

## Lossless and Lossy Compression

There are two kinds of compression method; lossless and lossy compression. Both methods save storage space but have different results.

The term “lossless” means that the compressed file can be reconstructed to match the original, while the latter “lossy” means that there is some loss of information in the reconstructed image, where the loss of small amounts of data does not reduce the perceived overall quality of the output naturally.

There are many kinds of lossless compression technique such as Huffman coding, Arithmetic coding, Run Length Encoding (RLE), and Welsh (LZW) coding. Each one of these techniques is useful for both image and data compression. Also, There are many kinds of lossy compression technique, such as Vector Quantization, JPEG, MPEG. Each one of these techniques is useful for image compression, and is often based on the special transform such as Fourier transform, Fast Fourier Transform (FFT), Discrete Cosine transform (DCT), and Wavelet transform.

### Arithmetic Coding

Arithmetic coding is a variable-length source encoding technique. In traditional entropy encoding techniques such as Huffman coding, each input symbol in a message is substituted by a specific code specified by an integer number of bits.

Arithmetic coding deviates from this paradigm. In arithmetic coding, a sequence of input symbols is represented by an interval of real numbers between 0.0 and 1.0 (i.e a sequence of source symbols (or message) is assigned a single arithmetic code word. The code word itself defines an interval of real numbers between 0 and 1).

For example we consider a four symbol alphabet  $A=\{a,b,c,d\}$  with the fixed symbol probabilities  $p(a)=0.3$   $p(b)=0.2$   $p(c)=0.4$  and  $p(d)=0.1$  respectively. The symbol probabilities can be expressed in terms of partition of the half-open range  $[0.0, 1.0]$  as shown in the following table.

<u>Source symbol</u>	<u>Probability</u>	<u>Range (initial subinterval)</u>
<i>a</i>	0.3	0.0 – 0.3
<i>b</i>	0.2	0.3 – 0.5
<i>c</i>	0.4	0.5 – 0.9
<i>d</i>	0.1	0.9 – 1.0

*Probability model*

**Example:** Use arithmetic coding algorithm to encode CLASS

<u>Symbol</u>	<u>probability</u>	<u>range</u>
A	1/5 0.2	0.0 – 0.2
C	1/5 0.2	0.2 – 0.4
L	1/5 0.2	0.4 – 0.6
S	2/5 0.4	0.6 – 1.0

### Coding

	<u>New char</u>	<u>arithmetic code</u>
0.2	C	0.2
0.2	L	$0.4 * 0.2 + 0.2 = 0.28$
0.2	A	$0.0 * 0.2 * 0.2 + 0.28 = 0.28$
0.4	S	$0.6 * 0.2 * 0.2 * 0.2 + 0.28 = 0.2848$
0.4	S	$0.6 * 0.4 * 0.2 * 0.2 * 0.2 + 0.2848 = \mathbf{0.28672}$

### Decoding

C	0.28672	- 0.2	0.08672	÷ 0.2
L	0.4336	- 0.4	0.0336	÷ 0.2
A	0.168	- 0.0	0.168	÷ 0.2
S	0.84	- 0.6	0.24	÷ 0.4
S	0.6	- 0.6	0	

**Example: Use arithmetic encoding to encode "KING HENRY"**

<u>Symbol</u>	<u>Probability</u>	<u>Range</u>
Space	1/10 0.1	0.0-0.1
E	1/10 0.1	0.1-0.2
G	1/10 0.1	0.2-0.3
H	1/10 0.1	0.3-0.4
I	1/10 0.1	0.4-0.5
K	1/10 0.1	0.5-0.6
N	2/10 0.2	0.6-0.8
R	1/10 0.1	0.8-0.9
Y	1/10 0.1	0.9-1.0

### Coding

	<u>Newchar</u>	<u>Arithmetic code</u>
0.1	K	0.5
0.1	I	$0.4 * 0.1 + 0.5 = 0.54$
0.2	N	$0.6 * 0.1 * 0.1 + 0.54 = 0.546$
0.1	G	$0.2 * 0.2 * 0.1 * 0.1 + 0.546 = 0.5464$
0.1	Space	$0.0 * 0.1 * 0.2 * 0.1 * 0.1 + 0.5464 = 0.5464$
0.1	H	$0.3 * 0.1 * 0.1 * 0.2 * 0.1 * 0.1 + 0.5464 = 0.546406$
0.1	E	$0.1 * 0.1 * 0.1 * 0.1 * 0.2 * 0.1 * 0.1 + 0.546406 = 0.5464062$
0.2	N	$0.6 * 0.1 * 0.1 * 0.1 * 0.1 * 0.2 * 0.1 * 0.1 + 0.5464062 = 0.54640632$
0.1	R	$0.8 * 0.2 * 0.1 * 0.1 * 0.1 * 0.1 * 0.2 * 0.1 * 0.1 + 0.54640632 = 0.546406352$
0.1	Y	$0.9 * 0.1 * 0.2 * 0.1 * 0.1 * 0.1 * 0.1 * 0.2 * 0.1 * 0.1 + 0.546406352 = 0.5464063556$

### Decoding

K	0.5464063556	- 0.5	÷ 0.1
I	0.464063556	- 0.4	÷ 0.1
N	0.64063556	- 0.6	÷ 0.2
G	0.2031778	- 0.2	÷ 0.1
Space	0.031778	- 0.0	÷ 0.1
H	0.31778	- 0.3	÷ 0.1
E	0.1778	- 0.1	÷ 0.1
N	0.778	- 0.6	÷ 0.2
R	0.89	- 0.8	÷ 0.1
Y	0.9	- 0.9	0

### ***LZW Coding***

LZW coding is conceptually very simple. At the onset of the coding process, a codebook or "dictionary" containing the source symbols to be coded is constructed. For 8-bit monochrome images the first 256 words of the dictionary are assigned to the gray values 0, 1, 2, ..., 255. As the encoder sequentially examines the images pixels graylevel sequences that are not in the dictionary are placed in algorithmically determined (e.g. the next unused) locations. If the first two pixels of the image are white, for instance, sequence "255-255" might be assigned to location 256 the address following the locations reserved for graylevels 0 through 255 the next time that two consecutive white pixels are encountered, code word 256, the address of the location containing sequence 255-255 is used to represent them. If a 9-bit, 512 word dictionary is employed in the coding process, the original (8+8) bits that were used to represent the two pixels are replaced by a single 9-bit code word. Clearly, the size of the dictionary is an important system parameter. If it is too small, the detection of matching gray-level sequences will be less likely, if it is too large the size of the code words will adversely affect compression performance.

***Example:*** Consider the following 4\*4, 8-bit image (256 gray)

39	39	126	126
39	39	126	126
39	39	126	126
39	39	126	126

Explain details the steps involved in coding its 16 pixels.

<u>Dictionary Location</u>		<u>Entry</u>
0		0
1		1
.		.
.		.
.		.
255		255
256		-
.		.
.		.
.		.
511		-

A 512 word dictionary with the following starting content is assumed:

Location 256 through 511 are initially unused

The image is encoded by processing its pixels in a left to right, top to bottom manner. Each successive graylevel value is concatenated.

<u><i>Pixel being Processed</i></u>	<u><i>Encoded Output</i></u>	<u><i>Dictionary Location</i></u>	<u><i>Dictionary Entry</i></u>
39	-		
39	→ 39	256	39-39
126	→ 39	257	39-126
126	→ 126	258	126-126
126	→ 126	259	126-39
39 } 39 }	→ -		
126 } 126 }	→ 256	260	39-39-126
126 }	→ -		
39 } 39 }	→ 258	261	126-126-39
39 }	→ -		
126 }	→ -		
126 } 39 }	→ 260	262	39-39-126-126
39 }	→ -		
39 } 126 }	→ 259	263	126-39-39
126 }	→ -		
126 } 126 }	→ 257	264	39-126-126
126 }	→ 126		

**Example:** Use LZW algorithm to encode the following message " BET BE BEE BED BEG"

<u>Step</u>	<u>Char</u>	<u>Code output</u>	<u>New Code of Dictionary</u>
1	Space	-	already exist
2	B	Space	SpaceB 256
3	E	B	BE 257
4	T	E	ET 258
5	Space	T	TSpace 259
6	B	-	
7	E	SpaceB	SpaceBE 260
8	Space	E	ESpace 261
9	B	nothing	
10	E	nothing	
11	E	SpaceBE	SpaceBEE 262
12	Space	nothing	
13	B	ESpace	ESpaceB 263
14	E	nothing	BE already exist in table
15	D	BE	BED 264
16	Space	D	DSpace 265
17	B	nothing	SpaceB already exist
18	E	nothing	SpaceBE already exist
19	G	SpaceBE	SpaceBEG 266
20	End		