

TIPE - LA COMPRESSION DE DONNÉES

Et son application aux images

Arsène MALLET

Candidat - 14873

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- **Compression** : **maximum** d'informations avec une taille **minimal**
- Deux types : **avec** (lossy) ou **sans** perte (lossless).
- Dans le domaine urbain : beaucoup d'informations → compression ⇒ **stocker et traiter efficacement**

- Compression sans perte : **entropique** et **algorithmique**
- Une **réorganisation** des données
- Application de **transformées mathématiques**
- Implémentation de l'**algorithme JPEG**

Théorie de l'Information de Shannon

Théorie probabiliste **quantifiant l'information** d'un ensemble de messages.

Définition - Entropie

Pour une source X comportant n symboles, un symbole x_i ayant une probabilité $p_i = \mathbb{P}(X = x_i)$ d'apparaître, l'entropie H est définie par :

$$H(X) = - \sum_{i=1}^n p_i \log_2(p_i)$$

Définition - Code de Source

Un **code de source** C pour une variable aléatoire X de distribution de probabilité p , est une application de Ω (ensemble des symboles sources) vers A^* (où A est l'alphabet du code).

Définition - Code Uniquement Décodable

Un code est dit **uniquement décodable** si

$$\forall x, y \in \Omega^+, x \neq y \implies C^+(x) \neq C^+(y)$$

Définition - Code Préfixe

Un code est dit préfixe si **aucun** mot de code n'est le préfixe d'un **autre** mot de code

Rq. : Code **préfixe** \implies code **uniquement décodable**

Un code **non-préfixe**

a	0
b	1
c	01

$ab = 01 = c \rightarrow$ **Non** uniquement décodable

Un code **préfixe**

a	0
b	10
c	11

Chaque code est **unique**

Inégalité de Kraft

Pour un code défini sur un alphabet de taille D , et un alphabet de source Ω de taille $|\Omega|$, alors il est **préfixé** si et seulement si

$$\sum_{i=1}^{|\Omega|} D^{-l_i} \leq 1$$

l_i = longueur des mots du codes

Théorème du Codage de Source - Shannon 1948

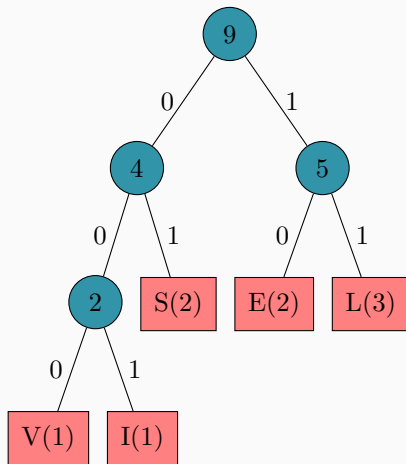
Lorsque l'efficacité de la compression augmente, la longueur moyenne du code tend vers l'entropie H .

Codage De Huffman (1)

- Codage **optimal** au niveau **symbole**, à longueur **variable**
- Impose un **nombre entier de bit** pour un symbole
- Exemple de codage de "LES VILLES" :

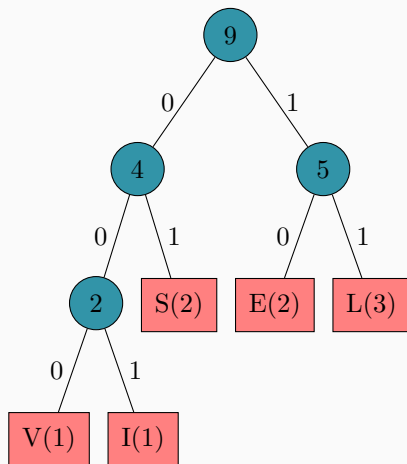
symbole source	fréquence
L	3
E	2
S	2
V	1
I	1

Arbre de Huffman de "LES VILLES"



Codage De Huffman (2)

Arbre de Huffman de "LES VILLES"



- **Table de code de Huffman**

symbole source	code
L	11
E	10
S	01
V	000
I	001

- **Code de Huffman :**
11100100000111111001

Codage Arithmétique (1)

- Codage **optimal** au niveau **bit**, à longueur **variable**
- Principe : codage **par morceaux** et non par symbole (Huffman)
- Exemple de codage de "VILLE" :

symbole source	probabilité	intervalle
V	1/5	$[0; 0, 2[$
I	1/5	$[0, 2; 0, 4[$
L	2/5	$[0, 4; 0, 8[$
E	1/5	$[0, 8; 1[$

Ajout d'un symbole s :

- 1 $BB = BS - BI$
- 2 $BS \leftarrow BI + BB \times BS_s$
- 3 $BI \leftarrow BI + BB \times BI_s$

Codage Arithmétique (2)

symbole source	probabilité	intervalle
V	1/5	$[0; 0.2[$
I	1/5	$[0.2; 0.4[$
L	2/5	$[0.4; 0.8[$
E	1/5	$[0.8; 1[$

Ajout de $s = V$:

$$BS = BB = 1, BI = 0, BS_s = 0.2, BI_s = 0$$

$$BS \leftarrow 0 + 1 \times 0.2 = 0.2$$

$$BI \leftarrow 0 + 1 \times 0 = 0$$

Ajout, ensuite, de $s' = I$:

$$BS = BB = 0.2, BI = 0, BS_{s'} = 0.4, BI_{s'} = 0.2$$

$$BS \leftarrow 0 + 0.2 \times 0.4 = 0.08$$

$$BI \leftarrow 0 + 0.2 \times 0.2 = 0.04$$

...

Codage Arithmétique (3)

symbole source	probabilité	intervalle
V	1/5	$[0; 0.2[$
I	1/5	$[0.2; 0.4[$
L	2/5	$[0.4; 0.8[$
E	1/5	$[0.8; 1[$

Code de "VILLE" : $x \in [0.06752; 0.0688]$

Par exemple $x = 0.068$ fonctionne.

Décompression :

① $x \in [0; 0.2] \rightarrow V$

② $x \leftarrow \frac{x - BI_V}{p_V} = 0.34$

③ $x \in [0.2; 0.4] \rightarrow VI$

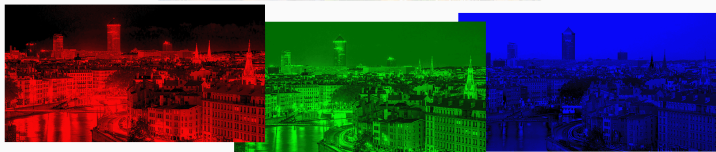
④ $x \leftarrow \frac{x - BI_I}{p_I} = 0.7$

...

⑤ Mot **décodé** : VILLE

La Représentation d'Image

$$\text{Image} = \begin{pmatrix} (r, g, b)_{1,1} & \dots & (r, g, b)_{1,p} \\ \vdots & \ddots & \vdots \\ (r, g, b)_{n,1} & \dots & (r, g, b)_{n,p} \end{pmatrix}$$



Référence Image: laou.fr

Transformation YCbCr

$$\varphi: \llbracket 0, 255 \rrbracket^3 \rightarrow \llbracket 0, 255 \rrbracket \times \llbracket -128, 127 \rrbracket^2$$

$$X = (r, g, b) \mapsto TX = (Y, Cb, Cr)$$

$$T = 255 \begin{pmatrix} K_r & K_r & K_b \\ -\frac{1}{2} \cdot \frac{K_r}{1-K_b} & -\frac{1}{2} \cdot \frac{K_g}{1-K_b} & \frac{1}{2} \\ \frac{1}{2} & -\frac{1}{2} \cdot \frac{K_g}{1-K_r} & -\frac{1}{2} \cdot \frac{K_b}{1-K_r} \end{pmatrix} \text{ et } K_r + K_g + K_b = 1$$

Rq. : En général $K_r = 0.299$, $K_g = 0.587$, $K_b = 0.114$

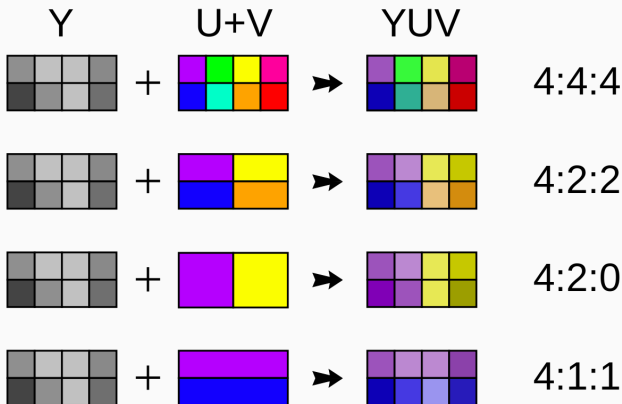
La Représentation YCbCr (2)



Œil humain → Y prédomine, Cb et Cr moins importants

Sous-Échantillonnage

- **Principe** : Cb, Cr moins importants -> **moyenner** ces valeurs sur **plusieurs pixels**
- Exemples de **sous-échantillonnages** :



Référence Schéma: [wikipedia.org](https://fr.wikipedia.org/wiki/Sous-échantillonnage)

DCT (transformée en cosinus discrète) (1)

Transformation DCT

$$\begin{aligned} \psi: \mathbb{R}^N &\rightarrow \mathbb{R}^N \\ (x_0, \dots, x_{N-1}) &\mapsto \left(\sum_{n=0}^{N-1} x_n \cos \left[\frac{\pi}{N} \left(n + \frac{1}{2} \right) k \right] \right)_{k \in \llbracket 0, N-1 \rrbracket} \end{aligned}$$

On peut rendre la matrice associée à ψ **orthogonale** en multipliant le terme X_0 par $\frac{1}{\sqrt{N}}$ et toute la matrice par $\sqrt{2/N}$.

2D-DCT $\rightarrow \psi$ sur chaque lignes puis chaque colonne

DCT (2)

- "Continuité" des images → peu de variations des **hautes fréquences**
- Compactage de l'énergie vers les **basses fréquences**

avant DCT

	0	1	2	3	4	5	6	7
0	20	20	19	18	16	14	10	9
1	16	17	17	16	16	14	12	11
2	13	14	15	15	15	15	14	13
3	14	14	14	14	14	14	13	13
4	16	16	15	14	14	13	12	12
5	18	17	16	14	14	14	13	14
6	17	16	16	15	15	16	17	18
7	15	15	15	15	16	19	20	22

après DCT

	0	1	2	3	4	5	6	7
0	121	6	0	0	0	-1	0	0
1	-4	9	-6	0	0	0	0	0
2	7	0	0	0	0	0	0	0
3	0	9	0	0	0	0	0	0
4	0	0	0	0	0	0	0	0
5	0	0	0	0	0	0	0	0
6	0	0	0	0	0	0	0	0
7	0	0	0	0	0	0	0	0

- Seule étape **avec perte** de la compression **JPEG**
- **Réduction** des coefficients
- **Différence** entre Y, Cb et Cr
- Fonction de quantification :

$$\begin{aligned}\varepsilon: \mathcal{M}_{8,8}(\mathbb{Z})^2 &\rightarrow \mathcal{M}_{8,8}(\mathbb{Z}) \\ Q, B &\mapsto \lfloor B/Q \rfloor\end{aligned}$$

- Souvent Q dépend d'un **facteur de qualité** q (dans notre cas : $q \in \llbracket 1, 100 \rrbracket$)

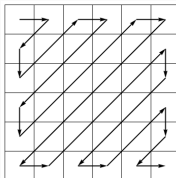
Codage par plages (Run-Length Encoding)

- Tire son avantage des **répétitions** de symboles
- Exemple :

$$\underbrace{AAAA}_{4 \times A} \underbrace{B}_{1 \times B} \underbrace{CCC}_{3 \times C} \underbrace{BBBBBBB}_{7 \times B} \xrightarrow{RLE} A4B1C3B7$$

15 caractères \rightarrow 8 caractères

- Pour faire apparaître ces répétitions dans les **images**, lecture de la matrice en **zigzag** :



Exemple de Compression

Image Original



Taille : 10,3 Mo

Exemple de Compression

Image Compressée ($q = 100, 4 : 4 : 4$) (presque **lossless**)



Taille : 2,2 Mo

$$\text{Ratio} : \eta = \frac{T_{init}}{T_{compres}} = 4.68$$

Exemple de Compression

Image Compressée ($q = 50, 4 : 2 : 2$)



Taille : 519 Ko

$$\text{Ratio} : \eta = \frac{T_{init}}{T_{compres}} = 19.8$$

Exemple de Compression

Image Compressée ($q = 5, 4 : 1 : 1$)

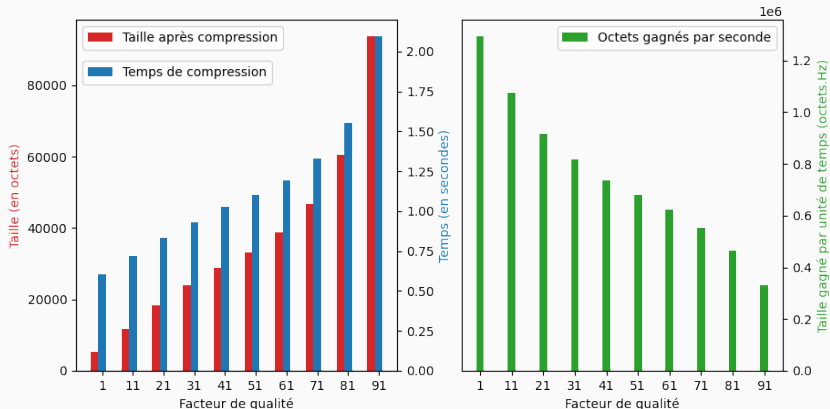


Taille : 77 Ko

$$\text{Ratio} : \eta = \frac{T_{init}}{T_{compres}} = 134$$

Comparaison (1)

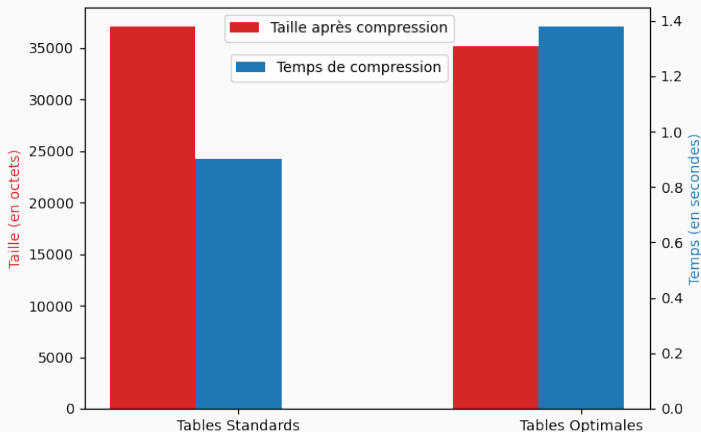
Comparaison des compressions en fonction du facteur de qualité



Conclusion : JPEG plus efficace lorsque la qualité baisse

Comparaison (2)

Comparaison des compressions en fonction des tables de Huffman utilisées



Conclusion : Le gain en espace est proportionnellement inférieure au gain en temps

- ✓ **Étude théorique** des moyens de compression
- ✓ **Implémentation** des méthodes de compression en **python** 🐍
- ✓ **Implémentation** d'un encoder JPEG utilisant le **codage de Huffman** en **python** 🐍
- ✗ **Implémentation** d'un encoder JPEG utilisant le **codage arithmétique** en **python** 🐍
- ~ Comparaison des méthodes de compression sur des images
 - ✓ Comparaison en fonction du **facteur de qualité**
 - ✓ Comparaison en fonction du **codage de Huffman**
 - ✗ Comparaison en fonction du **codage entropique** (Huffman ou Arithmétique)

Annexe - Démonstration Inégalité de Kraft (1)

Pour toute la démonstration, on considère un codage h ayant la propriété du préfixe. Soit s_1, \dots, s_k et l_1, \dots, l_k les mots codes et leur longueur.

On considère le cas où la taille de l'alphabet $D = 2$ (binaire), l'inégalité de Kraft s'écrit donc :

$$\sum_{i=1}^k 2^{-l_i} \leq 1$$

On note $m = \max l_i$ la plus grande longueur des mots codes. Comme le code a la propriété du préfixe, on peut placer, de manière unique, ces mots codes sur un arbre \mathcal{T} binaire équilibré de profondeur m chaque mot code étant une feuille de cet arbre.

On peut donc compter le nombre de feuilles issues du mot de code s_i dans l'arbre complet binaire \mathcal{T} de profondeur m . Comme le mot code est à la profondeur l_i , le nœud correspondant est le père de 2^{m-l_i} feuilles à la profondeur m .

Annexe - Démonstration Inégalité de Kraft (2)

Comme le codage a la propriété du préfixe les sous arbres issus des mots codes sont disjoints et donc le nombre total de feuilles issues des mots codes à la profondeur m est égal à

$$\sum_{i=1}^k 2^{m-l_i}$$

Ce nombre de feuilles est inférieur ou égal au nombre total de feuilles à la profondeur m , c'est à dire à 2^m . En écrivant cette inégalité on obtient :

$$\sum_{i=1}^k 2^{m-l_i} \leq 2^m \implies \sum_{i=1}^k 2^{-l_i} \leq 1$$

La réciproque se montre en partant de l'arbre complet de profondeur m et en construisant le code à partir des l_i .

- `ycbcr.py` → slides 31-32
- `huffman.py` → slides 32-34
- `fft.py` → slides 35-38
- `complex.py` → slides 38-43
- `arithmetic_coding.py` → slides 43-46
- `utils.py` → slides 43-58
- `huffman_jpeg.py` → slides 58-72
- `encoder.py` → slides 72-79
- `comparator.py` → slides 79-88

Selected files

9 printable files

ycbcr.py
huffman.py
fft.py
complex.py
arithmetic_coding.py
encoder/utils.py
encoder/huffman_jpeg.py
encoder/encoder.py
encoder/comparator.py

ycbcr.py

```
1 # Module transforming RGB images into YCbCr
2 import numpy as np
3 import numpy.linalg as alg
4
5 mat = np.array(
6     [[65.481, 128.553, 24.966], [-37.797, -74.203, 112.0], [112.0, -93.786, -18.214]]
7 )
8
9 col = np.array([[16, 128, 128]])
10
11
12 def rgb_to_ycbcr(rgb: tuple) -> tuple:
13     a = np.asarray(rgb)
14     b = mat.dot(a)
15     return tuple(b + col)
16
17
18 def ycbcr_to_rgb(t: tuple) -> tuple:
19     a = np.asarray(t)
```

```

20 |     b = alg.inv(mat)
21 |     c = a - col
22 |     d = b.dot(c[0])
23 |     return tuple(d)
24 |

```

huffman.py

```

1 | # Module computing Huffman compression
2 |
3 |
4 | from collections import Counter, namedtuple
5 | from heapq import heapify, heappop, heappush
6 |
7 |
8 | # Node in a Huffman Tree
9 | Node = namedtuple("Node", ["char", "freq"])
10 |
11 | class HuffmanCompressor:
12 |     """Huffman compression implementation"""
13 |     def __init__(self):
14 |         self.encoding_table = {}
15 |         self.decoding_table = {}
16 |
17 |     def build_tables(self, s: str):
18 |         """create both the encodingn and decoding tables of a given string
19 |
20 |         parameters
21 |         -----
22 |         -s : string used to build the tables
23 |
24 |         return
25 |         -----
26 |         - fill both the encoding and decoding table of the given class instance"""
27 |

```



```

28 freq_table = Counter(s)
29
30 # create a heap of the nodes in the tree
31 heap = []
32 for char, freq in freq_table.items():
33     heap.append(Node(char, freq))
34 heapify(heap)
35
36 # create the Huffman tree
37 while len(heap) > 1:
38     left_node = heappop(heap)
39     right_node = heappop(heap)
40     combined_node = Node(None, left_node.freq + right_node.freq)
41     heappush(heap, combined_node)
42
43 def build_encoding_table(node, code=''):
44     if node.char is not None:
45         # if the node is a leaf, add it to the encoding table
46         self.encoding_table[node.char] = code
47         return
48     # if the node is not a leaf, recursively build the encoding table
49     build_encoding_table(node.left, code + '0')
50     build_encoding_table(node.right, code + '1')
51
52 build_encoding_table(heap[0])
53
54
55 def build_decoding_table(node, code=''):
56     if node.char is not None:
57         # if the node is a leaf, add it to the decoding table
58         self.decoding_table[code] = node.char
59         return
60     # if the node is not a leaf, recursively build the decoding table
61     build_decoding_table(node.left, code + "0")
62     build_decoding_table(node.right, code + "1")
63
64 build_decoding_table(heap[0])
65

```

```

66 def compress(self, s: str) -> str:
67     """compress the inputed string
68
69     parameters
70     -----
71     -s : string to be compressed
72
73     return
74     -----
75     - compressed string"""
76     compressed = ""
77     for char in s:
78         compressed += self.encoding_table[char]
79     return compressed
80
81 def decompress(self, compressed: str) -> str:
82     """decompress the inputed string
83
84     parameters
85     -----
86     -s : string to be compressed
87
88     return
89     -----
90     - decompressed string"""
91     decompressed = ""
92     i = 0
93     while i < len(compressed):
94         for j in range(i+1, len(compressed)+1):
95             if compressed[i:j] in self.decoding_table:
96                 decompressed += self.decoding_table[compressed[i:j]]
97                 i = j
98                 break
99
100     return decompressed

```

fft.py

```
1 # fast-fourier transforms
2
3 import complex as cpx
4 from numpy import log2
5 from cmath import pi, exp, cos
6 from scipy.fftpack import dct, idct
7
8
9 def FFT(vector:list) -> list:
10     """calculate the fast fourier tranform of a vector
11
12     parameters
13     -----
14         -vector : list of Complex object
15
16     return
17     -----
18         - 1-D fast fourier transform of the vector"""
19     n = len(vector)
20     assert log2(n).is_integer(), "make sure that the length of the arguement is a power of 2"
21     if n == 1:
22         return vector
23     poly_even, poly_odd = vector[::2] , vector[1::2]
24     res_even, res_odd = FFT(poly_even), FFT(poly_odd)
25     res = [cpx.Complex(0)] * n
26     for j in range(n//2):
27         w_j = cpx.exp_to_literal(-2*pi*j/n)
28         product = w_j * res_odd[j]
29         res[j] = res_even[j] + product
30         res[j + n//2] = res_even[j] - product
31     return res
```

```

32
33 def IFFT_aux(vector:list) -> list:
34     """auxiliary function that makes the recursive steps of the IFFT algorithm
35     parameters
36     -----
37         -vector : list of Complex object
38
39     return
40     -----
41         - partial inverse of the 1-D fast fourier transform of the vector (lack the division by n)"""
42     n = len(vector)
43     assert log2(n).is_integer(), "make sure that the length of the arguement is a power of 2"
44     if n == 1:
45         return vector
46     poly_even, poly_odd = vector[::2] , vector[1::2]
47     res_even, res_odd = IFFT_aux(poly_even), IFFT_aux(poly_odd)
48     res = [cpx.Complex(0)] * n
49     for j in range(n//2):
50         w_j = cpx.exp_to_literal((2 * pi * j) / n)
51         product = w_j * res_odd[j]
52         res[j] = res_even[j] + product
53         res[j + n//2] = res_even[j] - product
54     return res
55
56 def IFFT(vector:list) -> list:
57     """caculate the inverse of the fast fourier tranform of a vector (in order to have ifft(fft(poly)) ==
58     poly)
59     parameters
60     -----
61         -vector : list of Complex object
62
63     return
64     -----
65         - inverse of the 1-D fast fourier transform of the vector"""
66     n = len(vector)
67     res = IFFT_aux(vector)
68     for i in range(n):

```

```

69         res[i] = res[i] / cpx.Complex(n)
70     return res
71
72 def DCT(vector:list, orthogonalize:bool =False, norm="forward"):
73     """calculate the one-dimensional type-II discrete cosine tranform of a matrix (MAKHOUL) (using the FFT
74     function previously defined)
75
76     parameters
77     -----
78         - vector: list of Numerical Object
79
80     return
81     -----
82         - discrete cosine tranform of the input"""
83     N = len(vector)
84     temp = vector[ : : 2] + vector[-1 - N % 2 : : -2]
85     temp = FFT(temp)
86     factor = - pi / (N * 2)
87     result = [2 * (val * (cpx.exp_to_literal(i * factor))).re for (i, val) in enumerate(temp)]
88     if orthogonalize:
89         result[0] *= 2 ** (-1 / 2)
90     if norm == "ortho":
91         result[0] *= (N) ** (-1 / 2)
92         result[1:] = [(2 / N) ** (1 / 2) * result[i] for i in range(1, len(result))]
93     return result
94
95 def IDCT(vector:list):
96     """calculate the one-dimensional "inverse" type-III discrete cosine tranform of a matrix (MAKHOUL) (using
97     the FFT function previously defined)
98
99     parameters
100    -----
101        - vector: list of Numerical Object
102
103    return
104    -----
105        - type-III discrete cosine tranform of the input"""
106     N = len(vector)

```

```

105     factor = - pi / (N * 2)
106     temp = [(cpx.Complex(val) if i > 0 else (cpx.Complex(val) / cpx.Complex(2))) * cpx.exp_to_literal(i *
factor) for (i, val) in enumerate(vector)]
107     temp = FFT(temp)
108     temp = [val.re for val in temp]
109     result = [None] * N
110     result[ : : 2] = temp[ : (N + 1) // 2]
111     result[-1 - N % 2 : : -2] = temp[(N + 1) // 2 : ]
112     return result
113
114 if __name__ == "__main__":
115     vectorCpx= [cpx.Complex(5), cpx.Complex(2), cpx.Complex(4), cpx.Complex(8)]
116     vector = [5, 2, 4, 8]
117     print("DCT : ", DCT(vectorCpx))
118     print("inverse + DCT : ", IDCT((DCT(vectorCpx))))
119     print("scipy dct :", dct(vector))
120     print("scipy + inverse dct: ", dct(idct(vector)))
121     print("scipy dct (ortho) : ", dct(vector, norm = "ortho"))
122     print("scipy inverse + dct (ortho) : ", idct(dct(vector, norm="ortho"), norm="ortho"))

```

complex.py

```

1 # Module computing complex numbers
2 # disclaimer : this class is not made to deal with less than 1e-10 values
3
4
5 from numpy import arctan2, cos, pi, sin, sqrt
6 from math import isclose
7 from typing import Union, List
8
9
10 class Complex:
11     """Computing complex numbers"""
12     def __init__(self, real=0., imaginary=0.):
13         self.re = real # round(real, 15)

```

```

14         self.im = imaginary # round(imaginary,15)
15     def __str__(self) -> str:
16         if self.im == 0.:
17             string = f"{self.re}"
18         elif self.re == 0:
19             string = f"i({self.im})"
20         else:
21             string = f"{self.re} + i({self.im})"
22         return string
23     __repr__ = __str__
24     def __eq__(self, other) -> bool:
25         return bool(isclose(self.re, other.re) and isclose(self.im, other.im))
26     def is_null(self):
27         return isclose(self.re, 0) and isclose(self.im, 0)
28     def is_real(self):
29         return isclose(self.im, 0)
30     def is_imaginary(self):
31         return isclose(self.re, 0)
32     def arg(self):
33         """return the argument of the complex number
34         return None if 0"""
35         if self.is_null():
36             arg = None
37         elif isclose(self.re, 0) and self.im > 0:
38             arg = pi / 2
39         elif isclose(self.re, 0) and self.im < 0:
40             arg = - pi / 2
41         else:
42             arg = round(arctan2(self.im, self.re), 15)
43         return arg
44     def module(self):
45         """return the module of the complex number"""
46         return round(sqrt(self.re**2 + self.im**2), 15)
47     def conjugate(self):
48         return (Complex(self.re, -self.im))
49     #arithmetic
50     def __add__(self, other):
51         return Complex(self.re + other.re, self.im + other.im)

```

```

52 def __sub__(self, other):
53     return Complex(self.re - other.re, self.im - other.im)
54 def __mul__(self, other):
55     real = (self.re * other.re) - (self.im * other.im)
56     imaginary = (self.re * other.im) + (self.im * other.re)
57     return Complex(real, imaginary)
58 def __truediv__(self, other):
59     if other.is_null():
60         raise ValueError("Error : dividing by 0")
61     elif other.is_real():
62         return Complex(self.re / other.re, self.im / other.re)
63     else:
64         denominator = (other.re ** 2) + (other.im ** 2)
65         real = ((self.re * other.re) + (self.im * other.im)) / denominator
66         imaginary = ((self.im * other.re) - (self.re * other.im)) / denominator
67         return Complex(real, imaginary)
68
69 Num = Union[int, float]
70
71 def addition(*complexes:Complex) -> Complex: #partially depreciated (can still be usefull for more iterable
arguments)
72     """calculate the sum of complex numbers
73
74     parameters
75     -----
76     - *complexes : iterable type of Complex
77
78     return
79     -----
80     - sum of the complex numbers"""
81
82     res = Complex(0)
83     for number in complexes:
84         res.re += number.re
85         res.im += number.im
86     return res
87

```



```

88 def difference(cpx1:Complex, cpx2:Complex = Complex(0)): #fully depreciated (replaced by __sub__ Complex
methods)
89     """calculate the difference of two complex numbers
90
91     parameters
92     -----
93     - cpx1 : Complex number
94     - cpx2 : Complex number to subtract to cpx1 (=Complex(0) by default)
95
96     return
97     -----
98     - difference of the two complex numbers"""
99     res = Complex()
100     res.re = cpx1.re - cpx2.re
101     res.im = cpx1.im - cpx2.im
102     return res
103
104 def product(*complexes:Complex) -> Complex: #partially depreciated (can still be usefull for more iterable
arguments)
105     """calculate the product of complex numbers
106
107     parameters
108     -----
109     - *complexes : iterable type of Complex
110
111     return
112     -----
113     - product of the complex numbers"""
114     res = Complex(1)
115     for number in complexes:
116         re = res.re * number.re - res.im * number.im
117         im = res.re * number.im + res.im * number.re
118         res.re = re
119         res.im = im
120     return res
121
122 def exp_to_literal(arg:float, module:float = 1.0) -> Complex:
123     """ return the literal expression of a complex number defined by its argument and module

```

```

124
125     parameters
126     -----
127         - arg : type(float) (should be between 0 and 2pi)
128         - module : type(float) (must have a positive value)(=1 by default)
129
130     return
131     -----
132         - Complex number associated"""
133     assert(module >= 0), "second-argument(module) must have a positive value"
134     return Complex(module*cos(arg), module*sin(arg))
135
136 def nth_root(n:int, cpx:Complex = Complex(1)) -> Complex:
137     """calculate the nth root of a complex number
138
139     parameters
140     -----
141         - n : type(int)
142         - complex : type(Complex) (=Complex(1) by default) (must not be Complex(0))
143
144     return
145     -----
146         - list of the nth roots"""
147     assert(cpx.re != 0 or cpx.im != 0), "second argument must be a non-zero complex number"
148     module = cpx.module()
149     arg = cpx.arg()
150     if arg is not None:
151         return exp_to_literal((arg/n), module**(1/n))
152     else:
153         return Complex(1) #Not used case but just here to ensure nth_root cannot return None
154
155
156 def nth_roots_unity(n:int) -> list:
157     """ calculate the n roots of unity
158
159     parameter
160     -----
161         - n : type(int) : must be a positive integer

```

```

162
163     return
164     -----
165     - a list of Complex containing the n roots of unity"""
166     roots = [Complex(1) for i in range(n)]
167     for k in range(0,n):
168         roots[k] = exp_to_literal((2*k*pi/n), 1.0)
169     return roots
170
171 def inverse_nth_roots_unity(n:int) -> list:
172     """ calculate the inversed n roots of unity
173
174     parameter
175     -----
176     - n : type(int) : must be a positive integer
177
178     return
179     -----
180     - a list of Complex containing the inversed n roots of unity"""
181     roots = [Complex(1) for i in range(n)]
182     for k in range(0,n):
183         roots[k] = exp_to_literal((-2*k*pi/n), 1.0)
184     return roots
185
186 def make_complex(values:List[Num]) -> List[Complex]:
187     res = []
188     for value in values:
189         res.extend([Complex(value)])
190     return res
191
192
193 if __name__ == "__main__":
194     pass
195

```

arithmetic_coding.py

```

1 | def proba(data):
2 |     """
3 |     Créer le dictionnaire de probabilités d'apparition des différents caractères
4 |     """
5 |     assert len(data) != 0
6 |     d = {}
7 |     for x in data:
8 |         d[x] = d.get(x, 0) + (1 / len(data))
9 |     return d
10 |
11 |
12 | def create_int(data):
13 |     """
14 |     Créer le dictionnaire des intervalles des différents caractères connaissant les données
15 |     """
16 |     p = proba(data)
17 |     d = {}
18 |     n = 0.0
19 |     for c, v in p.items():
20 |         d[c] = (n, n + v)
21 |         n += v
22 |     return d
23 |
24 |
25 | def create_int2(p):
26 |     """
27 |     Créer le dictionnaire des intervalles des différents caractères connaissant les probas des différents
    caractères
28 |     """
29 |     d = {}
30 |     n = 0.0
31 |     for c, v in p.items():
32 |         d[c] = (n, n + v)
33 |         n += v
34 |     return d
35 |

```

```

36
37 def encode(data):
38     """
39     effectue l'encodage des données
40     """
41     int = create_int(data)
42     value = (0.0, 1.0)
43     for x in data:
44         d = value[1] - value[0]
45         sup = value[0] + d * int[x][1]
46         inf = value[0] + d * int[x][0]
47         value = (inf, sup)
48     return (value[0] + value[1]) / 2
49
50
51 def appartient(x, int):
52     """
53     teste l'appartenance de x à un intervalle fermé à gauche et ouvert à droite
54     """
55     assert len(int) == 2
56     return x >= int[0] and x < int[1]
57
58
59 def inverse(dic):
60     """
61     renvoie le dictionnaire où les clés et valeurs sont inversées
62     """
63     d = {}
64     for c, v in dic.items():
65         d[v] = c
66     return d
67
68
69 def decode(n, p, nbr_carac):
70     d = inverse(create_int2(p))
71     res = []
72     i = n
73     while len(res) < nbr_carac:

```

```

74     for c, v in d.items():
75         if appartient(i, c):
76             res.append(v)
77             i = (i - c[0]) / (c[1] - c[0])
78             break
79     return res
80
81
82 # Examples
83
84 if __name__ == "__main__":
85     print(encode("WIKI"))
86     print(decode(0.171875, {"W": 0.25, "I": 0.5, "K": 0.25}, 4))
87     print(encode("AAABBCCCCC"))
88     print(decode(0.010783125000000005, {"A": 0.3, "B": 0.2, "C": 0.5}, 10))
89     print(encode([1, 2, 3, 4, 5, 6, 7, 8, 9, 10]))
90     print(
91         decode(
92             encode([1, 2, 3, 4, 5, 6, 7, 8, 9, 10]),
93             {
94                 1: 0.1,
95                 2: 0.1,
96                 3: 0.1,
97                 4: 0.1,
98                 5: 0.1,
99                 6: 0.1,
100                7: 0.1,
101                8: 0.1,
102                9: 0.1,
103                10: 0.1,
104            },
105            10,
106        )
107     )
108

```

```

1 import numpy as np
2 import math
3 import cv2
4 from io import BytesIO
5
6
7 # DCT block size
8 BH, BW = 8, 8
9
10
11 class MARKER:
12     SOI = b"\xff\xd8"
13     APP0 = b"\xff\xe0"
14     APPn = (b"\xff\xe1", b"\xff\xef") # n=1~15
15     DQT = b"\xffxdb"
16     SOF0 = b"\xff\xc0"
17     DHT = b"\xff\xc4"
18     DRI = b"\xff\xdd"
19     SOS = b"\xffxda"
20     EOI = b"\xff\xd9"
21
22
23 class ComponentInfo:
24     def __init__(self, id_, horizontal, vertical, qt_id, dc_ht_id, ac_ht_id):
25         self.id_ = id_
26         self.horizontal = horizontal
27         self.vertical = vertical
28         self.qt_id = qt_id
29         self.dc_ht_id = dc_ht_id
30         self.ac_ht_id = ac_ht_id
31
32     @classmethod
33     def default(cls):
34         return cls.__init__(*[0 for _ in range(6)])
35
36     def encode_SOS_info(self):

```

```

37         return int2bytes(self.id_, 1) + int2bytes(
38             (self.dc_ht_id << 4) + self.ac_ht_id, 1
39         )
40
41     def encode_SOF0_info(self):
42         return (
43             int2bytes(self.id_, 1)
44             + int2bytes((self.horizontal << 4) + self.vertical, 1)
45             + int2bytes(self.qt_id, 1)
46         )
47
48     def __repr__(self):
49         return (
50             f"{self.id_}: qt={self.qt_id}, ht=(dc={self.dc_ht_id}, "
51             f"ac={self.ac_ht_id}), sample={self.vertical, self.horizontal} "
52         )
53
54
55 class BitStreamReader:
56     """simulate bitwise read"""
57
58     def __init__(self, bytes_: bytes):
59         self.bits = np.unpackbits(np.frombuffer(bytes_, dtype=np.uint8))
60         self.index = 0
61
62     def read_bit(self):
63         if self.index >= self.bits.size:
64             raise EOFError("Ran out of element")
65         self.index += 1
66         return self.bits[self.index - 1]
67
68     def read_int(self, length):
69         result = 0
70         for _ in range(length):
71             result = result * 2 + self.read_bit()
72         return result
73
74     def __repr__(self):

```



```

75         return f"[{self.index}, {self.bits.size}]"
76
77
78 class BitStreamWriter:
79     """simulate bitwise write"""
80
81     def __init__(self, length=10000):
82         self.index = 0
83         self.bits = np.zeros(length, dtype=np.uint8)
84
85     def write_bitstring(self, bitstring):
86         length = len(bitstring)
87         if length + self.index > self.bits.size * 8:
88             arr = np.zeros((length + self.index) // 8 * 2, dtype=np.uint8)
89             arr[: self.bits.size] = self.bits
90             self.bits = arr
91         for bit in bitstring:
92             self.bits[self.index // 8] |= int(bit) << (7 - self.index % 8)
93             self.index += 1
94
95     def to_bytes(self):
96         return self.bits[: math.ceil(self.index / 8)].tobytes()
97
98     def to_hex(self):
99         length = math.ceil(self.index / 8) * 8
100         for i in range(self.index, length):
101             self.bits[i] = 1
102         bytes_ = np.packbits(self.bits[:length])
103         return " ".join(f"{b:2x}" for b in bytes_)
104
105
106 class BytesWriter(BytesIO):
107     def __init__(self, *args, **kwargs):
108         super(BytesWriter, self).__init__(*args, **kwargs)
109
110     def add_bytes(self, *args):
111         self.write(b"".join(args))
112

```

```

113
114 def bytes2int(bytes_, byteorder="big"):
115     return int.from_bytes(bytes_, byteorder)
116
117
118 def int2bytes(int_: int, length):
119     return int_.to_bytes(length, byteorder="big")
120
121
122 def decode_2s_complement(complement, length) -> int:
123     if length == 0:
124         return 0
125     if complement >> (length - 1) == 1: # sign bit equal to one
126         number = complement
127     else: # sign bit equal to zero
128         number = 1 - 2**length + complement
129     return number
130
131
132 def encode_2s_complement(number) -> str:
133     """return the 2's complement representation as string"""
134     if number == 0:
135         return ""
136     if number > 0:
137         complement = bin(number)[2:]
138     else:
139         length = int(np.log2(-number)) + 1
140         complement = bin(number - (1 - 2**length))[2:].zfill(length)
141     return complement
142
143
144 def load_quantization_table(quality, component):
145     # the below two tables was processed by zigzag encoding
146     # in JPEG bit stream, the table is also stored in this order
147     if component == "lum":
148         q = np.array(
149             [
150                 16,

```

151	11,
152	12,
153	14,
154	12,
155	10,
156	16,
157	14,
158	13,
159	14,
160	18,
161	17,
162	16,
163	19,
164	24,
165	40,
166	26,
167	24,
168	22,
169	22,
170	24,
171	49,
172	35,
173	37,
174	29,
175	40,
176	58,
177	51,
178	61,
179	60,
180	57,
181	51,
182	56,
183	55,
184	64,
185	72,
186	92,
187	78,
188	64,

```
189         68,
190         87,
191         69,
192         55,
193         56,
194         80,
195         109,
196         81,
197         87,
198         95,
199         98,
200         103,
201         104,
202         103,
203         62,
204         77,
205         113,
206         121,
207         112,
208         100,
209         120,
210         92,
211         101,
212         103,
213         99,
214     ],
215     dtype=np.int32,
216 )
217 elif component == "chr":
218     q = np.array(
219     [
220         17,
221         18,
222         18,
223         24,
224         21,
225         24,
226         47,
```

227	26,
228	26,
229	47,
230	99,
231	66,
232	56,
233	66,
234	99,
235	99,
236	99,
237	99,
238	99,
239	99,
240	99,
241	99,
242	99,
243	99,
244	99,
245	99,
246	99,
247	99,
248	99,
249	99,
250	99,
251	99,
252	99,
253	99,
254	99,
255	99,
256	99,
257	99,
258	99,
259	99,
260	99,
261	99,
262	99,
263	99,
264	99,

```

265         99,
266         99,
267         99,
268         99,
269         99,
270         99,
271         99,
272         99,
273         99,
274         99,
275         99,
276         99,
277         99,
278         99,
279         99,
280         99,
281         99,
282         99,
283         99,
284     ],
285     dtype=np.int32,
286 )
287 else:
288     raise ValueError(
289         (
290             f"component should be either 'lum' or 'chr', "
291             f"but '{component}' was found."
292         )
293     )
294 if 0 < quality < 50:
295     q = np.minimum(np.floor(50 / quality * q + 0.5), 255)
296 elif 50 <= quality <= 100:
297     q = np.maximum(np.floor((2 - quality / 50) * q + 0.5), 1)
298 else:
299     raise ValueError("quality should belong to (0, 100].")
300 return q.astype(np.int32)
301
302

```

```

303 def zigzag_points(rows, cols):
304     # constants for directions
305     UP, DOWN, RIGHT, LEFT, UP_RIGHT, DOWN_LEFT = range(6)
306
307     move_func = {
308         UP: lambda p: (p[0] - 1, p[1]),
309         DOWN: lambda p: (p[0] + 1, p[1]),
310         LEFT: lambda p: (p[0], p[1] - 1),
311         RIGHT: lambda p: (p[0], p[1] + 1),
312         UP_RIGHT: lambda p: move(UP, move(RIGHT, p)),
313         DOWN_LEFT: lambda p: move(DOWN, move(LEFT, p)),
314     }
315
316     # move the point in different directions
317     def move(direction, point):
318         return move_func[direction](point)
319
320     # return true if point is inside the block bounds
321     def inbounds(p):
322         return 0 <= p[0] < rows and 0 <= p[1] < cols
323
324     # start in the top-left cell
325     now = (0, 0)
326
327     # True when moving up-right, False when moving down-left
328     move_up = True
329     trace = []
330
331     for i in range(rows * cols):
332         trace.append(now)
333         if move_up:
334             if inbounds(move(UP_RIGHT, now)):
335                 now = move(UP_RIGHT, now)
336             else:
337                 move_up = False
338                 if inbounds(move(RIGHT, now)):
339                     now = move(RIGHT, now)
340                 else:

```

```

341         now = move(DOWN, now)
342     else:
343         if inbounds(move(DOWN_LEFT, now)):
344             now = move(DOWN_LEFT, now)
345         else:
346             move_up = True
347             if inbounds(move(DOWN, now)):
348                 now = move(DOWN, now)
349             else:
350                 now = move(RIGHT, now)
351     """
352     for rows = cols = 8, the actual 1-D index:
353         0, 1, 8, 16, 9, 2, 3, 10, 17, 24, 32, 25, 18, 11, 4, 5,
354         12, 19, 26, 33, 40, 48, 41, 34, 27, 20, 13, 6, 7, 14, 21, 28,
355         35, 42, 49, 56, 57, 50, 43, 36, 29, 22, 15, 23, 30, 37, 44, 51,
356         58, 59, 52, 45, 38, 31, 39, 46, 53, 60, 61, 54, 47, 55, 62, 63
357     """
358     return trace
359
360
361 def RGB2YCrCb(im):
362     im = im.astype(np.float32)
363     im = cv2.cvtColor(im, cv2.COLOR_RGB2YCrCb)
364     """
365     RGB [0, 255]
366     opencv uses the following equations to conduct color conversion in float32
367          $Y = 0.299 * R + 0.587 * G + 0.114 * B$ 
368          $Cb = (B - Y) * 0.564 + 0.5$ 
369          $Cr = (R - Y) * 0.713 + 0.5$ 
370     Y [0, 255], Cb, Cr [-128, 127]
371     """
372     # convert YCrCb to YCbCr
373     Y, Cr, Cb = np.split(im, 3, axis=-1)
374     im = np.concatenate([Y, Cb, Cr], axis=-1)
375     return im
376
377
378 def YCbCr2RGB(im):

```



```

379     im = im.astype(np.float32)
380     Y, Cb, Cr = np.split(im, 3, axis=-1)
381     im = np.concatenate([Y, Cr, Cb], axis=-1)
382     im = cv2.cvtColor(im, cv2.COLOR_YCrCb2RGB)
383     """
384     Y [0, 255], Cb, Cr [-128, 127]
385     conversion equation (float32):
386         B = (Cb - 0.5) / 0.564 + Y
387         R = (Cr - 0.5) / 0.713 + Y
388         G = (Y - 0.299 * R - 0.114 * B) / 0.587
389     RGB [0, 255]
390     """
391     return im
392
393
394 def bits_required(n):
395     n = abs(n)
396     result = 0
397     while n > 0:
398         n >>= 1
399         result += 1
400     return result
401
402
403 def divide_blocks(im, mh, mw):
404     h, w = im.shape[:2]
405     return im.reshape(h // mh, mh, w // mw, mw).swapaxes(1, 2).reshape(-1, mh, mw)
406
407
408 def restore_image(block, nh, nw):
409     bh, bw = block.shape[1:]
410     return block.reshape(nh, nw, bh, bw).swapaxes(1, 2).reshape(nh * bh, nw * bw)
411
412
413 def flatten(lst):
414     return [item for sublist in lst for item in sublist]
415
416

```

```

417 def averageMatrix(
418     arrayMatrix,
419 ): # given an array of 2D-array, return the average (coef by coef) 2D array
420     avgMatrix = np.zeros_like(arrayMatrix[0])
421     for i in range(avgMatrix.shape[0]):
422         for j in range(avgMatrix.shape[1]):
423             avgMatrix[i, j] = np.average(arrayMatrix[:, i, j])
424     return avgMatrix
425
426
427 if __name__ == "__main__":
428     arrMatrix = np.array([[1, 2], [3, 4]], [[5, 2], [3, 4]])
429     print(averageMatrix(arrMatrix))
430

```

encoder/huffman_jpeg.py

```

1  import numpy as np
2
3  MAX_CLEN = 32 # assumed maximum initial code length
4
5
6  def getFreq(data):
7      freq = [0] * 257
8      for elem in data:
9          freq[elem] += 1
10     freq[256] = 1
11     return freq
12
13
14  def jpegGenerateOptimalTable(freq):
15     bits = [0] * (MAX_CLEN + 1)
16     bitPos = [0] * (MAX_CLEN + 1)
17     codesize = [0] * 257

```

```
18 nzIndex = [0] * 257
19
20 others = [-1] * 257
21
22 numNzSymbols = 0
23 for i in range(257):
24     if freq[i]:
25         nzIndex[numNzSymbols] = i
26         freq[numNzSymbols] = freq[i]
27         numNzSymbols += 1
28
29 huffval = [0] * (numNzSymbols - 1)
30
31 while True:
32     c1 = -1
33     c2 = -1
34     v = 1000000000
35     v2 = 1000000000
36     for i in range(numNzSymbols):
37         if freq[i] <= v2:
38             if freq[i] <= v:
39                 c2 = c1
40                 v2 = v
41                 v = freq[i]
42                 c1 = i
43             else:
44                 v2 = freq[i]
45                 c2 = i
46
47     if c2 < 0:
48         break
49
50     freq[c1] += freq[c2]
51     freq[c2] = 1000000001
52
53     codesize[c1] += 1
54     while others[c1] >= 0:
55         c1 = others[c1]
```

```
56         codesize[c1] += 1
57
58     others[c1] = c2
59
60     codesize[c2] += 1
61     while others[c2] >= 0:
62         c2 = others[c2]
63         codesize[c2] += 1
64
65     for i in range(numNzSymbols):
66         bits[codesize[i]] += 1
67
68     p = 0
69     for i in range(1, MAX_CLEN + 1):
70         bitPos[i] = p
71         p += bits[i]
72
73     for i in range(MAX_CLEN, 16, -1):
74         while bits[i] > 0:
75             j = i - 2
76             while bits[j] == 0:
77                 j -= 1
78             bits[i] -= 2
79             bits[i - 1] += 1
80             bits[j + 1] += 2
81             bits[j] -= 1
82
83     i = MAX_CLEN
84     while bits[i] == 0:
85         i -= 1
86     bits[i] -= 1
87
88     for i in range(numNzSymbols - 1):
89         huffval[bitPos[codesize[i]]] = nzIndex[i]
90         bitPos[codesize[i]] += 1
91
92     return bits, huffval
93
```

```

94
95 def jpegGenerateHuffmanTable(bits, huffval):
96     huffsize = [0] * 257
97     huffcode = [0] * 257
98
99     p = 0
100    for l in range(1, 17):
101        i = bits[l]
102        while i:
103            huffsize[p] = l
104            p += 1
105            i -= 1
106
107    huffsize[p] = 0
108    lastp = p
109
110    code = 0
111    si = huffsize[0]
112    p = 0
113    while huffsize[p]:
114        while huffsize[p] == si:
115            huffcode[p] = code
116            code += 1
117            p += 1
118            code <= 1
119            si += 1
120
121    ehufco = [0] * 257
122    ehufsi = [0] * 257
123
124    for p in range(lastp):
125        i = huffval[p]
126        ehufco[i] = huffcode[p]
127        ehufsi[i] = huffsize[p]
128
129    return ehufsi, ehufco
130
131

```

```

132 def jpegTransformTable(ehufsi, ehufco):
133     table = {}
134     for i in range(len(ehufco)):
135         if ehufsi[i] != 0:
136             endCode = bin(ehufco[i])[2:]
137             nbZeros = ehufsi[i] - len(endCode)
138             table[i] = "0" * nbZeros + endCode
139     return table
140
141
142 def jpegCreateHuffmanTable(arr):
143     freq = getFreq(arr)
144     bits, huffval = jpegGenerateOptimalTable(freq)
145     ehufsi, ehufco = jpegGenerateHuffmanTable(bits, huffval)
146     table = jpegTransformTable(ehufsi, ehufco)
147     return table
148
149
150 def convert_huffman_table(table):
151     """convert huffman table to count and weigh"""
152     # table[int] = string
153     pairs = sorted(table.items(), key=lambda x: (len(x[1]), x[1]))
154     weigh, codes = zip(*pairs)
155     weigh = np.array(weigh, dtype=np.uint8)
156     # count[i]: there are count[i] codes of length i+1
157     count = np.zeros(16, dtype=np.uint8)
158     for c in codes:
159         count[len(c) - 1] += 1
160     return count, weigh
161
162
163 def read_huffman_code(table, stream):
164     prefix = ""
165     while prefix not in table:
166         prefix += str(stream.read_bit())
167     return table[prefix]
168
169

```

```

170 def reverse(table):
171     return {v: k for k, v in table.items()}
172
173
174 # 4 recommended huffman tables in JPEG standard
175 # luminance DC
176 RM_Y_DC = {
177     "00": 0,
178     "010": 1,
179     "011": 2,
180     "100": 3,
181     "101": 4,
182     "110": 5,
183     "1110": 6,
184     "11110": 7,
185     "111110": 8,
186     "1111110": 9,
187     "11111110": 10,
188     "111111110": 11,
189 }
190
191 # luminance AC
192 RM_Y_AC = {
193     "00": 1,
194     "01": 2,
195     "100": 3,
196     "1010": 0,
197     "1011": 4,
198     "1100": 17,
199     "11010": 5,
200     "11011": 18,
201     "11100": 33,
202     "111010": 49,
203     "111011": 65,
204     "1111000": 6,
205     "1111001": 19,
206     "1111010": 81,
207     "1111011": 97,

```

```
208 "11111000": 7,  
209 "11111001": 34,  
210 "11111010": 113,  
211 "111110110": 20,  
212 "111110111": 50,  
213 "111111000": 129,  
214 "111111001": 145,  
215 "111111010": 161,  
216 "1111110110": 8,  
217 "1111110111": 35,  
218 "1111111000": 66,  
219 "1111111001": 177,  
220 "1111111010": 193,  
221 "11111110110": 21,  
222 "11111110111": 82,  
223 "11111111000": 209,  
224 "11111111001": 240,  
225 "111111110100": 36,  
226 "111111110101": 51,  
227 "111111110110": 98,  
228 "111111110111": 114,  
229 "1111111110000000": 130,  
230 "1111111110000010": 9,  
231 "1111111110000011": 10,  
232 "1111111110000100": 22,  
233 "1111111110000101": 23,  
234 "1111111110000110": 24,  
235 "1111111110000111": 25,  
236 "1111111110001000": 26,  
237 "1111111110001001": 37,  
238 "1111111110001010": 38,  
239 "1111111110001011": 39,  
240 "1111111110001100": 40,  
241 "1111111110001101": 41,  
242 "1111111110001110": 42,  
243 "1111111110001111": 52,  
244 "11111111110010000": 53,  
245 "11111111110010001": 54,
```


246 "1111111110010010": 55,
247 "1111111110010011": 56,
248 "1111111110010100": 57,
249 "1111111110010101": 58,
250 "1111111110010110": 67,
251 "1111111110010111": 68,
252 "1111111110011000": 69,
253 "1111111110011001": 70,
254 "1111111110011010": 71,
255 "1111111110011011": 72,
256 "1111111110011100": 73,
257 "1111111110011101": 74,
258 "1111111110011110": 83,
259 "1111111110011111": 84,
260 "1111111110100000": 85,
261 "1111111110100001": 86,
262 "1111111110100010": 87,
263 "1111111110100011": 88,
264 "1111111110100100": 89,
265 "1111111110100101": 90,
266 "1111111110100110": 99,
267 "1111111110100111": 100,
268 "1111111110101000": 101,
269 "1111111110101001": 102,
270 "1111111110101010": 103,
271 "1111111110101011": 104,
272 "1111111110101100": 105,
273 "1111111110101101": 106,
274 "1111111110101110": 115,
275 "1111111110101111": 116,
276 "1111111110110000": 117,
277 "1111111110110001": 118,
278 "1111111110110010": 119,
279 "1111111110110011": 120,
280 "1111111110110100": 121,
281 "1111111110110101": 122,
282 "1111111110110110": 131,
283 "1111111110110111": 132,

284	"1111111110111000": 133,
285	"1111111110111001": 134,
286	"1111111110111010": 135,
287	"1111111110111011": 136,
288	"1111111110111100": 137,
289	"1111111110111101": 138,
290	"1111111110111110": 146,
291	"1111111110111111": 147,
292	"1111111111000000": 148,
293	"1111111111000001": 149,
294	"1111111111000010": 150,
295	"1111111111000011": 151,
296	"1111111111000100": 152,
297	"1111111111000101": 153,
298	"1111111111000110": 154,
299	"1111111111000111": 162,
300	"1111111111001000": 163,
301	"1111111111001001": 164,
302	"1111111111001010": 165,
303	"1111111111001011": 166,
304	"1111111111001100": 167,
305	"1111111111001101": 168,
306	"1111111111001110": 169,
307	"1111111111001111": 170,
308	"1111111111010000": 178,
309	"1111111111010001": 179,
310	"1111111111010010": 180,
311	"1111111111010011": 181,
312	"1111111111010100": 182,
313	"1111111111010101": 183,
314	"1111111111010110": 184,
315	"1111111111010111": 185,
316	"1111111111011000": 186,
317	"1111111111011001": 194,
318	"1111111111011010": 195,
319	"1111111111011011": 196,
320	"1111111111011100": 197,
321	"1111111111011101": 198,

```
322 "1111111111011110": 199,
323 "1111111111011111": 200,
324 "1111111111100000": 201,
325 "1111111111100001": 202,
326 "1111111111100010": 210,
327 "1111111111100011": 211,
328 "1111111111100100": 212,
329 "1111111111100101": 213,
330 "1111111111100110": 214,
331 "1111111111100111": 215,
332 "1111111111101000": 216,
333 "1111111111101001": 217,
334 "1111111111101010": 218,
335 "1111111111101011": 225,
336 "1111111111101100": 226,
337 "1111111111101101": 227,
338 "1111111111101110": 228,
339 "1111111111101111": 229,
340 "1111111111110000": 230,
341 "1111111111110001": 231,
342 "1111111111110010": 232,
343 "1111111111110011": 233,
344 "1111111111110100": 234,
345 "1111111111110101": 241,
346 "1111111111110110": 242,
347 "1111111111110111": 243,
348 "1111111111111000": 244,
349 "1111111111111001": 245,
350 "1111111111111010": 246,
351 "1111111111111011": 247,
352 "1111111111111100": 248,
353 "1111111111111101": 249,
354 "1111111111111110": 250,
355 }
```

```
357 # chroma DC
```

```
358 RM_C_DC = {
359     "00": 0,
```

```
360     "01": 1,
361     "10": 2,
362     "110": 3,
363     "1110": 4,
364     "11110": 5,
365     "111110": 6,
366     "1111110": 7,
367     "11111110": 8,
368     "111111110": 9,
369     "1111111110": 10,
370     "11111111110": 11,
371 }
372
373 # chroma AC
374 RM_C_AC = {
375     "00": 0,
376     "01": 1,
377     "100": 2,
378     "1010": 3,
379     "1011": 17,
380     "11000": 4,
381     "11001": 5,
382     "11010": 33,
383     "11011": 49,
384     "111000": 6,
385     "111001": 18,
386     "111010": 65,
387     "111011": 81,
388     "1111000": 7,
389     "1111001": 97,
390     "1111010": 113,
391     "11110110": 19,
392     "11110111": 34,
393     "11111000": 50,
394     "11111001": 129,
395     "111110100": 8,
396     "111110101": 20,
397     "111110110": 66,
```

398 "111110111": 145,
399 "111111000": 161,
400 "111111001": 177,
401 "111111010": 193,
402 "1111110110": 9,
403 "1111110111": 35,
404 "1111111000": 51,
405 "1111111001": 82,
406 "1111111010": 240,
407 "11111110110": 21,
408 "11111110111": 98,
409 "11111111000": 114,
410 "11111111001": 209,
411 "111111110100": 10,
412 "111111110101": 22,
413 "111111110110": 36,
414 "111111110111": 52,
415 "11111111100000": 225,
416 "111111111000010": 37,
417 "111111111000011": 241,
418 "1111111110001000": 23,
419 "1111111110001001": 24,
420 "1111111110001010": 25,
421 "1111111110001011": 26,
422 "1111111110001100": 38,
423 "1111111110001101": 39,
424 "1111111110001110": 40,
425 "1111111110001111": 41,
426 "1111111110010000": 42,
427 "1111111110010001": 53,
428 "1111111110010010": 54,
429 "1111111110010011": 55,
430 "1111111110010100": 56,
431 "1111111110010101": 57,
432 "1111111110010110": 58,
433 "1111111110010111": 67,
434 "1111111110011000": 68,
435 "1111111110011001": 69,

436 "1111111110011010": 70,
437 "1111111110011011": 71,
438 "1111111110011100": 72,
439 "1111111110011101": 73,
440 "1111111110011110": 74,
441 "1111111110011111": 83,
442 "1111111110100000": 84,
443 "1111111110100001": 85,
444 "1111111110100010": 86,
445 "1111111110100011": 87,
446 "1111111110100100": 88,
447 "1111111110100101": 89,
448 "1111111110100110": 90,
449 "1111111110100111": 99,
450 "1111111110101000": 100,
451 "1111111110101001": 101,
452 "1111111110101010": 102,
453 "1111111110101011": 103,
454 "1111111110101100": 104,
455 "1111111110101101": 105,
456 "1111111110101110": 106,
457 "1111111110101111": 115,
458 "1111111110110000": 116,
459 "1111111110110001": 117,
460 "1111111110110010": 118,
461 "1111111110110011": 119,
462 "1111111110110100": 120,
463 "1111111110110101": 121,
464 "1111111110110110": 122,
465 "1111111110110111": 130,
466 "1111111110111000": 131,
467 "1111111110111001": 132,
468 "1111111110111010": 133,
469 "1111111110111011": 134,
470 "1111111110111100": 135,
471 "1111111110111101": 136,
472 "1111111110111110": 137,
473 "1111111110111111": 138,

474 "1111111111000000": 146,
475 "1111111111000001": 147,
476 "1111111111000010": 148,
477 "1111111111000011": 149,
478 "1111111111000100": 150,
479 "1111111111000101": 151,
480 "1111111111000110": 152,
481 "1111111111000111": 153,
482 "1111111111001000": 154,
483 "1111111111001001": 162,
484 "1111111111001010": 163,
485 "1111111111001011": 164,
486 "1111111111001100": 165,
487 "1111111111001101": 166,
488 "1111111111001110": 167,
489 "1111111111001111": 168,
490 "1111111111010000": 169,
491 "1111111111010001": 170,
492 "1111111111010010": 178,
493 "1111111111010011": 179,
494 "1111111111010100": 180,
495 "1111111111010101": 181,
496 "1111111111010110": 182,
497 "1111111111010111": 183,
498 "1111111111011000": 184,
499 "1111111111011001": 185,
500 "1111111111011010": 186,
501 "1111111111011011": 194,
502 "1111111111011100": 195,
503 "1111111111011101": 196,
504 "1111111111011110": 197,
505 "1111111111011111": 198,
506 "1111111111100000": 199,
507 "1111111111100001": 200,
508 "1111111111100010": 201,
509 "1111111111100011": 202,
510 "1111111111100100": 210,
511 "1111111111100101": 211,

```

512     "1111111111100110": 212,
513     "1111111111100111": 213,
514     "1111111111101000": 214,
515     "1111111111101001": 215,
516     "1111111111101010": 216,
517     "1111111111101011": 217,
518     "1111111111101100": 218,
519     "1111111111101101": 226,
520     "1111111111101110": 227,
521     "1111111111101111": 228,
522     "1111111111100000": 229,
523     "111111111110001": 230,
524     "111111111110010": 231,
525     "111111111110011": 232,
526     "111111111110100": 233,
527     "111111111110101": 234,
528     "111111111110110": 242,
529     "111111111110111": 243,
530     "111111111111000": 244,
531     "111111111111001": 245,
532     "111111111111010": 246,
533     "111111111111011": 247,
534     "111111111111100": 248,
535     "111111111111101": 249,
536     "111111111111110": 250,
537 }
538
539 if __name__ == "__main__":
540     arr = np.array([np.random.randint(-127, 128) for _ in range(64)])
541     table = jpegCreateHuffmanTable(arr)
542     print(table)
543

```

encoder/encoder.py


```

1 from math import ceil
2 import cv2
3 import numpy as np
4 from PIL import Image
5 from pathlib import Path
6
7 from utils import *
8 from huffman_jpeg import *
9
10
11 def padding(im, mh, mw):
12     """
13     pad use boundary pixels so that its height and width are
14     the multiple of the height and width of MCUs, respectively
15     """
16     h, w, d = im.shape
17     if h % mh == 0 and w % mw == 0:
18         return im
19     hh, ww = ceil(h / mh) * mh, ceil(w / mw) * mw
20     im_ex = np.zeros_like(im, shape=(hh, ww, d))
21     im_ex[:h, :w] = im
22     im_ex[:, w:] = im_ex[:, w - 1 : w]
23     im_ex[h:, :] = im_ex[h - 1 : h, :]
24     return im_ex
25
26
27 mcu_sizes = {
28     "4:2:0": (BH * 2, BW * 2),
29     "4:1:1": (BH * 2, BW * 2),
30     "4:2:2": (BH, BW * 2),
31     "4:4:4": (BH, BW),
32 }
33
34
35 def scan_blocks(mcu, mh, mw):
36     """
37     scan MCU to blocks for DPCM, for 4:2:0, the scan order is as follows:

```

```

38 | ----- | -----
39 | 0 | 1 | | 4 | 5 |
40 | ----- | -----
41 | 2 | 3 | | 6 | 7 |
42 | ----- | -----
43 | ""
44 blocks = (
45     mcu.reshape(-1, mh // BH, BH, mw // BW, BW).swapaxes(2, 3).reshape(-1, BH, BW)
46 )
47 return blocks
48
49
50 def DCT(blocks):
51     dct = np.zeros_like(blocks)
52     for i in range(blocks.shape[0]):
53         dct[i] = cv2.dct(blocks[i])
54     return dct
55
56
57 def zigzag_encode(dct):
58     trace = zigzag_points(BH, BW)
59     zz = np.zeros_like(dct).reshape(-1, BH * BW)
60     for i, p in enumerate(trace):
61         zz[:, i] = dct[:, p[0], p[1]]
62     return zz
63
64
65 def quantization(dct, table):
66     ret = dct / table[None]
67     return np.round(ret).astype(np.int32)
68
69
70 def DPCM(dct):
71     """
72     encode the DC differences
73     """
74     dc_pred = dct.copy()
75     dc_pred[1:, 0] = dct[1:, 0] - dct[:-1, 0]

```

```

76     return dc_pred
77
78
79 def run_length_encode(arr):
80     # determine where the sequence is ending prematurely
81     last_nonzero = -1
82     for i, elem in enumerate(arr):
83         if elem != 0:
84             last_nonzero = i
85     rss, values = [], []
86     run_length = 0
87     for i, elem in enumerate(arr):
88         if i > last_nonzero:
89             rss.append(0)
90             values.append(0)
91             break
92         elif elem == 0 and run_length < 15:
93             run_length += 1
94         else:
95             size = bits_required(elem)
96             rss.append((run_length << 4) + size)
97             values.append(elem)
98             run_length = 0
99     return rss, values
100
101
102 def encode_header(qts, hts, cop_infos, height, width):
103     writer = BytesWriter()
104     add_bytes = writer.add_bytes
105     add_bytes(
106         MARKER.SOI,
107         MARKER.APP0,
108         b"\x00\x10", # length = 16
109         b"JFIF\x00", # identifier = JFIF0
110         b"\x01\x01", # version
111         b"\x00", # unit
112         b"\x00\x01", # x density
113         b"\x00\x01", # y density

```

```

114         b"\x00\x00", # thumbnail data
115     )
116     for id_, qt in enumerate(qts):
117         add_bytes(
118             MARKER.DQT,
119             b"\x00C", # length = 67
120             # precision (8 bits), table id, = 0, id_
121             int2bytes(id_, 1),
122             qt.astype(np.uint8).tobytes(),
123         )
124     cop_num = len(cop_infos)
125     add_bytes(
126         MARKER.SOF0,
127         int2bytes(8 + 3 * cop_num, 2), # length
128         int2bytes(8, 1), # 8 bit precision
129         int2bytes(height, 2),
130         int2bytes(width, 2),
131         int2bytes(cop_num, 1),
132     )
133     add_bytes(*[info.encode_SOF0_info() for info in cop_infos])
134
135     # type <= 4 + id, (type 0: DC, 1 : AC)
136     type_ids = [b"\x00", b"\x10", b"\x01", b"\x11"]
137     for type_id, ht in zip(type_ids, hts):
138         count, weigh = convert_huffman_table(ht)
139         ht_bytes = count.tobytes() + weigh.tobytes()
140         add_bytes(
141             MARKER.DHT,
142             int2bytes(len(ht_bytes) + 3, 2), # length
143             type_id,
144             ht_bytes,
145         )
146
147     add_bytes(
148         MARKER.SOS,
149         int2bytes(6 + cop_num * 2, 2), # length
150         int2bytes(cop_num, 1),
151     )

```

```

152 add_bytes(*[info.encode_SOS_info() for info in cop_infos])
153 add_bytes(b"\x00\x3f\x00")
154 return writer
155
156
157 def encode_mcu(mcu, hts):
158     bit_stream = BitStreamWriter()
159     for cur in mcu:
160         for dct, (dc_ht, ac_ht) in zip(cur, hts):
161             dc_code = encode_2s_complement(dct[0])
162             container = [dc_ht[len(dc_code)], dc_code]
163             rss, values = run_length_encode(dct[1:])
164             for rs, v in zip(rss, values):
165                 container.append(ac_ht[rs])
166                 container.append(encode_2s_complement(v))
167             bitstring = "".join(container)
168             bit_stream.write_bitstring(bitstring)
169     return bit_stream.to_bytes()
170
171
172 def encode_jpeg(im, quality=95, subsample="4:2:0", use_rm_ht=True):
173     im = np.expand_dims(im, axis=-1) if im.ndim == 2 else im
174     height, width, depth = im.shape
175
176     mh, mw = mcu_sizes[subsample] if depth == 3 else (BH, BW)
177     im = padding(im, mh, mw)
178     im = RGB2YCbCr(im) if depth == 3 else im
179
180     # DC level shift for luminance,
181     # the shift of chroma was completed by color conversion
182     Y_im = im[:, :, 0] - 128
183     # divide image into MCUs
184     mcu = divide_blocks(Y_im, mh, mw)
185     # MCU to blocks, for luminance there are more than one blocks in each MCU
186     Y = scan_blocks(mcu, mh, mw)
187     Y_dct = DCT(Y)
188     # the quantization table was already processed by zigzag scan,
189     # so we apply zigzag encoding to DCT block first

```

```

190 Y_z = zigzag_encode(Y_dct)
191 qt_y = load_quantization_table(quality, "lum")
192 Y_q = quantization(Y_z, qt_y)
193 Y_p = DPCM(Y_q)
194 # whether to use recommended huffman table
195 if use_rm_ht:
196     Y_dc_ht, Y_ac_ht = reverse(RM_Y_DC), reverse(RM_Y_AC)
197 else:
198     Y_dc_ht = jpegCreateHuffmanTable(np.vectorize(bits_required)(Y_p[:, 0]))
199     Y_ac_ht = jpegCreateHuffmanTable(
200         flatten(run_length_encode(Y_p[i, 1:])[0] for i in range(Y_p.shape[0]))
201     )
202 qts, hts = [qt_y], [Y_dc_ht, Y_ac_ht]
203 cop_infos = [ComponentInfo(1, mw // BW, mh // BH, 0, 0, 0)]
204 # the number of Y DCT blocks in an MCU
205 num = (mw // BW) * (mh // BH)
206 mcu_hts = [(Y_dc_ht, Y_ac_ht) for _ in range(num)]
207 # assign DCT blocks to MCUs
208 mcu_ = Y_p.reshape(-1, num, BH * BW)
209
210 if depth == 3:
211     # chroma subsample
212     ch = im[:, :, mh // BH, :: mw // BW, 1:]
213     Cb = divide_blocks(ch[:, :, 0], BH, BW)
214     Cr = divide_blocks(ch[:, :, 1], BH, BW)
215     Cb_dct, Cr_dct = DCT(Cb), DCT(Cr)
216     Cb_z, Cr_z = zigzag_encode(Cb_dct), zigzag_encode(Cr_dct)
217     qt_c = load_quantization_table(quality, "chr")
218     Cb_q, Cr_q = quantization(Cb_z, qt_c), quantization(Cr_z, qt_c)
219     Cb_p, Cr_p = DPCM(Cb_q), DPCM(Cr_q)
220     if use_rm_ht:
221         C_dc_ht, C_ac_ht = reverse(RM_C_DC), reverse(RM_C_AC)
222     else:
223         ch_ = np.concatenate([Cb_p, Cr_p], axis=0)
224         C_dc_ht = jpegCreateHuffmanTable(np.vectorize(bits_required)(ch[:, 0]))
225         C_ac_ht = jpegCreateHuffmanTable(
226             flatten(run_length_encode(ch[:, 1:])[0] for i in range(ch_.shape[0]))
227         )

```

```

228     qts.append(qt_c), hts.extend([C_dc_ht, C_ac_ht])
229     cop_infos.extend(
230         [ComponentInfo(2, 1, 1, 1, 1, 1), ComponentInfo(3, 1, 1, 1, 1, 1)]
231     )
232     mcu_hts.extend((C_dc_ht, C_ac_ht) for _ in range(2))
233     mcu_ = np.concatenate([mcu_, Cb_p[:, None], Cr_p[:, None]], axis=1)
234
235     writer = encode_header(qts, hts, cop_infos, height, width)
236     bytes_ = encode_mcu(mcu_, mcu_hts)
237     writer.write(bytes_.replace(b"\xff", b"\xff\x00"))
238     writer.write(MARKER.EOI)
239     return writer.getvalue()
240
241
242 def write_jpeg(filename, im, quality=95, subsample="4:2:0", use_rm_ht=True):
243     bytes_ = encode_jpeg(im, quality, subsample, use_rm_ht)
244     Path(filename).write_bytes(bytes_)
245
246
247 def main():
248     im = Image.open("./data/villeLyon.jpg")
249     write_jpeg("data/villeLyonLow.jpg", np.array(im), 5, "4:1:1", False)
250
251
252 if __name__ == "__main__":
253     main()
254

```

encoder/comparator.py

```

1 import numpy as np
2 import encoder
3 import sys, os
4 from pathlib import Path

```

```

5 from PIL import Image
6 import cv2
7 import pandas as pd
8 import time as t
9 import shutil
10 import utils
11 import matplotlib.pyplot as plt
12 from encoder import DCT, padding
13 from scipy.fftpack import dct
14 import random as rd
15
16 LIM = 2 # number of files to test to
17
18
19 def compare(
20     qualities=None,
21     dataDirectory=None,
22     outputDirectory=None,
23     subsamples=None,
24     useStdHuffmanTable=None,
25     DeleteFilesAfterward=True,
26 ):
27     if qualities is None:
28         qualities = [np.random.randint(0, 101)]
29     if subsamples is None:
30         subsamples = ["4:2:2"]
31     if dataDirectory is None:
32         dataDirectory = "./data/datasetBmp"
33     if useStdHuffmanTable is None:
34         useStdHuffmanTable = [False]
35     stat = np.zeros(
36         (LIM * len(qualities) * len(subsamples) * len(useStdHuffmanTable), 6),
37         dtype=object,
38     ) # dim 0 : quality factor, dim 1 : subsample method, dim 2 : usage of std Hf Tables, dim 3 : size
39     before compression, dim 4 : size after compression, dim 5 : time to compress
40     i = 0
41     i_max = LIM * len(qualities) * len(subsamples) * len(useStdHuffmanTable)
42     filesTreated = rd.choices(os.listdir(dataDirectory), k=LIM)

```



```

42 for quality in qualities:
43     for subsample in subsamples:
44         for hfTables in useStdHuffmanTable:
45             outputDirectory = f"./data/treated/quality{quality}-subsample{subsample}-stdHf{hfTables}"
46             for filename in filesTreated:
47                 f = os.path.join(dataDirectory, filename)
48                 if not os.path.exists(outputDirectory):
49                     os.makedirs(outputDirectory)
50                 f_out = os.path.join(outputDirectory, filename + ".jpg")
51                 if os.path.isfile(f):
52                     previousSize = os.stat(f).st_size
53                     image = Image.open(f)
54                     time = t.time()
55                     encoder.write_jpeg(
56                         f_out, np.array(image), quality, subsample, hfTables
57                     )
58                     time = t.time() - time
59                     newSize = os.stat(f_out).st_size
60                     stat[i][0] = quality
61                     stat[i][1] = subsample
62                     stat[i][2] = hfTables
63                     stat[i][3] = previousSize
64                     stat[i][4] = newSize
65                     stat[i][5] = time
66                     i += 1
67                     print(f"{i}/{i_max}", end="\r")
68             if DeleteFilesAfterward:
69                 shutil.rmtree(outputDirectory)
70     return stat
71
72
73 def write_stat(statFile, stat, quality, subsample, standHuffTables):
74     with open(statFile, "a+") as f:
75         f.write("\n" * 2)
76         f.write("New sample \n")
77         f.write(f"Size of sample : {LIM} images \n")
78         f.write(

```

```

79         f"Parameters of compression : (quality) {quality}, (subsample) {subsample}, (usage of standard
HuffTables) {'Yes' if standHuffTables else 'No'} \n"
80     )
81     avgPreviousSize = np.average(stat[:, 0])
82     avgNewSize = np.average(stat[:, 1])
83     f.write(
84         f"Average size of image before compression : {avgPreviousSize} bytes \n"
85     )
86     f.write(f"Average size of images after compression : {avgNewSize} bytes \n")
87     f.write(f"Ratio is {avgPreviousSize / avgNewSize:.2f}")
88
89
90 def write_stat_csv(output, stat):
91     if os.path.isfile(output):
92         pd.DataFrame(stat).to_csv(output, mode="a", index=False, header=False)
93     else:
94         pd.DataFrame(stat).to_csv(
95             output,
96             index=False,
97             header=[
98                 "quality",
99                 "subsample",
100                 "stdHuffmanTables",
101                 "oldSize",
102                 "newSize",
103                 "time",
104             ],
105         )
106
107
108 def csv_to_stat(csvFile):
109     stat = pd.read_csv(csvFile)
110     return stat
111
112
113 def dataInterpretation(dataFrame):
114     df = dataFrame
115     qualities = df["quality"].unique()

```

```

116 qualitySize = {}
117 qualityTime = {}
118 for quality in qualities:
119     qualitySize[quality] = int(df[df["quality"] == quality]["newSize"].mean())
120     qualityTime[quality] = round(df[df["quality"] == quality]["time"].mean(), 3)
121 stdSize = int(df[df["stdHuffmanTables"] == True]["newSize"].mean())
122 stdTime = round(df[df["stdHuffmanTables"] == True]["time"].mean(), 3)
123 nonStdSize = int(df[df["stdHuffmanTables"] == False]["newSize"].mean())
124 nonStdTime = round(df[df["stdHuffmanTables"] == False]["time"].mean(), 3)
125
126 plt.rcParams["figure.figsize"] = [10, 5]
127
128 fig, (ax1, ax3) = plt.subplots(1, 2)
129 ax2 = ax1.twinx()
130
131 fig.suptitle("Comparaison des compressions en fonction du facteur de qualité")
132
133 width = 0.25
134
135 initialSize = 786486
136 xaxis = list(qualitySize.keys())
137 yaxisSize = np.array(list(qualitySize.values()))
138 yaxisTime = np.array(list(qualityTime.values()))
139 yaxisRatio = (initialSize - yaxisSize) / yaxisTime
140
141 color1 = "tab:red"
142 color2 = "tab:blue"
143 color3 = "tab:green"
144
145 ax1.bar(
146     np.arange(len(qualitySize)) - width,
147     yaxisSize,
148     width,
149     tick_label=xaxis,
150     color=color1,
151     label="Taille après compression",
152 )
153 ax2.bar(

```

```

154     np.arange(len(qualityTime)),
155     yaxisTime,
156     width,
157     tick_label=xaxis,
158     color=color2,
159     label="Temps de compression",
160 )
161 ax3.bar(
162     np.arange(len(qualitySize)),
163     yaxisRatio,
164     width,
165     tick_label=xaxis,
166     color=color3,
167     label="Octets gagnés par seconde",
168 )
169
170 ax1.legend(loc="upper left")
171 ax2.legend(loc="upper left", bbox_to_anchor=(0, 0.9))
172 ax3.legend(loc="upper right")
173
174 ax3.yaxis.tick_right()
175
176 ax1.set_xlabel("Facteur de qualité")
177 ax1.set_ylabel("Taille (en octets)", color=color1)
178 ax2.set_ylabel("Temps (en secondes)", color=color2)
179 ax3.set_xlabel("Facteur de qualité")
180 ax3.set_ylabel("Taille gagné par unité de temps (octets.Hz)", color=color3)
181 ax3.yaxis.set_label_position("right")
182
183 plt.savefig("../data/treated/compressionComparaison", transparent=True)
184
185 plt.rcParams["figure.figsize"] = [7, 5]
186 plt.clf()
187
188 fig = plt.figure()
189 ax1 = fig.add_subplot(111)
190 ax2 = ax1.twinx()
191

```

```

192 fig.suptitle(
193     "Comparaison des compressions en fonction des tables de Huffman utilisées"
194 )
195
196 yaxisSize = [stdSize, nonStdSize]
197 yaxisTime = [stdTime, nonStdTime]
198
199 labels = ["Tables Standards", "Tables Optimales"]
200 ax1.bar(
201     np.arange(2) - width / 2,
202     yaxisSize,
203     width,
204     tick_label=labels,
205     color=color1,
206     label="Taille après compression",
207 )
208 ax2.bar(
209     np.arange(2) + width / 2,
210     yaxisTime,
211     width,
212     tick_label=labels,
213     color=color2,
214     label="Temps de compression",
215 )
216
217 ax1.legend(loc="upper center", bbox_to_anchor=(0.45, 1))
218 ax2.legend(loc="upper center", bbox_to_anchor=(0.45, 0.9))
219
220 ax1.set_ylabel("Taille (en octets)", color=color1)
221 ax2.set_ylabel("Temps (en secondes)", color=color2)
222
223 plt.savefig("./data/treated/compressionComparaison2", transparent=True)
224
225
226 def energyCompaction( imgPath ):
227     img = cv2.imread( imgPath )
228
229     imgYCrCb = cv2.cvtColor(

```

```

230     img, cv2.COLOR_RGB2YCrCb
231 ) # Convert RGB to YCrCb (Cb applies V, and Cr applies U).
232
233 Y, Cr, Cb = cv2.split(padding(imgYCrCb, 8, 8))
234 Y = Y.astype("int") - 128
235 blocks_Y = utils.divide_blocks(Y, 8, 8)
236 dctBlocks_Y = np.zeros_like(blocks_Y)
237 for i in range(len(blocks_Y)):
238     dctBlocks_Y[i] = dct(
239         dct(blocks_Y[i], axis=0, norm="ortho"), axis=1, norm="ortho"
240     )
241 avg_Y = utils.averageMatrix(blocks_Y)
242 avgDct_Y = utils.averageMatrix(dctBlocks_Y)
243
244 x = np.random.randint(blocks_Y.shape[0])
245 arr1 = blocks_Y[x]
246 arr2 = dctBlocks_Y[x]
247
248 fig, (ax1, ax2) = plt.subplots(1, 2)
249
250 valueMax, valueMin = max(np.max(arr1), np.max(arr2)), min(
251     np.min(arr1), np.min(arr2)
252 )
253 # fig.suptitle('Matrice de la luminance de "villeLyon.jpg"')
254
255 ax1.matshow(arr1, cmap="cool", vmin=valueMin, vmax=valueMax)
256 ax1.set_title("avant DCT")
257
258 ax2.matshow(arr2, cmap="cool", vmin=valueMin, vmax=valueMax)
259 ax2.set_title("après DCT")
260
261 for i in range(arr1.shape[0]):
262     for j in range(arr1.shape[1]):
263         cNormal = int(arr1[i, j])
264         cDct = int(arr2[i, j])
265         ax1.text(i, j, str(cNormal), va="center", ha="center")
266         ax2.text(i, j, str(cDct), va="center", ha="center")
267 plt.savefig("./data/energyCompaction.png", transparent=True)

```

```

268
269
270 def rgbToYCbCr_channel_bis():
271     img = cv2.imread("./data/villeLyon.jpg") # Read input image in BGR format
272
273     imgYCrCb = cv2.cvtColor(
274         img, cv2.COLOR_BGR2YCrCb
275     ) # Convert RGB to YCrCb (Cb applies V, and Cr applies U).
276
277     Y, Cr, Cb = cv2.split(imgYCrCb)
278
279     # Fill Y and Cb with 128 (Y level is middle gray, and Cb is "neutralized").
280     onlyCr = imgYCrCb.copy()
281     onlyCr[:, :, 0] = 128
282     onlyCr[:, :, 2] = 128
283     onlyCr_as_bgr = cv2.cvtColor(
284         onlyCr, cv2.COLOR_YCrCb2BGR
285     ) # Convert to BGR - used for display as false color
286
287     # Fill Y and Cr with 128 (Y level is middle gray, and Cr is "neutralized").
288     onlyCb = imgYCrCb.copy()
289     onlyCb[:, :, 0] = 128
290     onlyCb[:, :, 1] = 128
291     onlyCb_as_bgr = cv2.cvtColor(
292         onlyCb, cv2.COLOR_YCrCb2BGR
293     ) # Convert to BGR - used for display as false color
294
295     cv2.imshow("img", img)
296     cv2.imshow("Y", Y)
297     cv2.imshow("onlyCb_as_bgr", onlyCb_as_bgr)
298     cv2.imshow("onlyCr_as_bgr", onlyCr_as_bgr)
299     cv2.waitKey()
300     cv2.destroyAllWindows()
301
302     cv2.imwrite("./data/treated/villeLyon_Y.jpg", Y)
303     cv2.imwrite("./data/treated/villeLyon_Cb.jpg", onlyCb_as_bgr)
304     cv2.imwrite("./data/treated/villeLyon_Cr.jpg", onlyCr_as_bgr)
305

```

```

306
307 if __name__ == "__main__":
308     # compare()
309     # rgbToYCbCr_channel_bis()
310     # energyCompaction("./data/villeLyon.jpg")
311     # test = np.array([[93, 90, 83, 68, 61, 61, 46, 21],
312     #                  [102, 92, 95, 77, 65, 60, 49, 32],
313     #                  [69, 55, 47, 57, 65, 60, 72, 65],
314     #                  [55, 55, 40, 42, 23, 1, 11, 38],
315     #                  [55, 57, 47, 53, 35, 59, -2, 26],
316     #                  [64, 41, 42, 55, 60, 57, 25, -8],
317     #                  [77, 87, 58, -2, -5, 14, -10, -35],
318     #                  [38, 14, 33, 33, -21, -23, -43, -34]])
319     # print(dct(dct(test, axis=0, norm="ortho"), axis=1, norm='ortho'))
320
321     # stat = compare(qualities = list(range(1, 101, 10)), subsamples=['4:4:4', '4:2:0', '4:1:1', '4:2:2'],
322     useStdHuffmanTable=[True, False], DeleteFilesAfterward=True)
323     # write_stat_csv("./data/treated/stat.csv", stat)
324     stat = csv_to_stat("./data/treated/stat.csv")
325     dataInterpreation(stat)

```