: Fig81b.tif

Reconstructed image	
Metric	++   Value
Compression Ratio (LZW)   Entropy (LZW)   Average Encoded Length (LZW)   Max Value in dictionary   Total Codes Dictionary   Block Size   Code Size	0.55     0.04     3.0     511     512     -1     9

Reconstructed image	
Metric	Value
Compression Ratio (LZW)   Entropy (LZW)	0.32
Average Encoded Length (LZW)   Max Value in dictionary	3.99
Total Codes Dictionary   Block Size	1024
Code Size	10

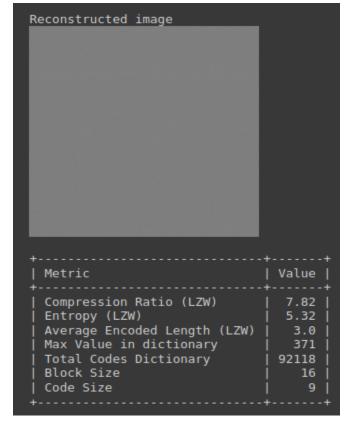
Reconstructed image	
+	++   Value   ++
Compression Ratio (LZW)   Entropy (LZW)	0.07     12.44
Average Encoded Length (LZW)   Max Value in dictionary	3.82   6142
Total Codes Dictionary   Block Size	6143     -1
Code Size	13   ++

In these images I have used the block size as the image size and varied to code size to plot the reconstructed image. We can observe that when the block size is exactly equal to the image size then code size must so that the encoding done will be lossless. We can see in the figure 3 that for the code size 13 the image obtained is lossless.

## Image: Fig81c.tif

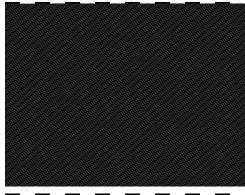
Reconstructed image	
+	<b>4</b>
Metric	Value
+	+
Compression Ratio (LZW)	7.82
Entropy (LZW)	2.67
Average Encoded Length (LZW)	3.0
Max Value in dictionary   Total Codes Dictionary	270     1092735
Block Size	1092/35
Code Size	
+	++

Reconstructed image	++
Metric	Value
Compression Ratio (LZW)   Entropy (LZW)   Average Encoded Length (LZW)   Max Value in dictionary   Total Codes Dictionary   Block Size   Code Size	7.82   3.95   3.0   297   296778   8   9

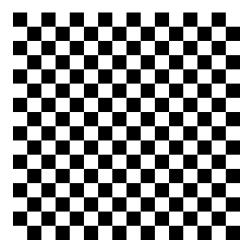


For the input image, using any block size makes no difference as we can generate the image each time with 0 RMSE.

# Image: Checkerboard.tif



		 _	



+	++   Value
Compression Ratio (LZW)   Entropy (LZW)   Average Encoded Length (LZW)   Max Value in dictionary   Total Codes Dictionary   Block Size   Code Size	1.15     0.0     3.0     511     512     -1     9

+	++
Metric	Value
+	++
Compression Ratio (LZW)	4.31
Entropy (LZW)	0.07
Average Encoded Length (LZW)	4.0
Max Value in dictionary	4095
Total Codes Dictionary	4096
Block Size	-1
Code Size	12
+	++

+	++
Metric	Value
+	++
Compression Ratio (LZW)	59.28
Entropy (LZW)	13.58
Average Encoded Length (LZW)	4.14
Max Value in dictionary	12672
Total Codes Dictionary	12673
Block Size	-1
Code Size	15
+	++

This image clearly shows how important it is to have a dictionary whose size can incorporate entire image pixel values. It is clearly visible as the size of the dictionary is increased, the image is generated and at last generated completely.

## Image :lena.tif



+	++
Metric	Value
	++
Compression Ratio (LZW)	3.36
Entropy (LZW)	10.46
Average Encoded Length (LZW)	3.27
Max Value in dictionary	10916
Total Codes Dictionary	152995
Block Size	128
Code Size	15

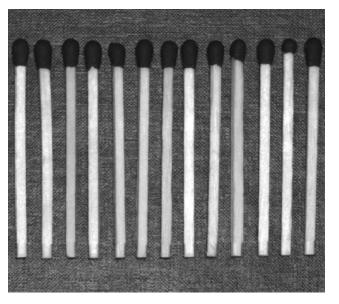
+	++   Value
Compression Ratio (LZW)   Entropy (LZW)   Average Encoded Length (LZW)   Max Value in dictionary   Total Codes Dictionary   Block Size   Code Size	3.36   8.83   2.95   3562   186128   64

+    Metric	Value
Compression Ratio (LZW)   Entropy (LZW)   Average Encoded Length (LZW)   Max Value in dictionary   Total Codes Dictionary   Block Size   Code Size	3.36   5.91   2.65   511   475819   16   9

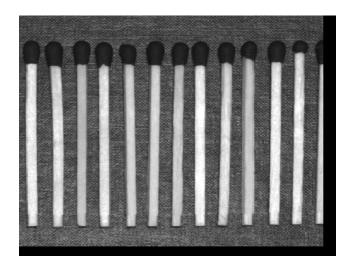
+	++
Metric	Value
+	++
Compression Ratio (LZW)	3.36
Entropy (LZW)	3.27
Average Encoded Length (LZW)	2.59
Max Value in dictionary	271
Total Codes Dictionary	4442054
Block Size	4
Code Size	19
+	++

For the mentioned block size and code size, the reconstructed image is shown above. The reconstructed image formed is lossless for these sets of values. We can clearly observe that the maximum value present in the dictionary depends on the code size.(Directly proportional)

## Image:matches-aligned.tif



+	++
Metric	Value
+	++
Compression Ratio (LZW)   Entropy (LZW)   Average Encoded Length (LZW)   Max Value in dictionary   Total Codes Dictionary   Block Size   Code Size	2.2     5.02     2.44     319     1775418     8     9

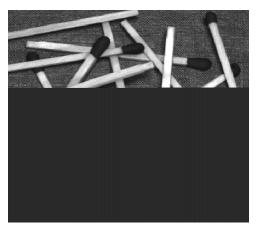


+	++
Metric	Value
Compression Ratio (LZW)   Entropy (LZW)   Average Encoded Length (LZW)   Max Value in dictionary   Total Codes Dictionary   Block Size   Code Size	2.4   7.34   2.52   1166   360241   32   19

When the block size is 8 there is no padding since the image can be perfectly divided into a set of blocks of 8, therefore the formed image has no zero padded values. In cases when the image size is not divisible, zeros are padded to reconstruct the image. In the second case when the block size is 32 and the code size is 19, their is noise in the image due to smaller code size.

# Image: Matches-random.tif







Metric	Value
Compression Ratio (LZW)   Entropy (LZW)   Average Encoded Length (LZW)   Max Value in dictionary   Total Codes Dictionary   Block Size   Code Size	10.65   1.02   3.98   32767   32768   -1

Metric	Value
Compression Ratio (LZW)   Entropy (LZW)	3.86     3.86     4.44
Average Encoded Length (LZW)   Max Value in dictionary	4.7     65535
Total Codes Dictionary   Block Size	65536
Code Size	16

+	++
Metric	Value
Compression Ratio (LZW)   Entropy (LZW)   Average Encoded Length (LZW)   Max Value in dictionary   Total Codes Dictionary   Block Size   Code Size	++   2.05     14.12     4.28     162841     162842     -1     18   ++

The size of the dictionary mattered a lot in this image reconstruction as well. Exponential increase in the dictionary size made it feasible for the image to be generated nicely in the end.

## Image: fingerprint.tif







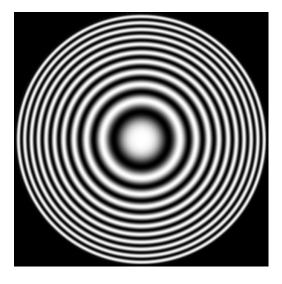
Metric	Value
Compression Ratio (LZW)	2.76
Entropy (LZW)	108.06
Average Encoded Length (LZW)	33.99
Max Value in dictionary	23953
Total Codes Dictionary	202372
Block Size	256
Code Size	2000

Metric	Value
Compression Ratio (LZW)	2.37
Entropy (LZW)	438.13
Average Encoded Length (LZW)	140.97
Max Value in dictionary	7409
Total Codes Dictionary	286662
Block Size	128
Code Size	100

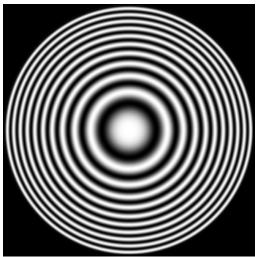
++
Compression Ratio (LZW)   2.17   Entropy (LZW)   143189.21   Average Encoded Length (LZW)   129538.61   Max Value in dictionary   268   Total Codes Dictionary   12767755   Block Size   4   Code Size   200

The image size in this case was a bit different than the others and needed padding as can be seen from the above image samples. I had to pad the images with 0 that is the reason the black patches are visible along the ends of rows and columns. The size of dictionary mattered a lot as already mentioned in previous observations as well.

## Image: zoneplate.tif



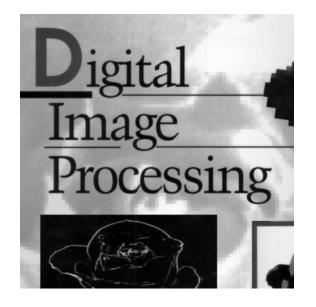
Compression Ratio (LZW)   3.68   Entropy (LZW)   9096.6   Average Encoded Length (LZW)   3578.39   Max Value in dictionary   507   Total Codes Dictionary   603073   Block Size   16   Code Size   100	Metric	Value
	Entropy (LZW)   Average Encoded Length (LZW)   Max Value in dictionary   Total Codes Dictionary   Block Size	9096.6 3578.39 507 603073



Metric	+ Value
Compression Ratio (LZW)   Entropy (LZW)   Average Encoded Length (LZW)   Max Value in dictionary   Total Codes Dictionary   Block Size   Code Size	3.68   9096.6   3578.39   507   603073   16   9

Even when the code size has such a massive difference, the image generation had no issues whatsoever and the reconstruction was perfect.

## Image:bookcover.tif



Metric	Value
Compression Ratio (LZW)   Entropy (LZW)   Average Encoded Length (LZW)   Max Value in dictionary   Total Codes Dictionary   Block Size   Code Size	4.42     88917.87     79433.89     271     7942532     4

Metric	Value   ++
Compression Ratio (LZW)	4.42
Entropy (LZW)	33287.36
Average Encoded Length (LZW)	20247.06
Max Value in dictionary	319
Total Codes Dictionary	2221791
Block Size	8
Code Size	9

Metric	Value
Compression Ratio (LZW)   Entropy (LZW)   Average Encoded Length (LZW)   Max Value in dictionary   Total Codes Dictionary   Block Size   Code Size	4.42 11194.62 5155.4 502 760388 16

For this image i have kept the code size to be constant i.e 9 and observed that the image reconstructed is same as that of the original image. But this case is not true for any block size, as number of encodings in a dictionary can be only 512 so we need a block size such that there are

maximum 512 encodings possible(in case of code size = 9). Distortions might come for block size greater than 16.