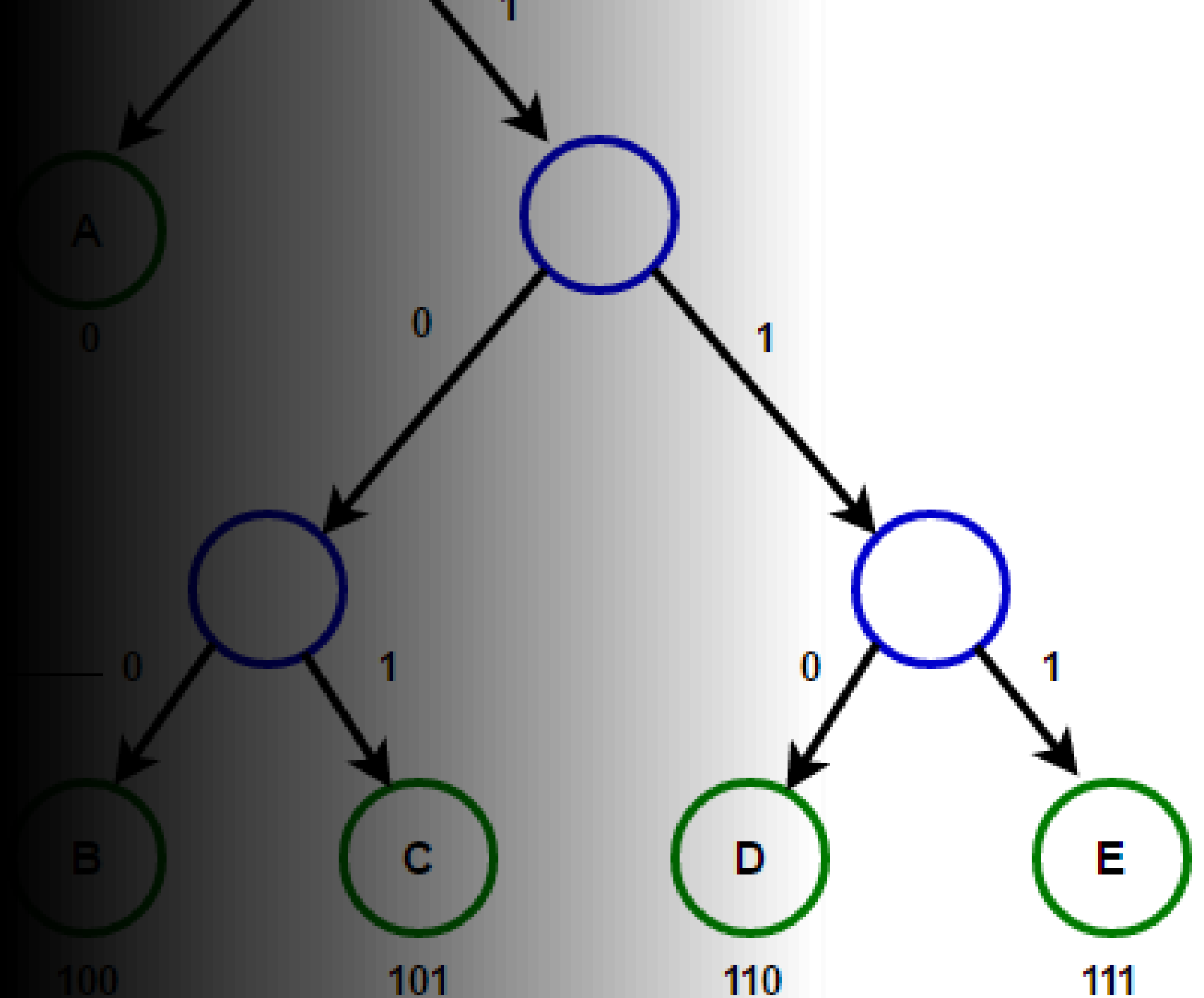


# Lecture 20

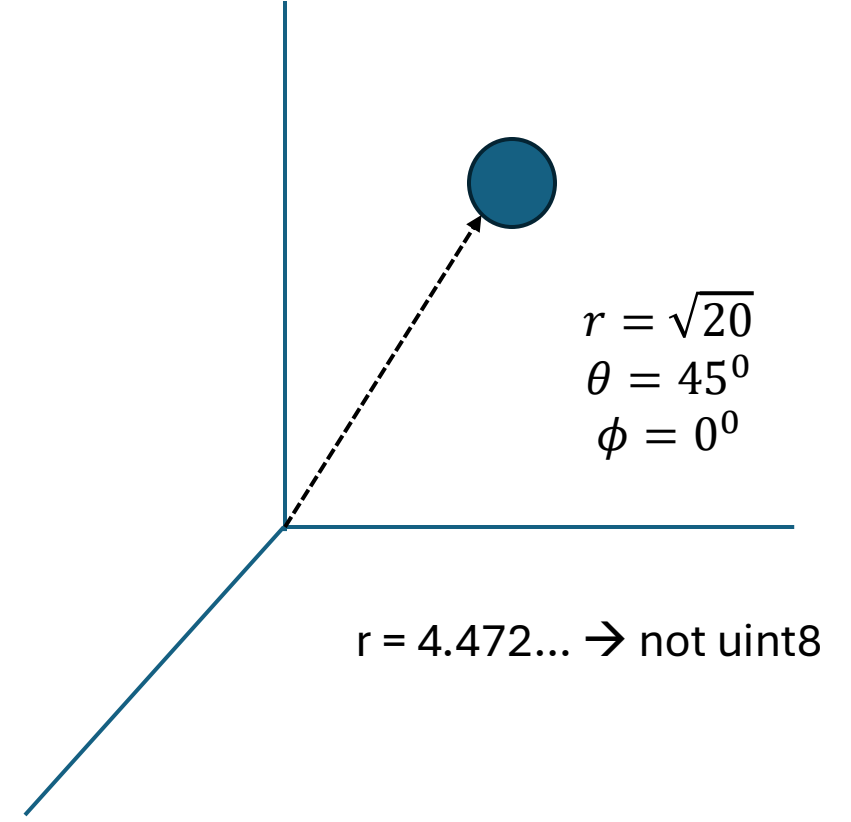
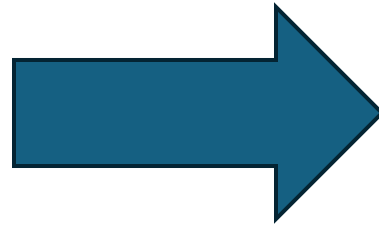
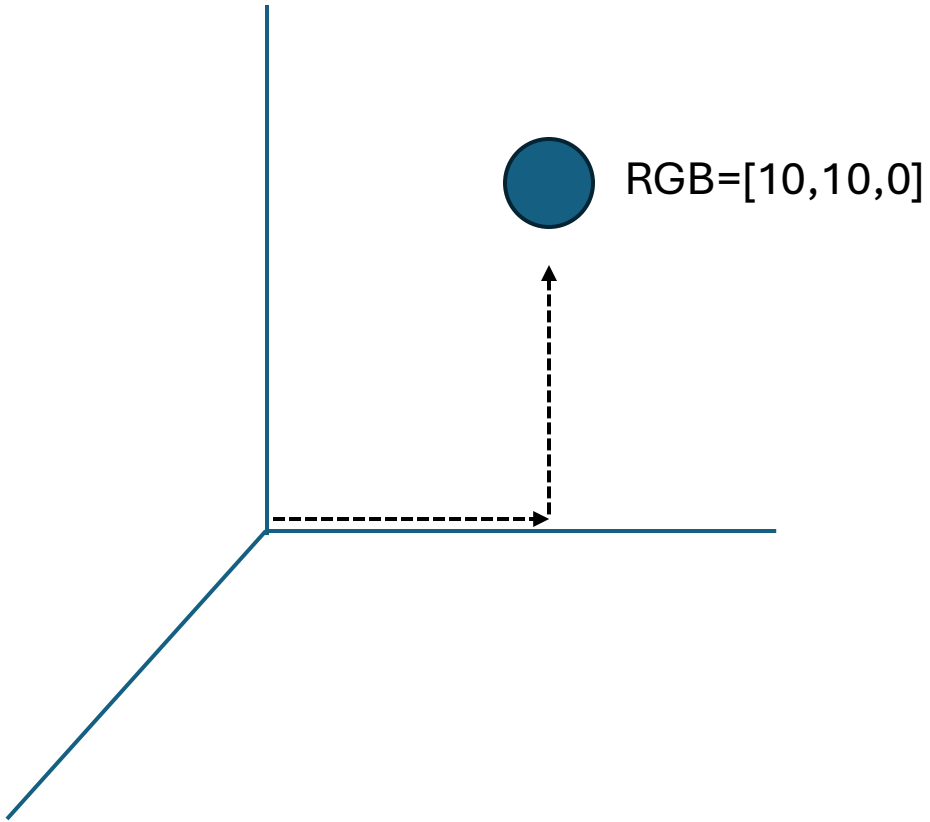
## Image Compression Methods

ECE 1390/2390



- Lossy (non-lossless). (Lecture 4)
  - DCT
  - Wavelet
  - Harnford-Walsh
  - Color space transform (Lecture 3)
- Lossless
  - Variable Length Coding (Huffman compression)

# Color space transforms are lossy



# (From Lecture 1)

- **Raster data formats**

- GIF (Lossy in color)
  - Uses specific color maps
- JPEG (Lossy in value)
  - Uses DCT → spasticity (followed by VLC compression)
- PNG (mostly lossless)
  - 24-bit color
  - Can be compressed with VLC (or similar)
  - Adds alpha channel
- TIFF (Lossless)
  - Versatile bit depth and color-depth
  - Can be compressed with VLC (or similar)

- **Vector data formats (lossless/scale invariant)**

- EPS
- SVG

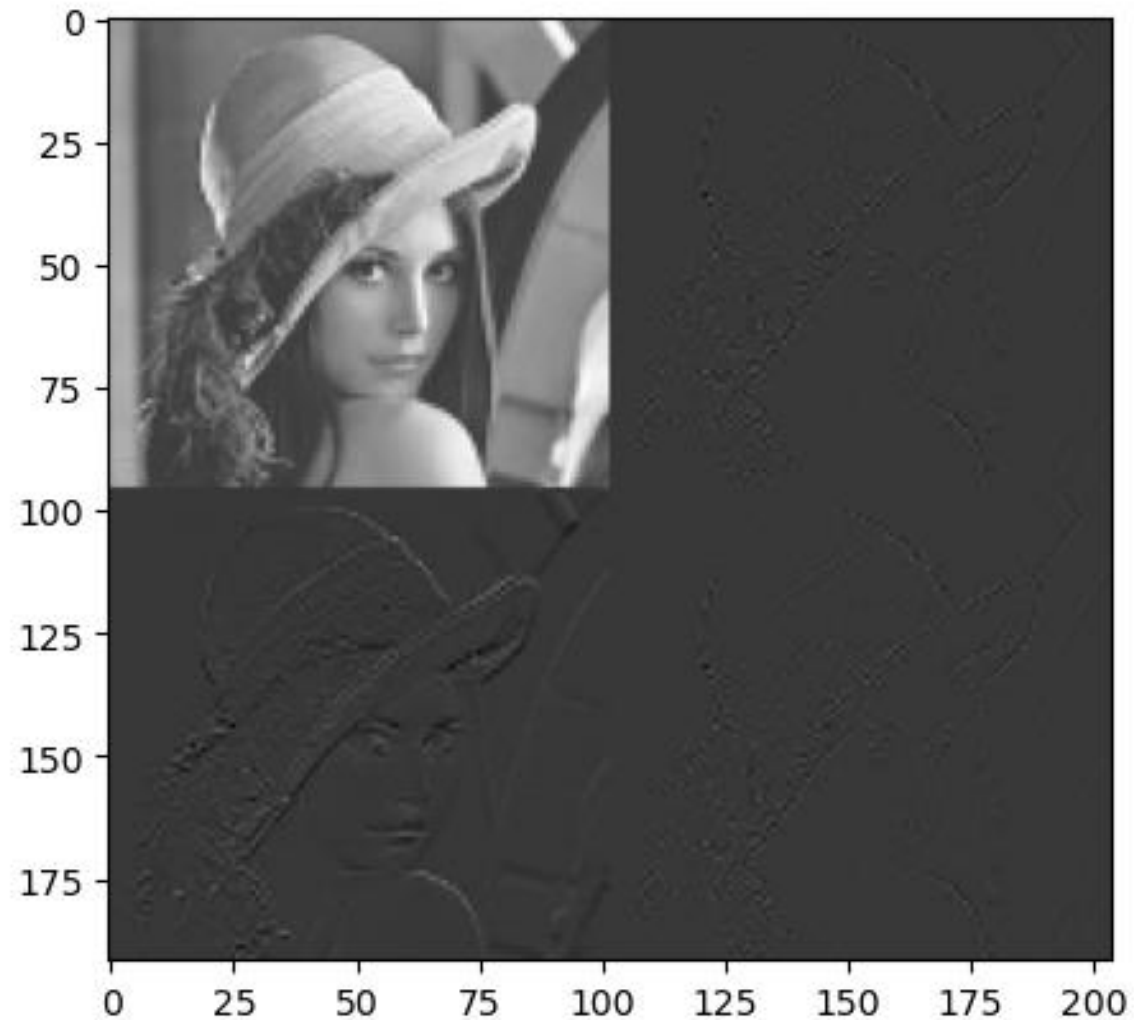
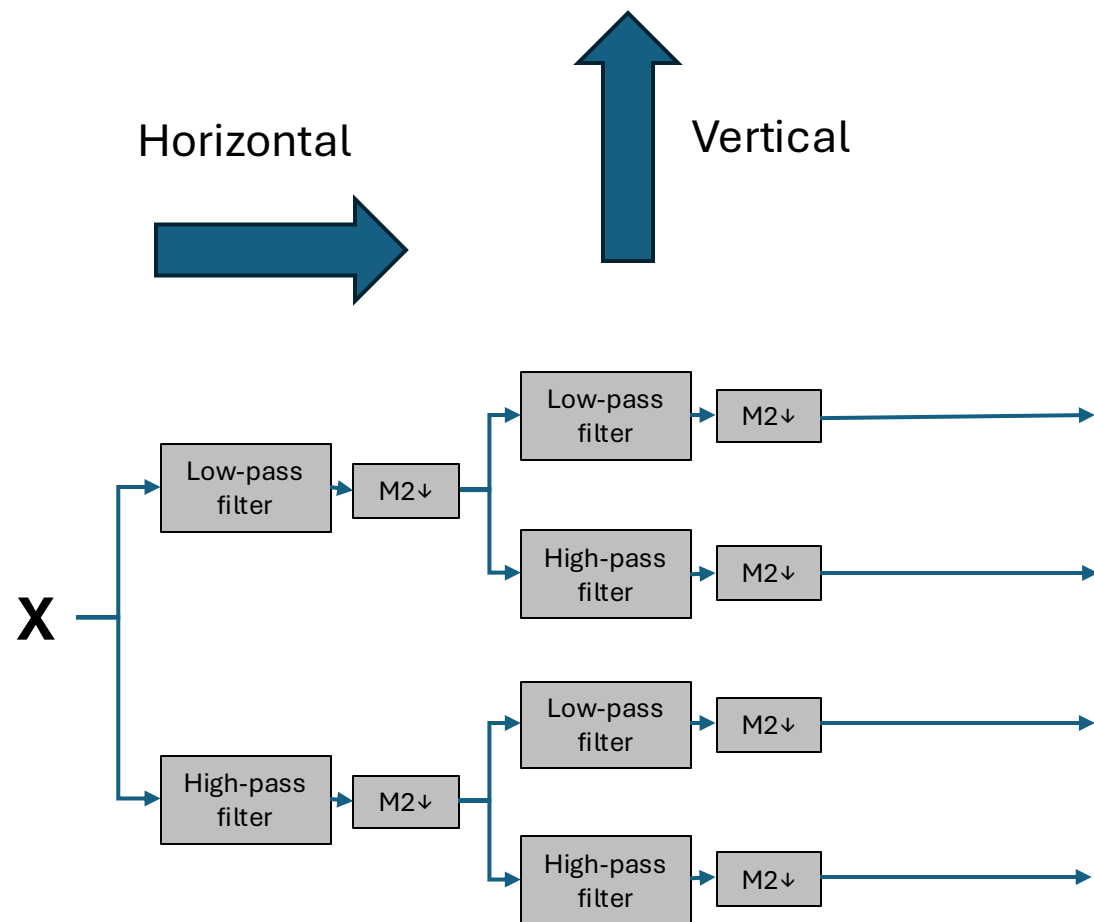


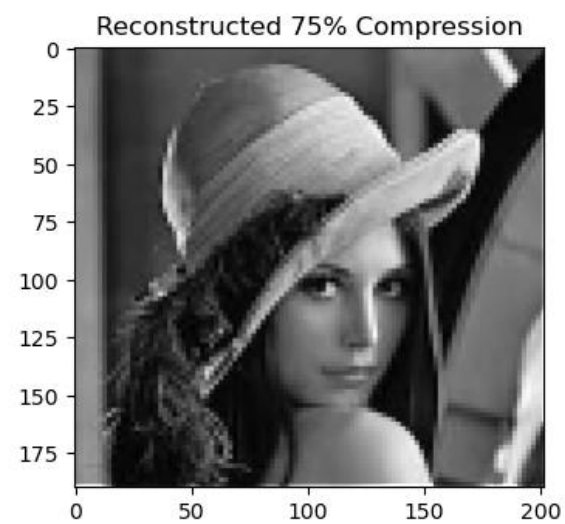
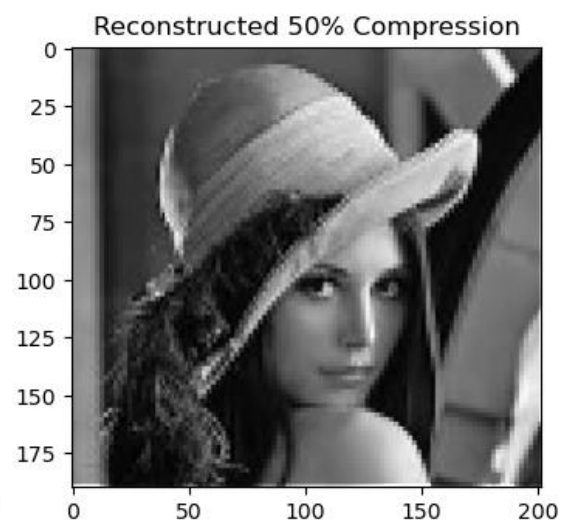
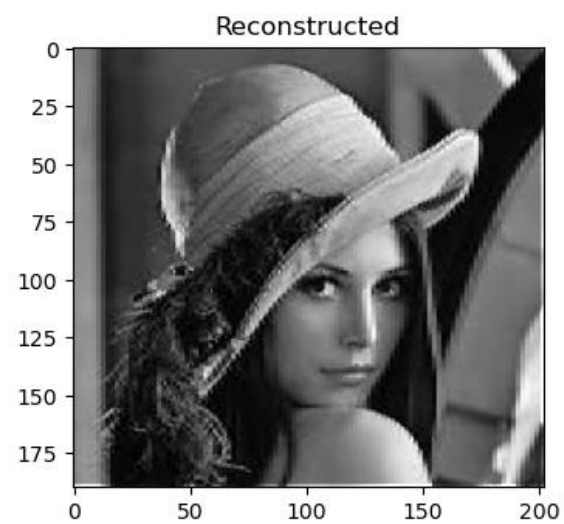
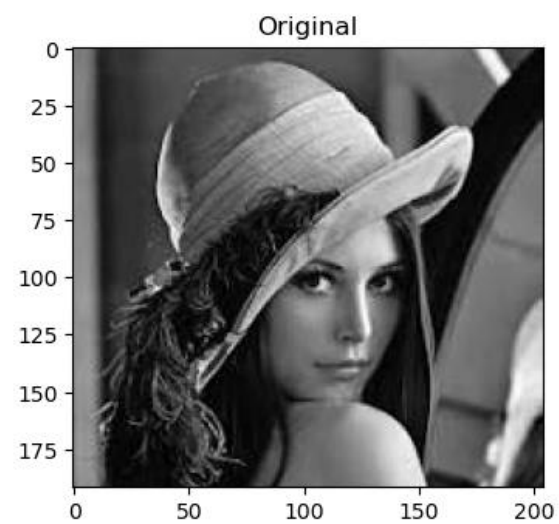
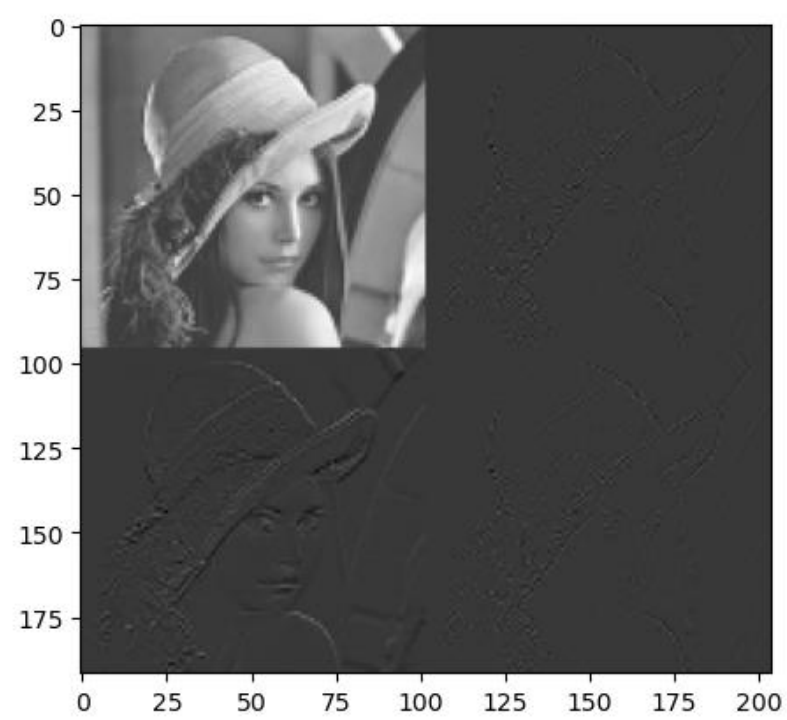
**Raster**  
GIF, JPEG, PNG



**Vector**  
SVG

# From Lecture 4





Original: 9 x uint8 values = 72 bits

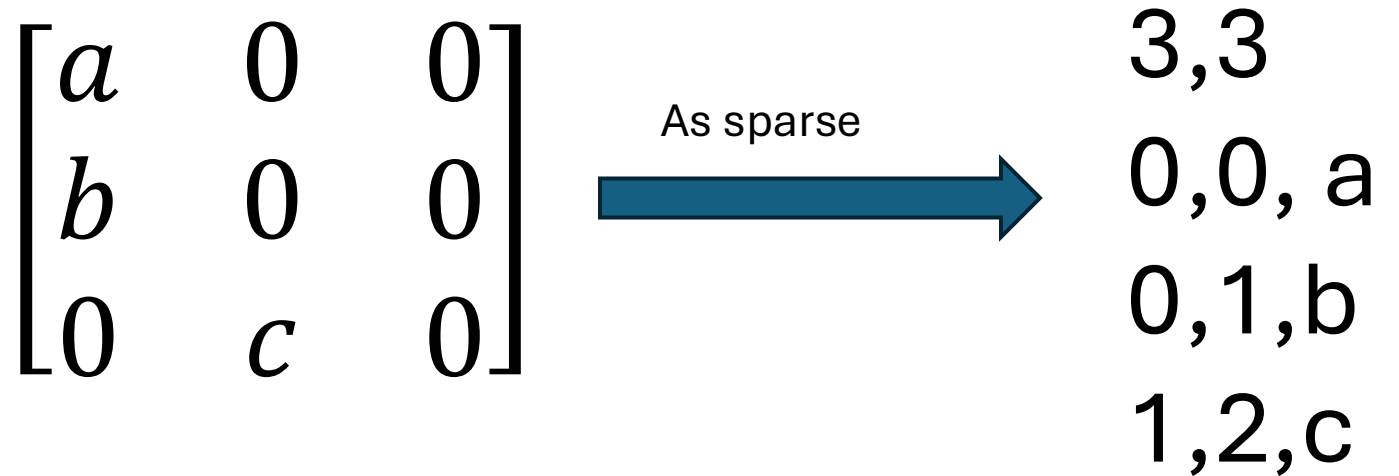
As sparse:

Dimensions [3,3] → 2 x uint8 values

3 non-zeros → 3 x 3 x uint8 values = 72 bits

-----

= 88 bits total



# Huffman Compression

## *Variable Length Coding (VLC)*

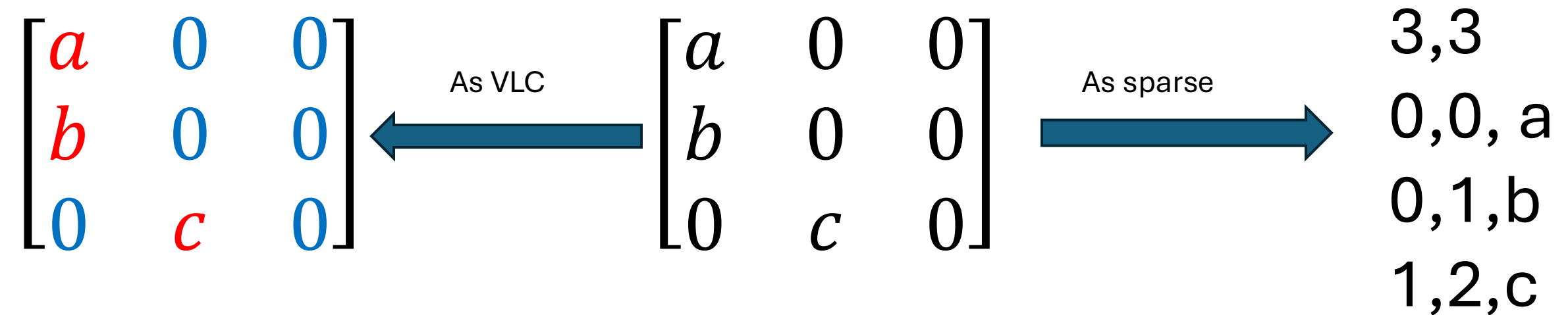
Store as 8-bit

Store as 1-bit

3 x 8bit + 6 x 1bit = 30 bits

9 x 8bit = 72 bits

11 x 8bit = 88 bits





# SWANSON\_SCHOOL\_OF\_ENGINEERING

O: 4

N: 4

S: 3

\_: 3

E: 3

G: 2

W: 1

A: 1

C: 1

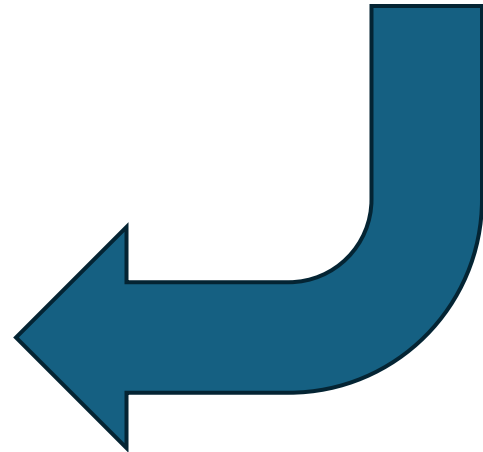
H: 1

L: 1

F: 1

I: 1

R: 1



O: 4  
N: 4  
S: 3  
\_: 3  
E: 3  
G: 2  
W: 1  
A: 1  
C: 1  
H: 1  
L: 1  
F: 1  
I: 1  
R: 1



O: 4  
N: 4  
S: 3  
\_: 3  
E: 3  
G: 2  
**IR: 2**  
W: 1  
A: 1  
C: 1  
H: 1  
L: 1  
F: 1



IR=2

I=1

R=1

O: 4  
N: 4  
S: 3  
\_: 3  
E: 3  
G: 2  
W: 1  
A: 1  
C: 1  
H: 1  
L: 1  
F: 1  
I: 1  
R: 1

O: 4  
N: 4  
S: 3  
\_: 3  
E: 3  
G: 2  
IR: 2  
W: 1  
A: 1  
C: 1  
H: 1  
L: 1  
F: 1



O: 4  
N: 4  
S: 3  
\_: 3  
E: 3  
G: 2  
IR: 2  
LF: 2  
CH: 2  
WA: 2

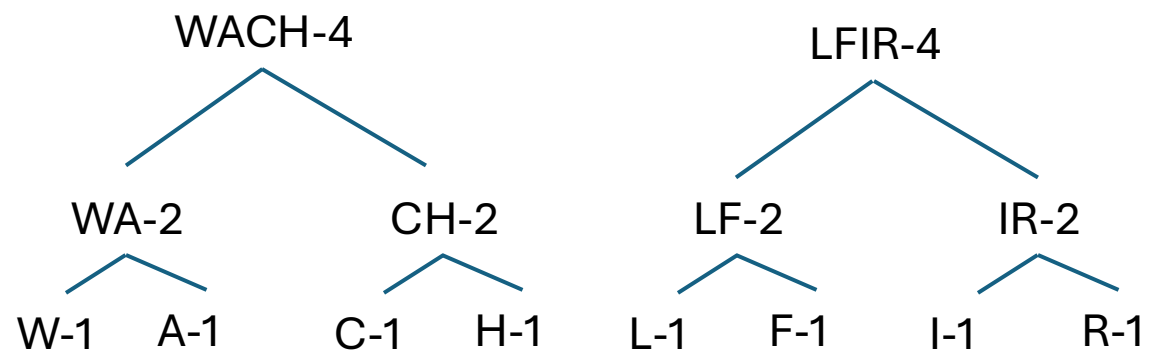
WA-2  
W-1 A-1

CH-2  
C-1 H-1

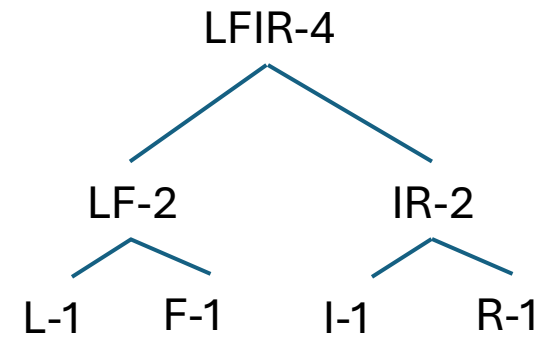
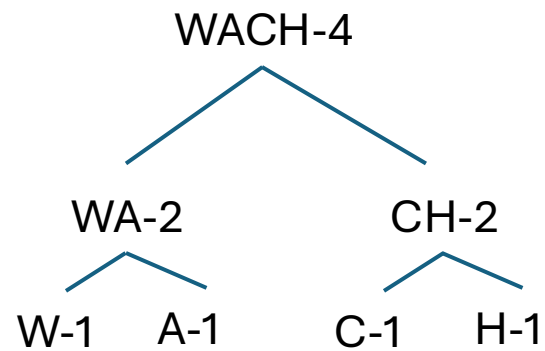
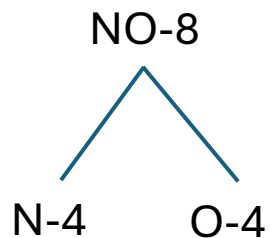
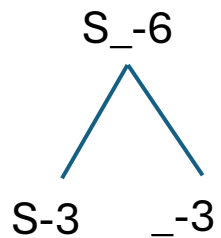
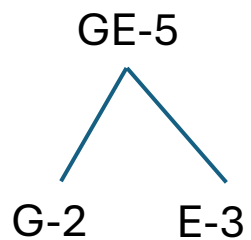
LF-2  
L-1 F-1

IR-2  
I-1 R-1

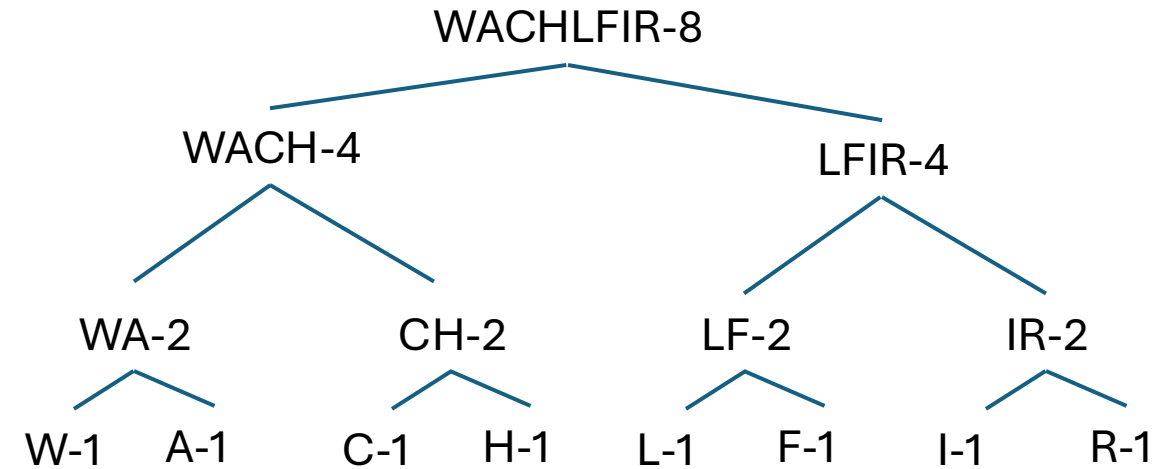
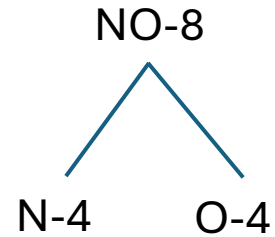
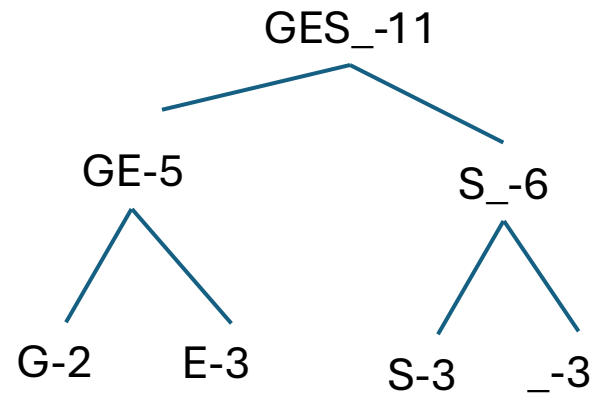
O: 4	O: 4	O: 4	O: 4
N: 4	N: 4	N: 4	N: 4
S: 3	S: 3	S: 3	S: 3
_: 3	_: 3	_: 3	_: 3
E: 3	E: 3	E: 3	E: 3
G: 2	G: 2	G: 2	G: 2
W: 1	IR: 2	IR: 2	WACH:4
A: 1	W: 1	LF: 2	LFIR: 4
C: 1	A: 1	CH: 2	
H: 1	C: 1	WA: 2	
L: 1	H: 1		
F: 1	L: 1		
I: 1	F: 1		
R: 1			



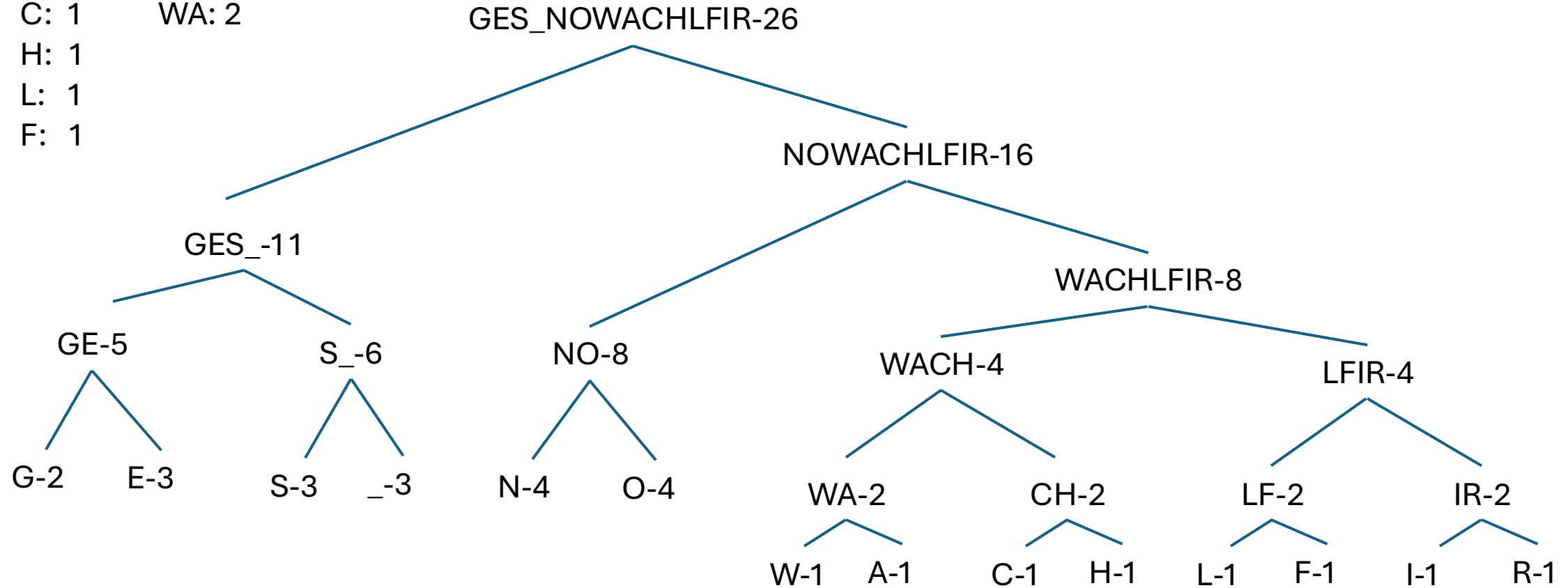
O: 4	O: 4	O: 4	O: 4	NO: 8
N: 4	N: 4	N: 4	N: 4	S_: 6
S: 3	S: 3	S: 3	S: 3	GE:5
_: 3	_: 3	_: 3	_: 3	WACH:4
E: 3	E: 3	E: 3	E: 3	LFIR: 4
G: 2	G: 2	G: 2	G: 2	
W: 1	IR: 2	IR: 2	WACH:4	
A: 1	W: 1	LF: 2	LFIR: 4	
C: 1	A: 1	CH: 2		
H: 1	C: 1	WA: 2		
L: 1	H: 1			
F: 1	L: 1			
I: 1	F: 1			
R: 1				

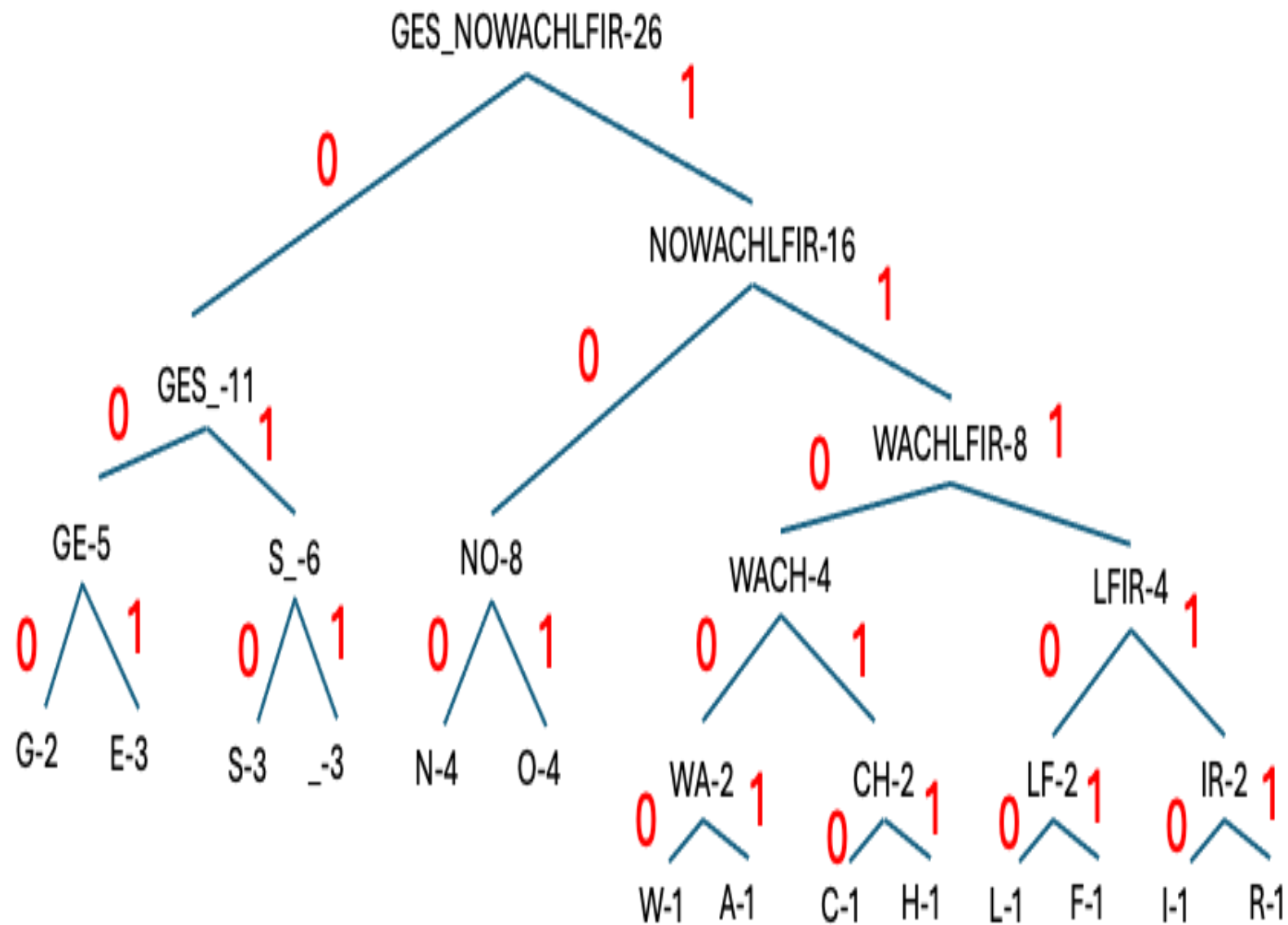


O: 4	O: 4	O: 4	O: 4	NO: 8	NO: 8	GES_: 11
N: 4	N: 4	N: 4	N: 4	S_: 6	WACHLFIR: 8	NO: 8
S: 3	S: 3	S: 3	S: 3	GE:5	S_: 6	WACHLFIR: 8
_: 3	_: 3	_: 3	_: 3	WACH:4	GE:5	
E: 3	E: 3	E: 3	E: 3	LFIR: 4		
G: 2	G: 2	G: 2	G: 2			
W: 1	IR: 2	IR: 2	WACH:4			
A: 1	W: 1	LF: 2	LFIR: 4			
C: 1	A: 1	CH: 2				
H: 1	C: 1	WA: 2				
L: 1	H: 1					
F: 1	L: 1					
I: 1	F: 1					
R: 1						



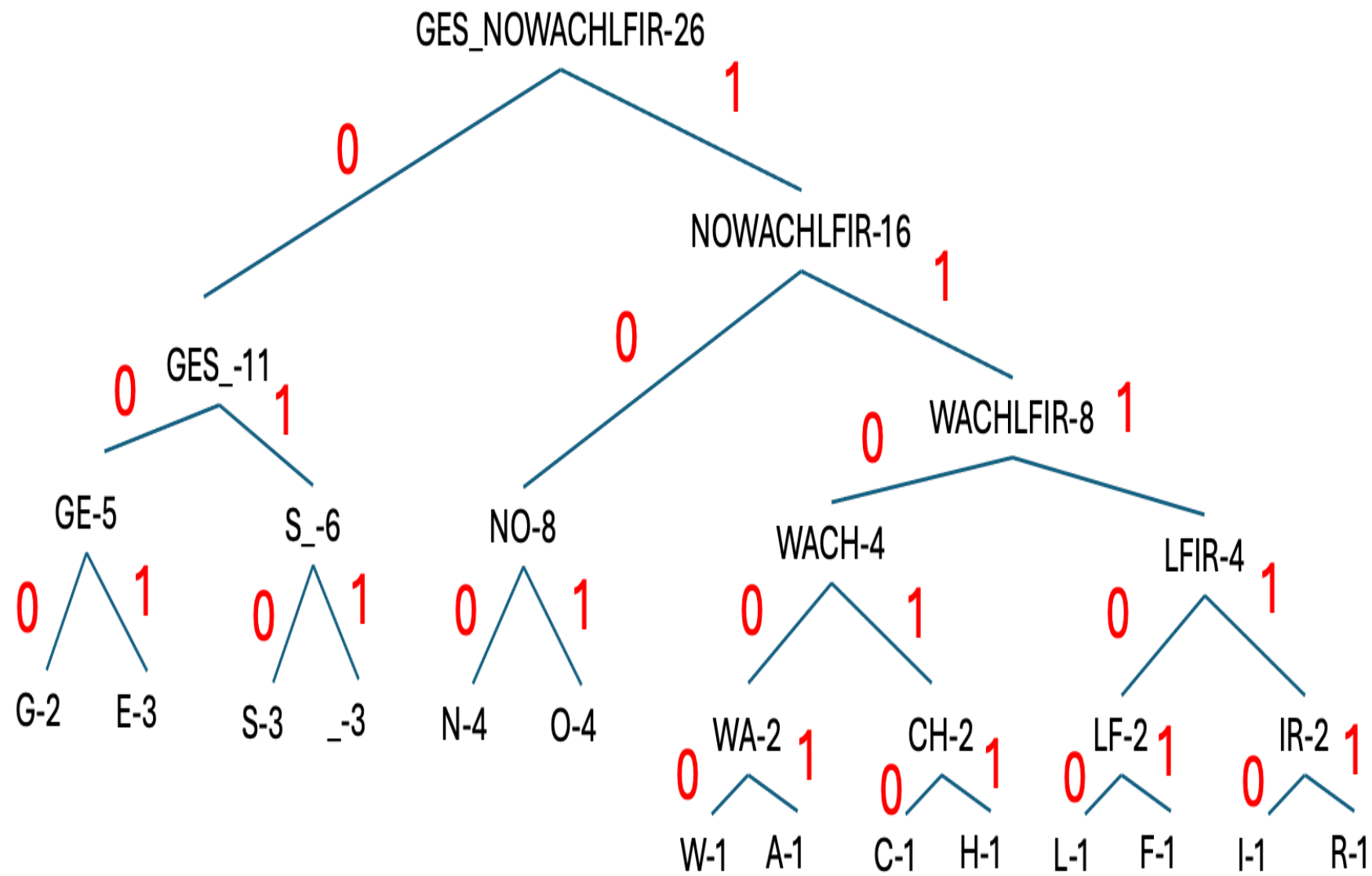
O: 4	O: 4	O: 4	O: 4	NO: 8	NO: 8	GES_: 11	NOWACHLFIR: 16
N: 4	N: 4	N: 4	N: 4	S_: 6	WACHLFIR: 8	NO: 8	GES_: 11
S: 3	S: 3	S: 3	S: 3	GE:5	S_: 6	WACHLFIR: 8	
_: 3	_: 3	_: 3	_: 3	WACH:4	GE:5		
E: 3	E: 3	E: 3	E: 3	LFIR: 4			
G: 2	G: 2	G: 2	G: 2				
W: 1	IR: 2	IR: 2	WACH:4				
A: 1	W: 1	LF: 2	LFIR: 4				
C: 1	A: 1	CH: 2					
H: 1	C: 1	WA: 2					
L: 1	H: 1						
F: 1	L: 1						
I: 1	F: 1						
R: 1							







G: 000  
E: 001  
S: 010  
\_: 011  
N: 100  
O: 101  
W: 11000  
A: 11001  
C: 11010  
H: 11011  
L: 11100  
F: 11101  
I: 11110  
R: 11111

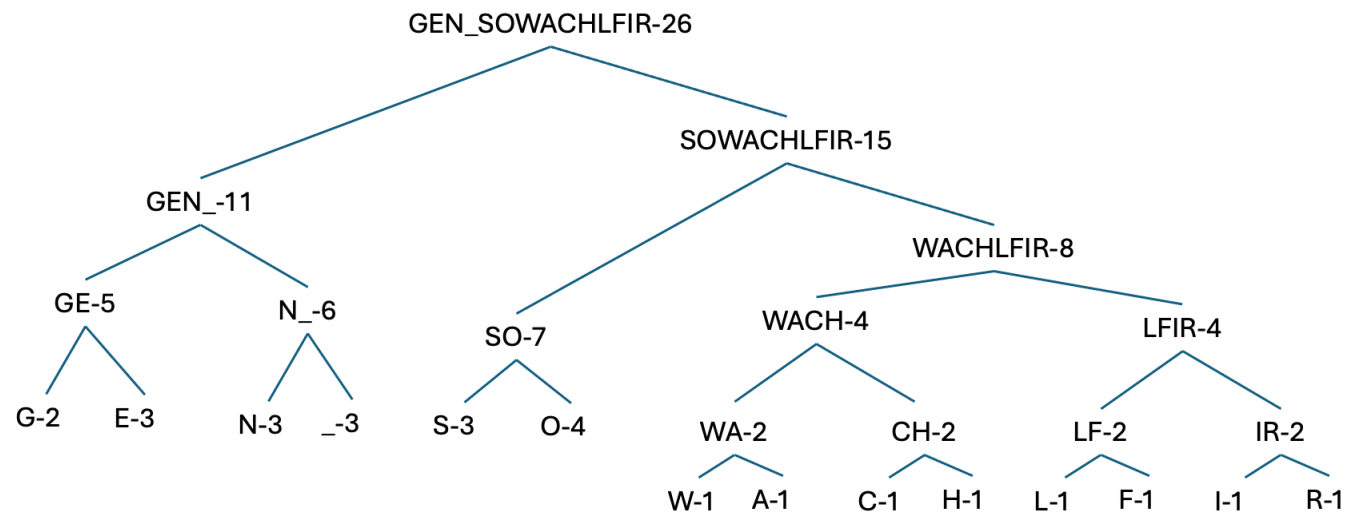


G: 000  
E: 001  
S: 010  
\_: 011  
N: 100  
O: 101  
W: 11000  
A: 11001  
C: 11010  
H: 11011  
L: 11100  
F: 11101  
I: 11110  
R: 11111

SWANSON\_SCHOOL\_OF\_ENGINEERING

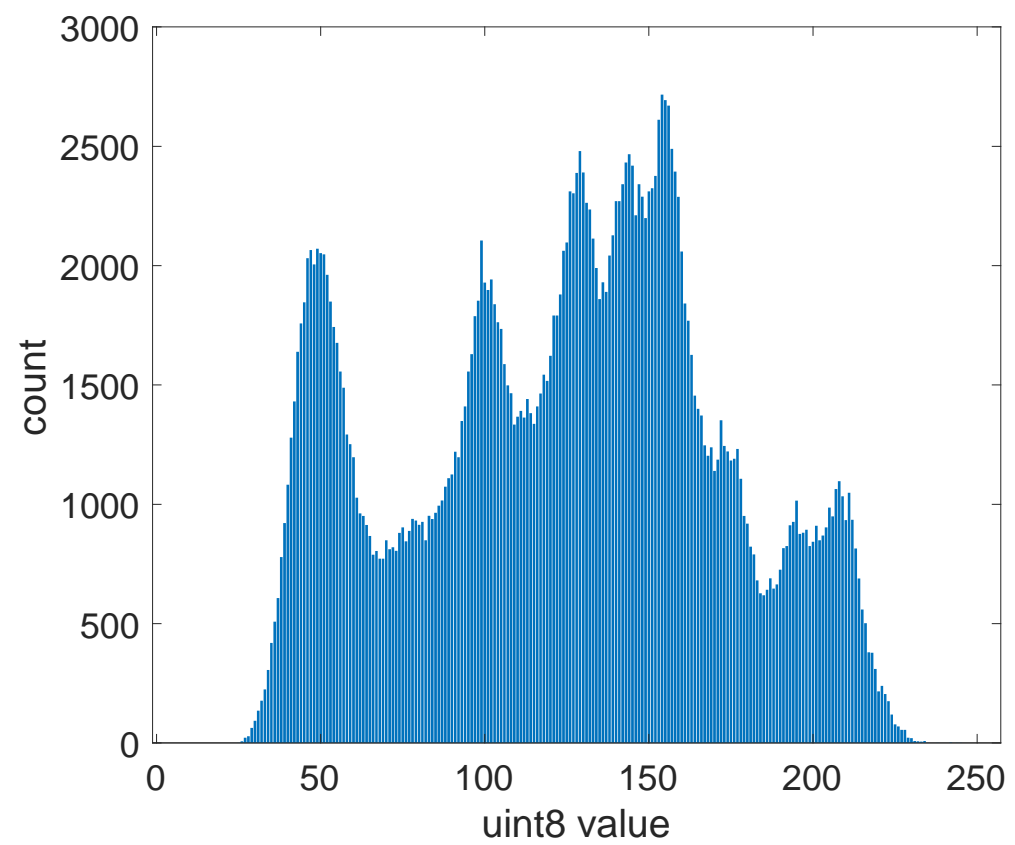
010 11000 11001 100 010 101 100 011 010 11010 11011 101 101 11100 011  
101 11101 011 001 100 11110 100 001 001 11111 11110 100 000  
=102 bits

(ASCII) 29char x 8 bits/char =232 bits



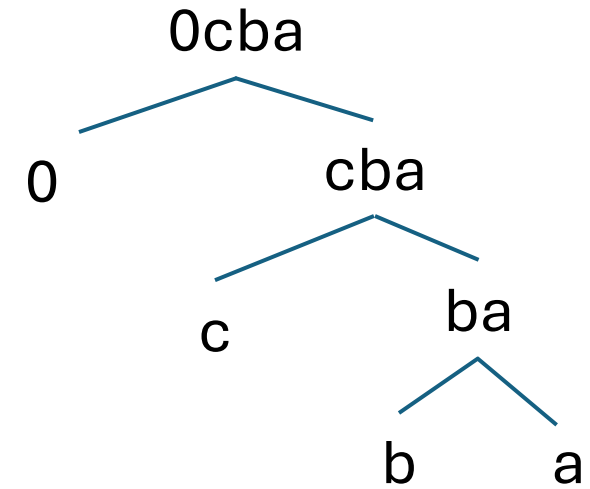
G: 000  
E: 001  
S: 010  
\_: 011  
N: 100  
O: 101  
W: 11000  
A: 11001  
C: 11010  
H: 11011  
L: 11100  
F: 11101  
I: 11110  
R: 11111

010 11000 11001 100 010 101 100 011  
010 11010 11011 101 101 11100 011  
101 11101011 001 100 11110 100 001  
001 11111 11110 100 000

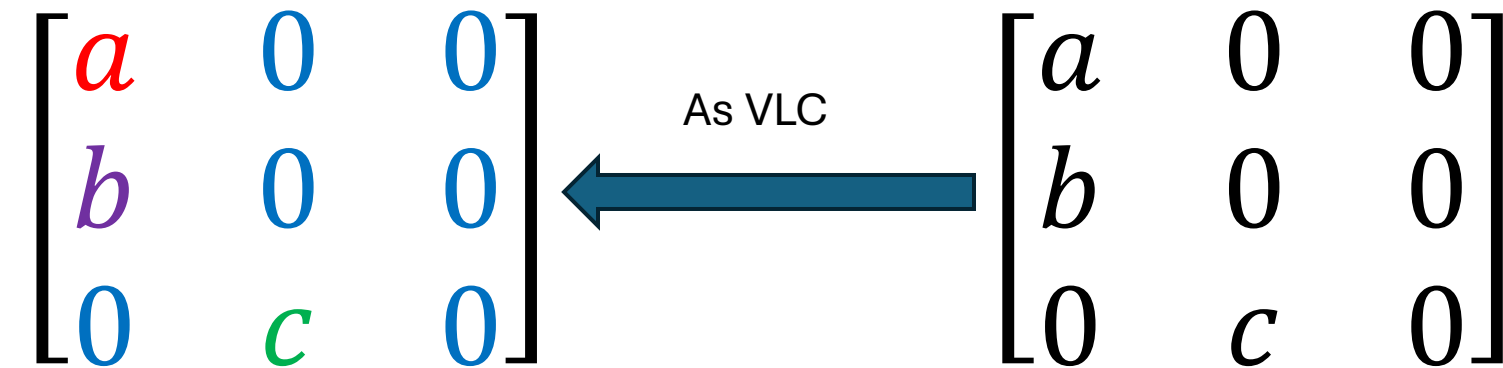


$$\begin{bmatrix} a & 0 & 0 \\ b & 0 & 0 \\ 0 & c & 0 \end{bmatrix}$$

0: 6	→	0
a: 1	→	111
b: 1	→	110
c: 1	→	10



9 x 8bit = 72 bits



14 bits

11100110000100

0: 6	→	0
a: 1	→	111
b: 1	→	110
c: 1	→	10

00100111110000

$$\begin{bmatrix} 0 & 0 & c \\ 0 & a & b \\ 0 & 0 & 0 \end{bmatrix}$$

0: 6

→ 0

a: 1

→ 111

b: 1

→ 110

c: 1

→ 10

00100111110000