

DIGITAL IMAGE PROCESSING

FINAL PROJECT

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(***)**

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WINTER - 1401

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I.

INTRODUCTION

An overview of the final project, requirements, motives and goals

INTRODUCTION

Includes two main tasks:
compression and watermarking
Highlights the applications of DWT

Compression

- “Art and science of reducing the amount of required data for representation”
- Exists because data can be redundant and/or unnecessary
- Useful since a lot of data exists!
- Less requirements to save, share and process
- Can be lossy or lossless

INTRODUCTION

Watermarking

- Adding extra data for a purpose
- Somehow the opposite of compression
- Useful since a lot of data exists, again!
- Used for authentication and copyright issues

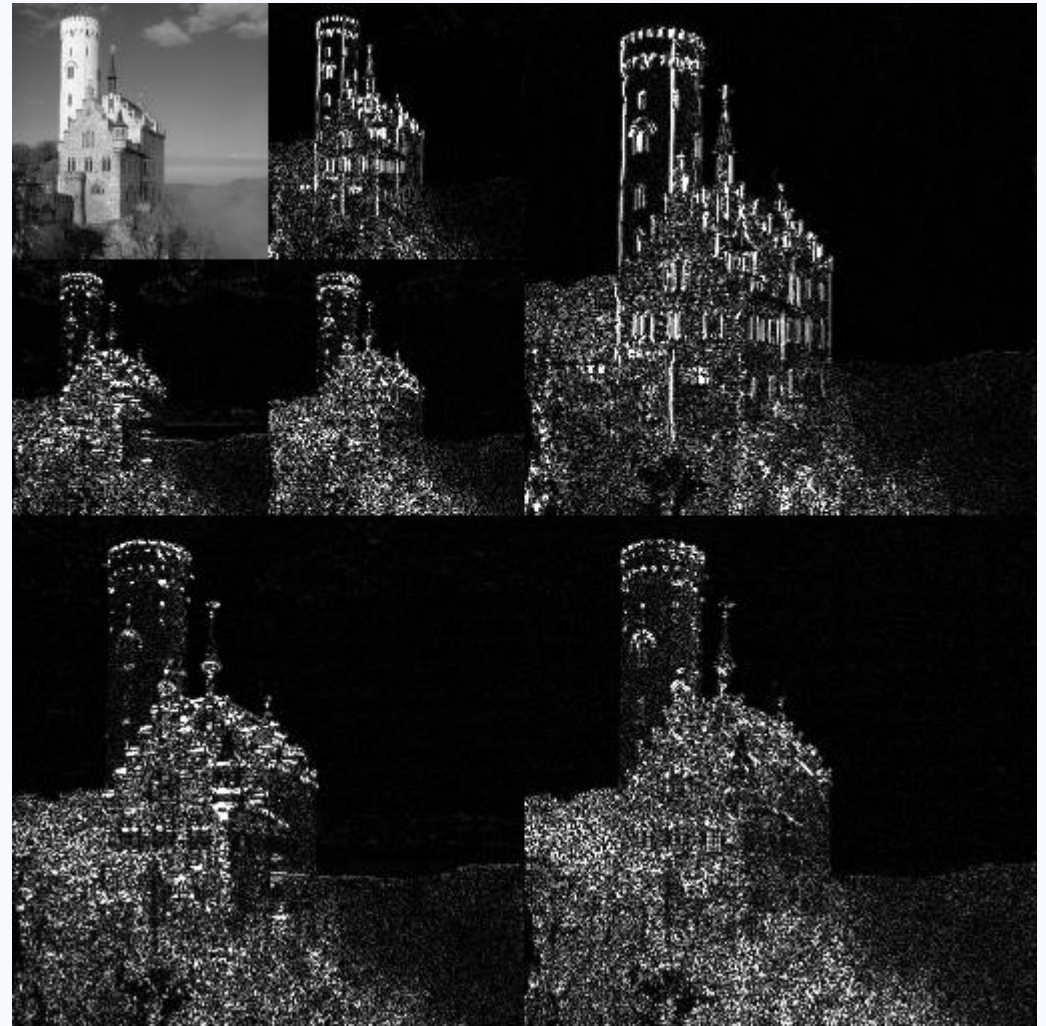
INTRODUCTION

DWT

- Both tasks require DWT
- Discrete wavelet transform
- Sampling different wavelets separately
- Works like FFT; but better because considers temporal resolution (freq. and location)
- Based on mother wavelets: Haar, Daubechies, etc.
- Used in many methods: JPEG2000, JPEG XS, DjVu,

INTRODUCTION

Example:
coefficient matrices for 2-D, 2-level DWT



II.

COMPRESSION

Thoughts, results and
details on the first main
task: Image compression
using DWT

HIGHLIGHTS

Method

- Read 3 images
- Use 2-D DWT (Haar and Daubechies) to compress
- Quantize coefficients (local/global)
- Compare original and compressed images using MSE and PSNR metrics
- Show results in every step

Challenges

- Input images need to be diverse, include different frequency bands
- Some representations might be difficult to distinguish on computer screens
- Setting global threshold

Notes

- Images are in 1:1 ratio (square)
- Two images are small and mostly include lower frequencies
- One real life image, large, includes many frequencies and edges
- All color images, but processed in grayscale

Steps

1. Haar 3-L
 - 1.1. with local thresholding
2. Daubechies 3-L
 - 2.1. with local thresholding
3. Haar 5-L
 - 3.1. with local thresholding
4. Daubechies 5-L
 - 4.1. with local thresholding
5. Results

Image 1

“sculpture”

500x500px

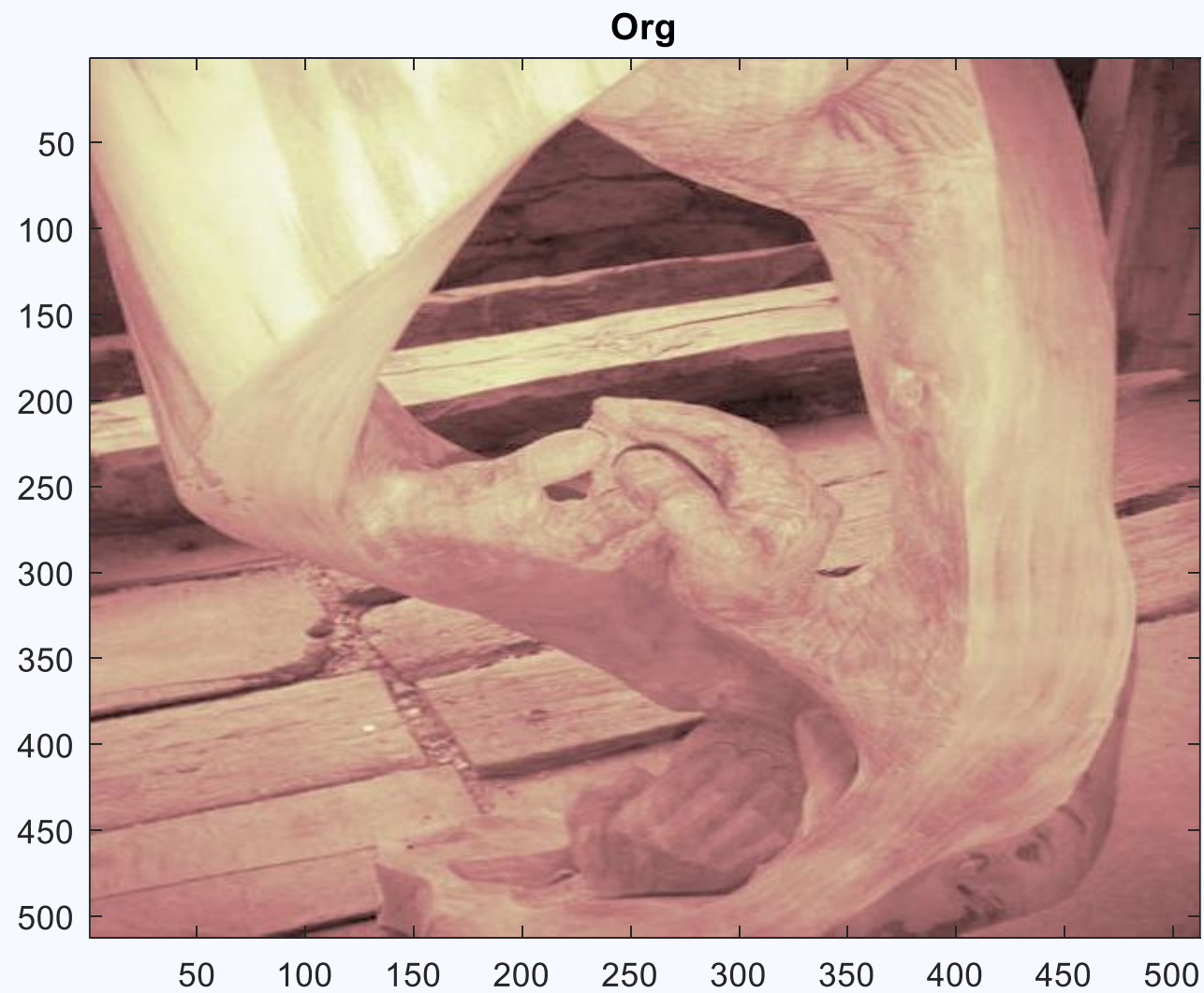


Image 2

"woman"

250x250px

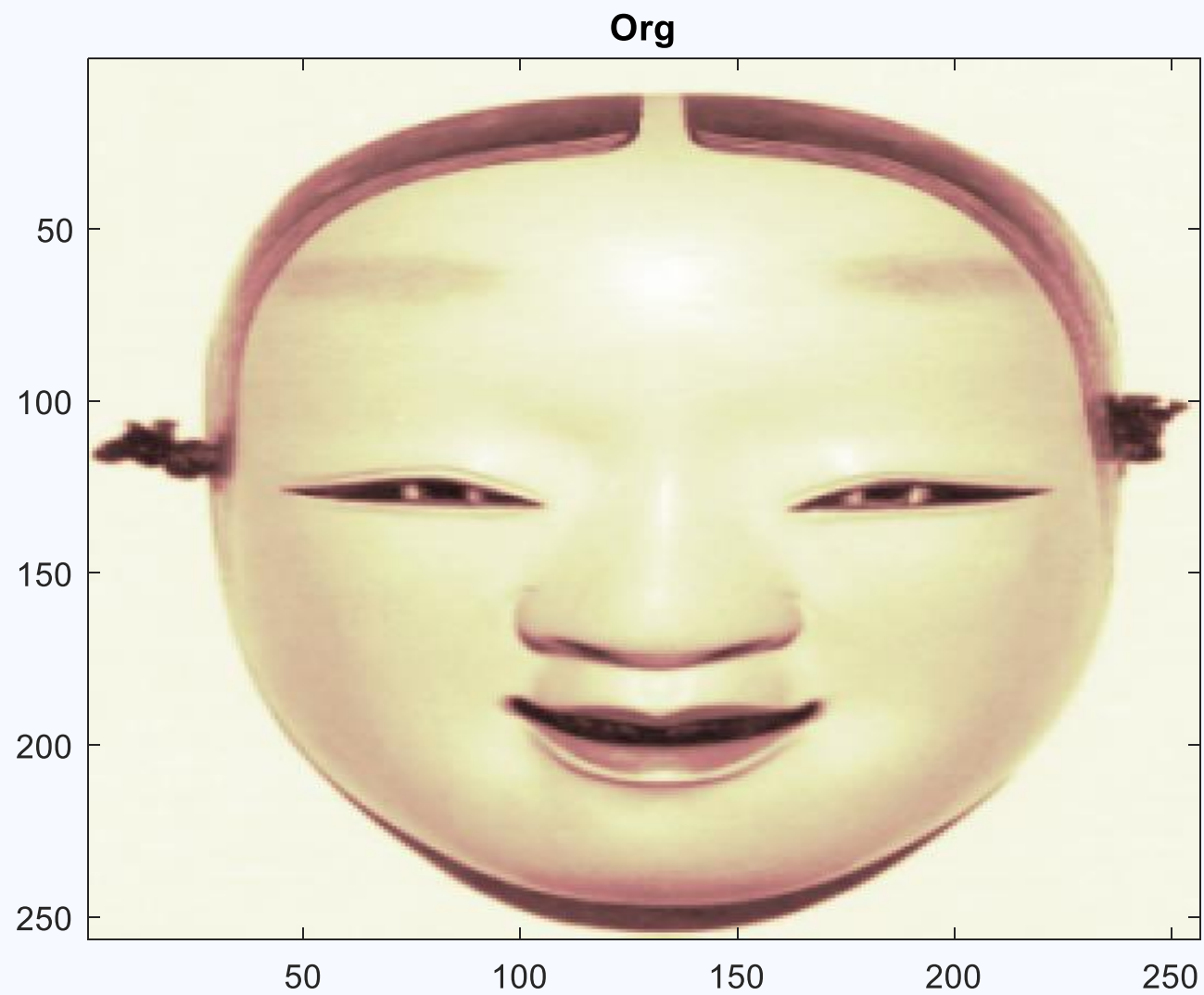
Org



Image 3

"mask"

250x250px



II. 1

HAAR 3-L

1.1 WITH LOCAL THRESHOLDING

Compression ratio: **3.59**

MSE: **41.08**

PSNR: **31.99**

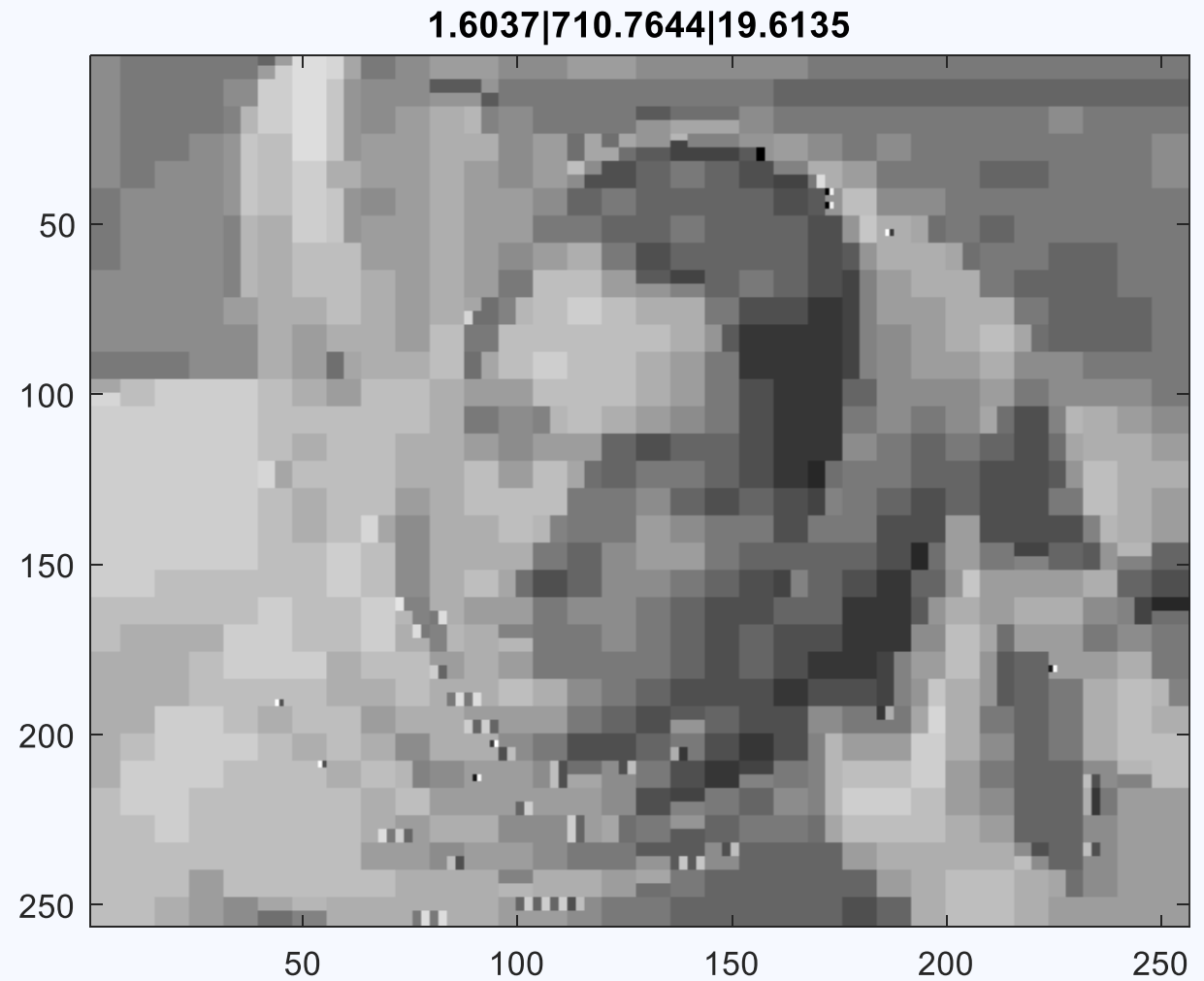


1.2 WITH LOCAL THRESHOLDING

Compression ratio: **1.60**

MSE: **710.76**

PSNR: **19.61**

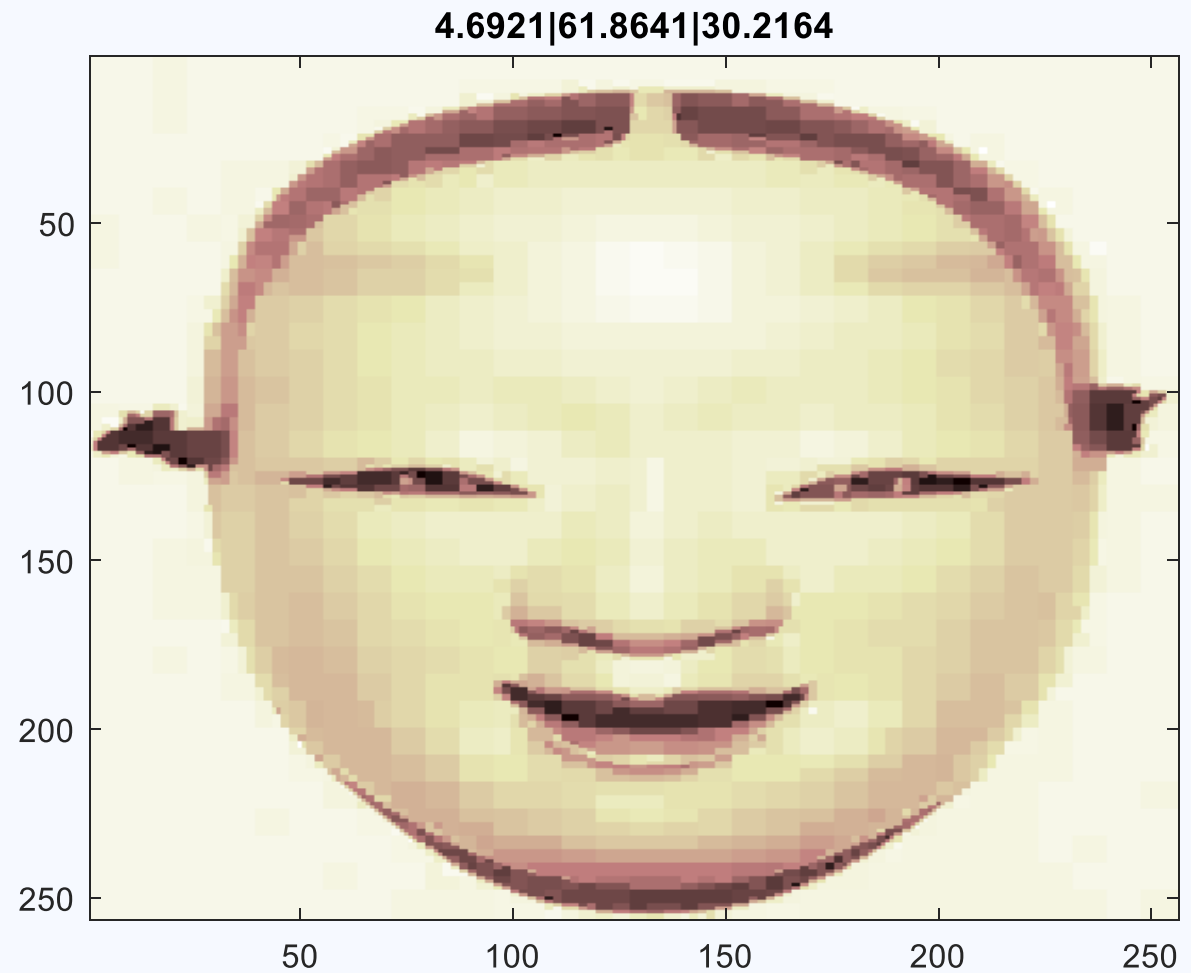


1.3 WITH LOCAL THRESHOLDING

Compression ratio: **4.69**

MSE: **61.86**

PSNR: **30.21**



II. 2

DAUBECHIES 3-L

2.1 WITH LOCAL THRESHOLDING

Compression ratio: **4.01**

MSE: **27.97**

PSNR: **33.66**



2.2 WITH LOCAL THRESHOLDING

Compression ratio: **2.08**

MSE: **631.78**

PSNR: **20.12**

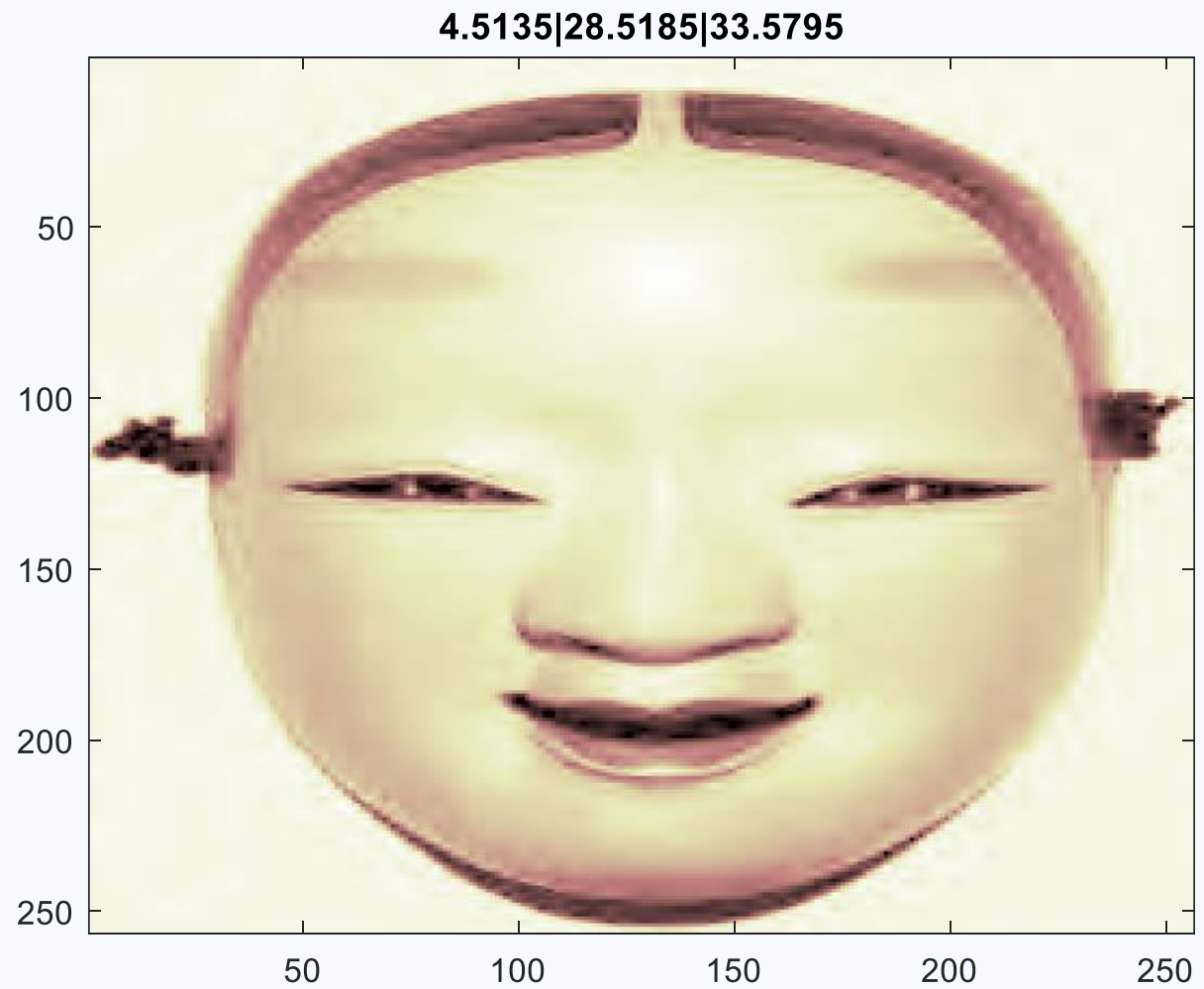


2.3 WITH LOCAL THRESHOLDING

Compression ratio: **4.51**

MSE: **28.51**

PSNR: **33.57**



II. 3

HAAR 5-L

3.1. WITH LOCAL THRESHOLDING

Compression ratio: **3.06**

MSE: **41.70**

PSNR: **31.92**

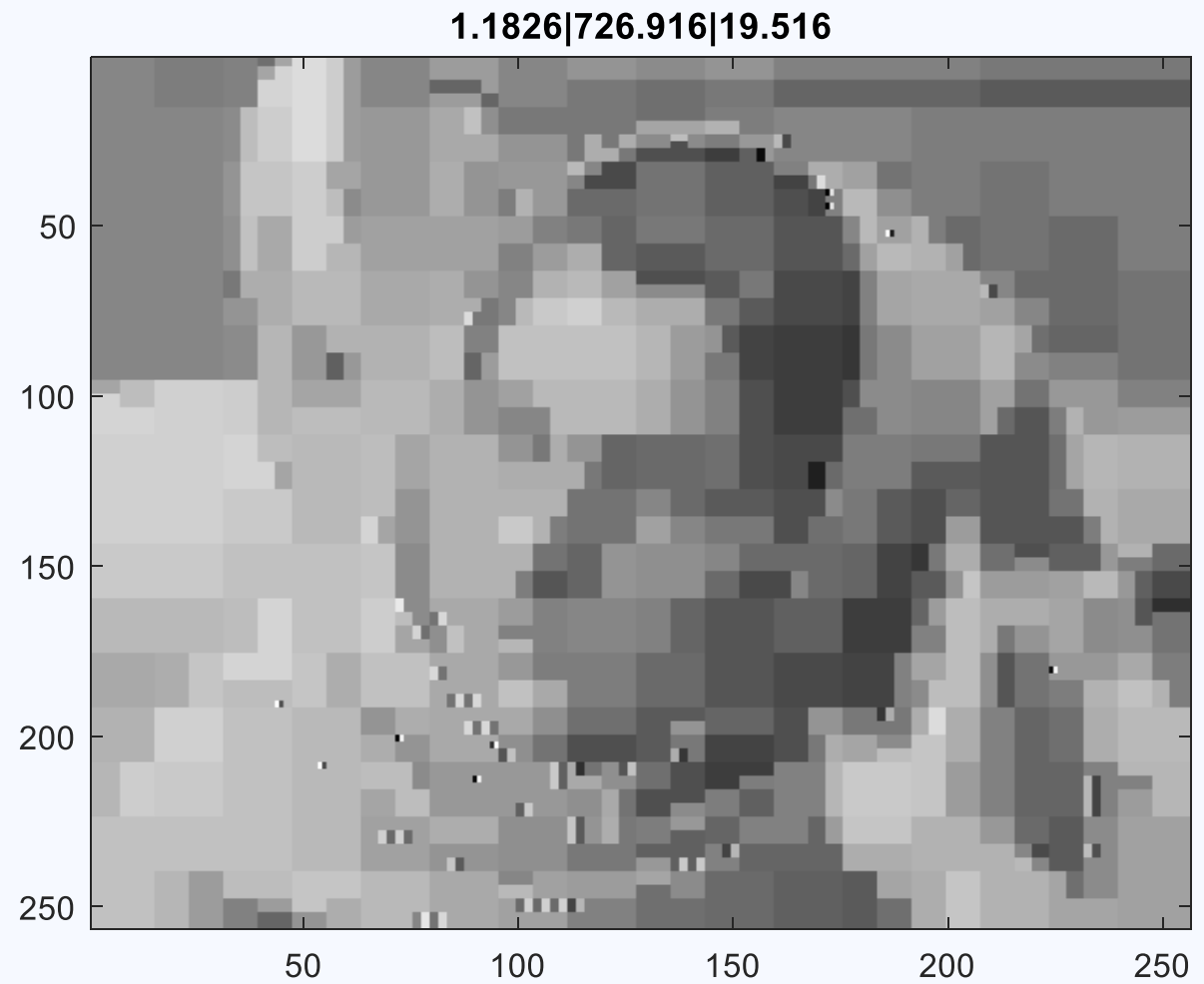


3.2. WITH LOCAL THRESHOLDING

Compression ratio: **1.18**

MSE: **726.91**

PSNR: **19.51**

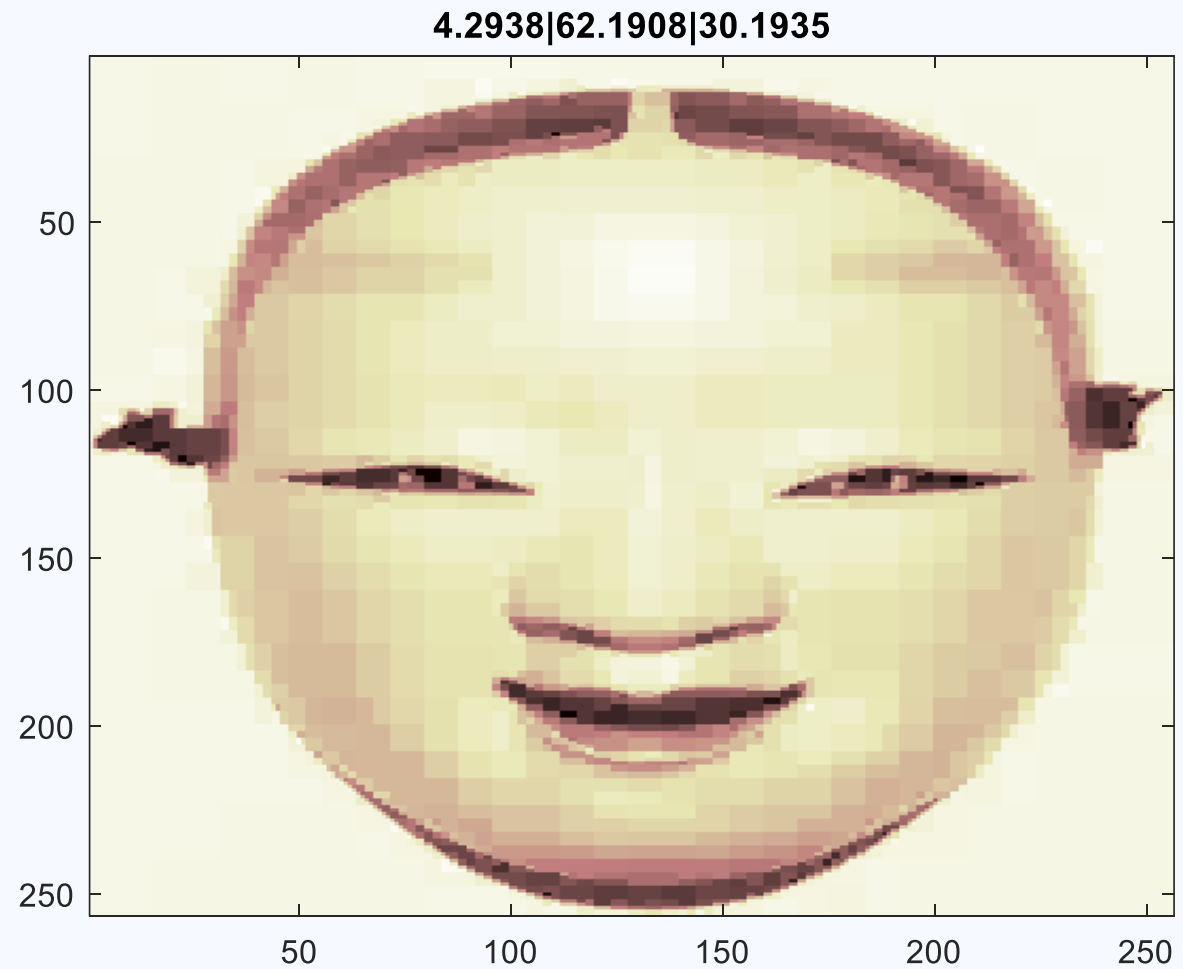


3.3. WITH LOCAL THRESHOLDING

Compression ratio: **4.29**

MSE: **62.19**

PSNR: **30.19**



II. 4

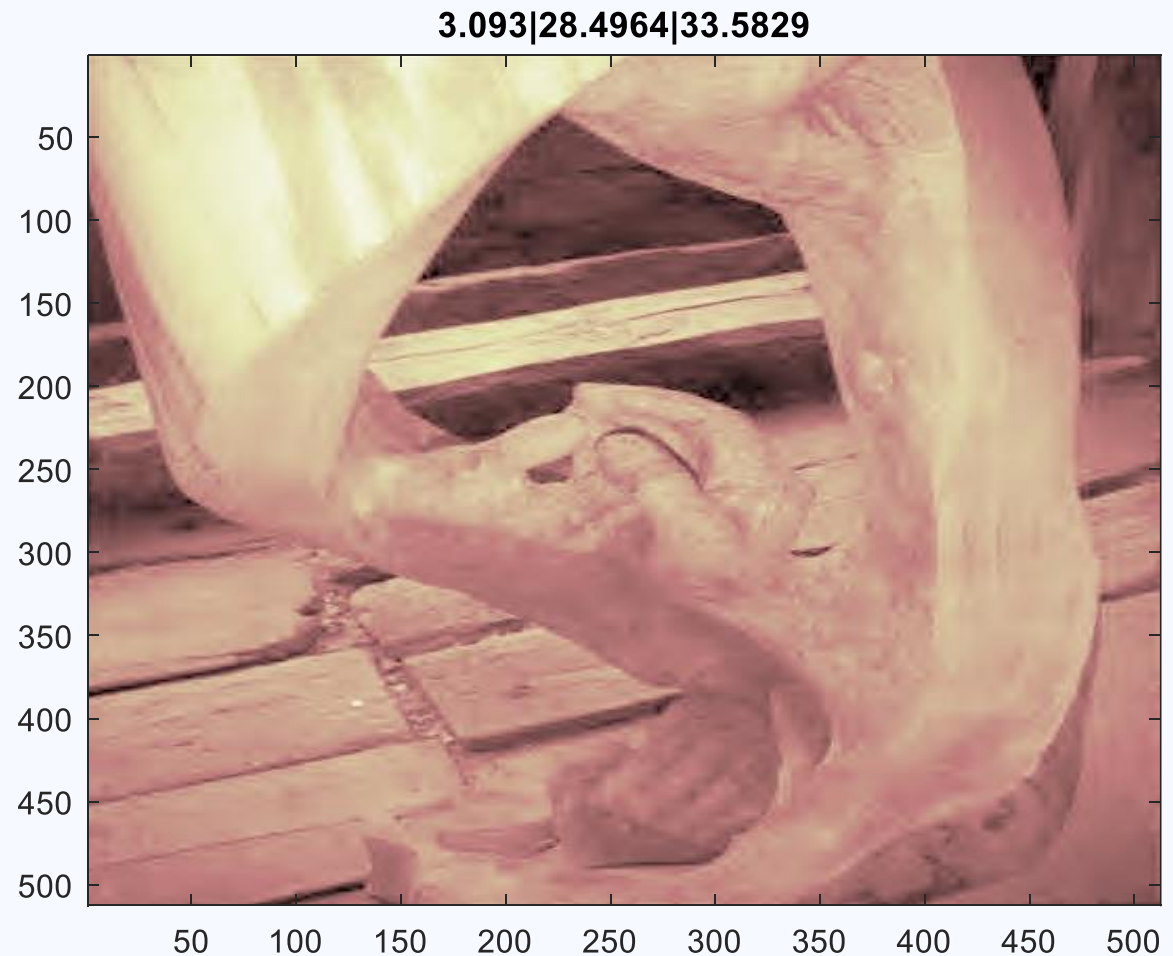
DAUBECHIES 5-L

4.1. WITH LOCAL THRESHOLDING

Compression ratio: **3.09**

MSE: **28.49**

PSNR: **33.58**



4.1. WITH LOCAL THRESHOLDING

Compression ratio: **1.30**

MSE: **646.95**

PSNR: **20.02**

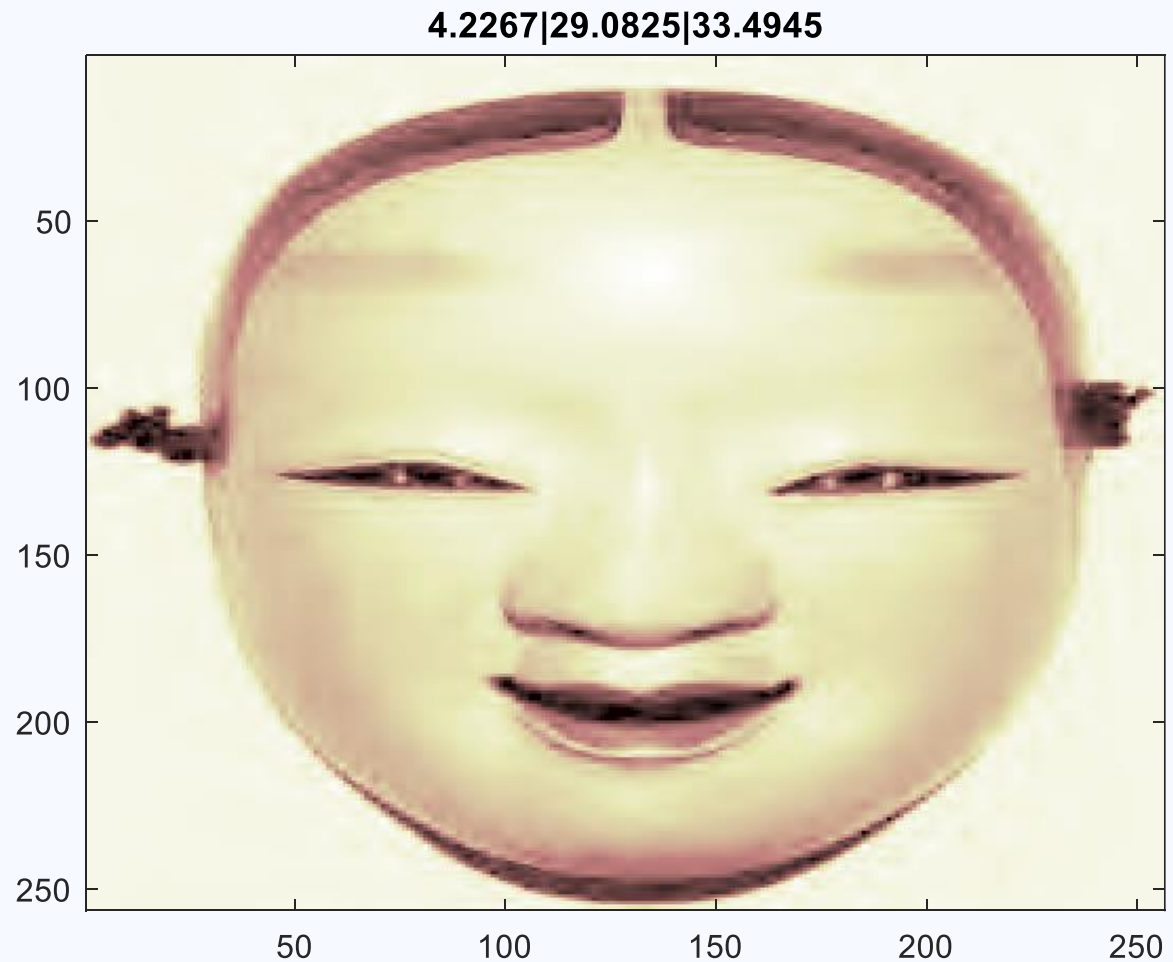


4.1. WITH LOCAL THRESHOLDING

Compression ratio: **4.22**

MSE: **29.08**

PSNR: **33.49**



II. 5

CUMULATIVE RESULTS

Sculpture	H-3	DB-3	H-5	DB-5
C. ratio	3.59	4.01	3.06	3.09
MSE	41.08	27.97	41.7	28.49
PSNR	31.99	33.66	31.92	33.58
Woman	H-3	DB-3	H-5	DB-5
C. ratio	1.6	2.08	1.18	1.3
MSE	710.76	631.78	726.91	646.95
PSNR	19.61	20.12	19.51	20.02
Mask	H-3	DB-3	H-5	DB-5
C. ratio	4.69	4.51	4.29	4.22
MSE	61.86	28.51	62.19	29.08
PSNR	30.21	33.57	30.19	33.49

III.

WATERMARKING

Thoughts, results and
details on the second main
task: Image watermarking
using DWT

HIGHLIGHTS

Method

- Read base and watermark images
- Use 2-D DWT (Haar and Daubechies) to decompose images
- Recompose watermark and base images together
- Save result
- De-watermark the result from previous step

Challenges

- Proper Q-K coefficients pair must be found experimentally
- Watermark visibility rate
- Tile or upscale watermark? what if base image is smaller?
- Some representations might be difficult to distinguish on computer screens

Notes

- Images are in 1:1 ratio (square)
- Watermark image is small and mostly include lower frequencies (20kB, 100x100px)
- Base image also mostly includes lower frequencies (78kB, 576x576px)
- Both color images, but processed in grayscale

Steps

1. Haar 3-L

- 1.1. $(k, q) = (0.2, 0.009)$
- 1.2. $(k, q) = (0.6, 0.009)$
- 1.3. $(k, q) = (1, 0.009)$
- 1.4. $(k, q) = (1.4, 0.009)$
- 1.5. $(k, q) = (1.8, 0.009)$
- 1.6. $(k, q) = (0.2, 0.01)$
- 1.7. $(k, q) = (0.6, 0.01)$
- 1.8. $(k, q) = (1, 0.01)$
- 1.9. $(k, q) = (1.4, 0.01)$
- 1.10. $(k, q) = (1.8, 0.01)$

2. Haar 3-L

- 2.1. $(k, q) = (0.2, 0.009)$
- 2.2. $(k, q) = (0.6, 0.009)$
- 2.3. $(k, q) = (1, 0.009)$
- 2.4. $(k, q) = (1.4, 0.009)$
- 2.5. $(k, q) = (1.8, 0.009)$
- 2.6. $(k, q) = (0.2, 0.01)$
- 2.7. $(k, q) = (0.6, 0.01)$
- 2.8. $(k, q) = (1, 0.01)$
- 2.9. $(k, q) = (1.4, 0.01)$
- 2.10. $(k, q) = (1.8, 0.01)$

3. Results



Base Image

“disco”

576x576px



Watermark Image

“circle”

100x100px



III. 1

HAAR 3-L

1.1. (0.2, 0.009)

MSE: **8928**

PSNR: **8.62**

Size: **14.2**

8928.6798|8.6229



1.2. (0.6, 0.009)

MSE: **2174**

PSNR: **14.75**

Size: **24.2**

2174.9373|14.7563



1.3. (1, 0.009)

MSE: **21.48**

PSNR: **34.80**

Size: **32.5**

21.4871|34.809



1.4. (1.4, 0.009)

MSE: **1968**

PSNR: **15.18**

Size: **38.1**

1968.9975|15.1884



1.5. (1.8, 0.009)

MSE: **4380**

PSNR: **11.71**

Size: **39.1**

4380.0609|11.716



1.6. (0.2, 0.01)

MSE: **8905**

PSNR: **8.63**

Size: **14.2**

8905.0808|8.6344



1.7. (0.6, 0.01)

MSE: **2152**

PSNR: **14.8**

Size: **24.1**

2152.0931|14.8022



1.8. (1, 0.01)

MSE: **21.88**

PSNR: **34.72**

Size: **32.6**

21.8871|34.7289



1.9. (1.4, 0.01)

MSE: **1981**

PSNR: **15.16**

Size: **38.1**

1981.0212|15.1619



1.10. (1.8, 0.01)

MSE: **4393**

PSNR: **11.70**

Size: **39.5**

4393.7056|11.7025



III. 2

DAUBECHIES 3-L

8928.6939|8.6229

2.1. (0.2, 0.009)

MSE: **8928**

PSNR: **8.62**

Size: **14.2**



2.2. (0.6, 0.009)

MSE: **2174**

PSNR: **14.75**

Size: **24.2**

2174.9351|14.7563



2.3. (1, 0.009)

MSE: **21.48**

PSNR: **34.80**

Size: **32.5**

21.4871|34.809



2.4. (1.4, 0.009)

MSE: **1968**

PSNR: **15.18**

Size: **38.1**

1969|15.1883



2.5. (1.8, 0.009)

MSE: **4380**

PSNR: **11.71**

Size: **39.1**

4379.989|11.7161



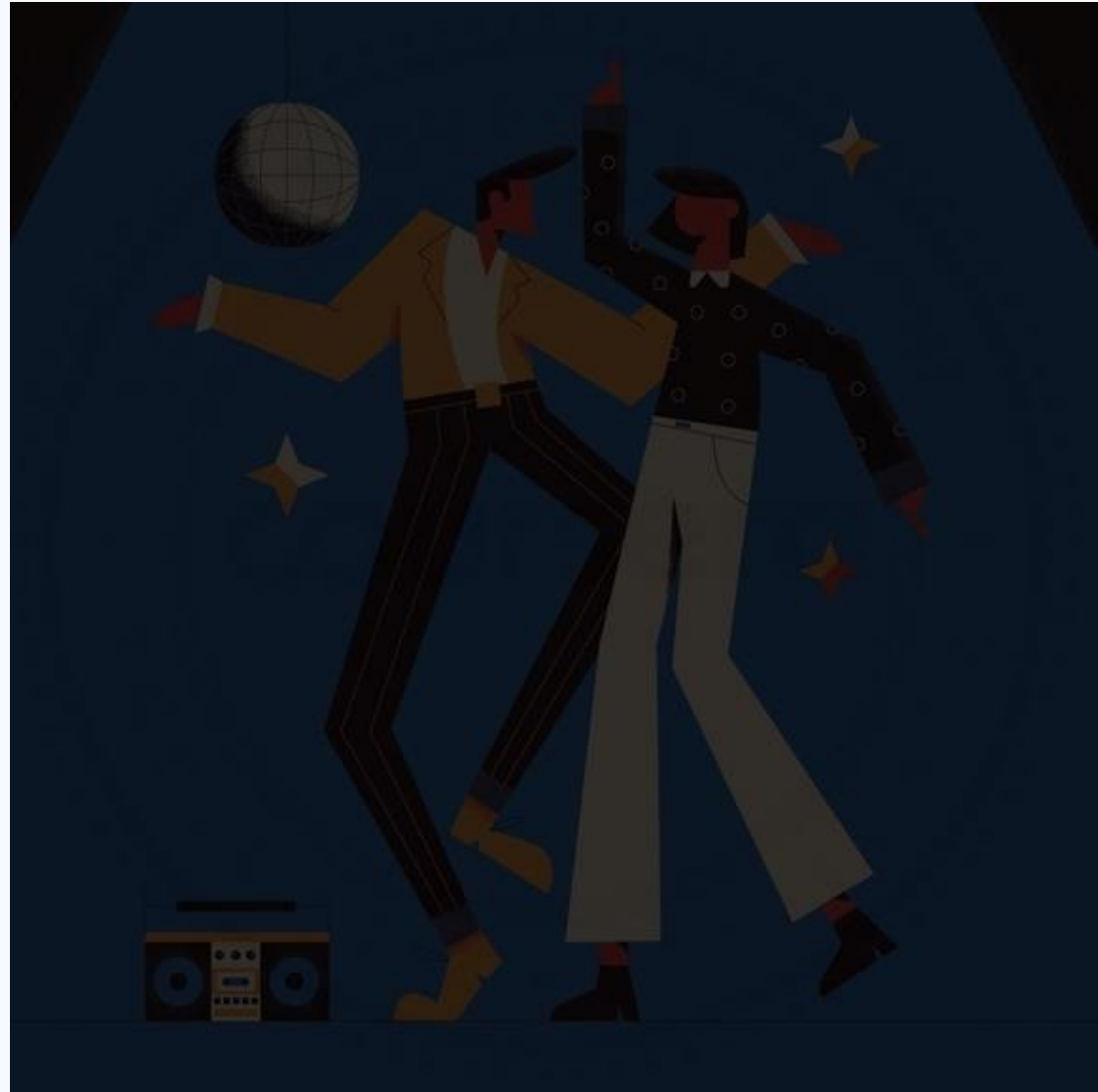
2.6. (0.2, 0.01)

MSE: **8905**

PSNR: **8.63**

Size: **14.2**

8905.6481|8.6341



2.7. (0.6, 0.01)

MSE: **2152**

PSNR: **14.8**

Size: **24.1**

2152.1038|14.8022



2.8. (1, 0.01)

MSE: **21.85**

PSNR: **34.73**

Size: **32.6**

21.8562|34.735



2.9. (1.4, 0.01)

MSE: **1981**

PSNR: **15.16**

Size: **38.1**

1980.771|15.1625



2.10. (1.8, 0.01)

MSE: **4393**

PSNR: **11.70**

Size: **39.6**

4393.3549|11.7028



III. 3

CUMULATIVE RESULTS

H-3	MSE	PSNR	SIZE
0.2, 0.009	8928	8.62	14.2
0.6, 0.009	2174	14.75	24.2
1.0, 0.009	21.48	34.80	32.5
1.4, 0.009	1968	15.18	38.1
1.8, 0.009	4380	11.71	39.1
0.2, 0.01	8905	8.63	14.2
0.6, 0.01	2152	14.8	24.1
1.0, 0.01	21.88	34.72	32.6
1.4, 0.01	1981	15.16	38.1
1.8, 0.01	4393	11.70	39.5

DB-3	MSE	PSNR	SIZE
0.2, 0.009	8928	8.62	14.2
0.6, 0.009	2174	14.75	24.2
1.0, 0.009	21.48	34.80	32.5
1.4, 0.009	1968	15.18	38.1
1.8, 0.009	4380	11.71	39.1
0.2, 0.01	8905	8.63	14.2
0.6, 0.01	2152	14.8	24.1
1.0, 0.01	21.85	34.73	32.6
1.4, 0.01	1981	15.16	38.1
1.8, 0.01	4393	11.70	39.6

IV.

CODE

Explaining the codes used on this project: functions, procedures, conversions and representations

4. CODE

Highlights

1. Overview
2. Compression
3. Watermarking
4. De-Watermarking

Notes

- Using Matlab (R2018b)
- Windows 10
- Official docs
- Images pasted as figure

4.1. Overview

Main functions

1. `dwt2()`: 2-D, 1-Level DWT on an input
2. `idwt2()`: 2-D, 1-Level IDWT on LL-LH-HL-HH frequency bands
3. `wavedec2()`: 2-D N-level wavelet decomposition on an input
4. `waverec2()`: 2-D, N-Level wavelet reconstruction on a decomposition structure
5. `wcompress()`: True un/compression of an image using method `compthd`

4.2. Compression

```
load woman;  
n = 5;  
w = 'db3';
```

```
[cr,bpp] =  
wcompress('c',X,'mask.wtc'  
          , 'lvl_mmc','wname',w  
          , 'level',n);
```

- Load image
 - Image names: sculpture woman mask
 - Set DWT level
 - Set wavelet family
-
- Compress image X
 - Save compression structure as 'mask.wtc'
 - 'c' for compression; 'u' for un-compression.
 - Process using set family-level provided above
 - Save compression ratio and bit-per-pixel measurements

4.2. Compression

```
Xc =  
wcompress('u','mask.wtc');  
delete('mask.wtc')
```

- Save compressed image as Xc, using the structure from prev. step
- Delete structure file

```
X = double(X);  
D = abs(X-Xc).^2;  
mse = sum(D(:))/numel(X);  
psnr = 10*log10(255*255/mse);
```

- Convert input image to double
- Calculate MSE and PSNR

4.2. Compression

```
figure
image(Xc);
title(strcat(num2str(cr), '|', num2str(mse), '|', num2str(psnr)));
colormap(map);

figure
image(X);
title("Org");
colormap(map);
```

- Show output image + MSR/PSNR
- Show original image

4.3. Watermarking

```
base = imread('disco.jpg');  
wm = imread('circle.png');  
  
wv = 'db3';  
lvl = 3;  
  
k = 1.8; % 0.2 0.6 1 1.4 1.8  
q = 0.01; % 0.009 0.01  
  
watermark(base, wm, wv, k, q, lvl);
```

- Read local image as base
- Read watermark image as wm
- Set wavelet family as wv
 - Options: db3, haar
- Set wavelet level lvl
- Set base image coefficient k
- Set base image coefficient q
- Using set values, run the function watermark

4.3. Watermarking

```
function y=watermark(A,B,wave,k,q,lv1)
    host = A;
    wm = B;
    [m, n, p] = size(host);
    [h_c, h_s] = wavedec2(host, lv1, wave);
    wm = imresize(wm, [m n]);
    [w_c, w_s] = wavedec2(wm, lv1, wave);
    w_c = (k * h_c) + (q * w_c);
    wmRes = waverec2(w_c, h_c, wave);
```

- Define function `watermark` with 6 arguments
- Save base image as `host`
- Save watermark image as `wm`
- Get dimensions and color channels of host image
- Run wavelet decomposition on base image
- Resize watermark to match base image's dimensions
- Run wavelet decomposition on base image
- Apply set coefficients
- Run wavelet reconstruction on watermark and base image's LL bands, save as `wmRes`

4.3. Watermarking

```
imwrite(uint8(wmRes), 'watermarked.jpg');  
compare = imread('watermarked.jpg');  
compare = double(compare);  
base = double(host);  
D = abs(compare - base).^2;  
mse = sum(D(:))/numel(compare);  
psnr = 10*log10(255*255/mse);
```

- Save the result in storage as a termarked.jpg
- Convert result to image of type double
- Calculate MSE/PSNR

4.3. Watermarking

```
figure
imshow(uint8(wmRes));
deets = strcat(num2str(mse), '|', num2str(psnr));
title(deets);
y = 'Watermarked successfully';
end
```

- Show image + MSE/PSNR measurements
- Return success message
- Quit function

4.4. De-Watermarking

```
base = imread('disco.jpg');  
wm = imread('circle.png');  
wmres = imread('watermarked.png');  
wv = 'haar';  
ext_watermark(base, wm, wmres, wv);
```

- Read base and watermark image
- Read result image
- Set wavelet family
- Run ext_watermark function, pass in set arguments

4.4. De-Watermarking

```
function y=ext_watermark(A,B,C,wave)
    host = A;
    [m, n, p] = size(host);
    [host_LL, host_LH, host_HL, host_HH] = dwt2(host ,wave);
```

- Define function with 4 arguments
- Pass in base, watermark and result images wavelet family
- Read base image as host
- Run 2-D 1-L DWT on base image
- Save 4 different frequency bands

4.4. De-Watermarking

```
water_mark = B;  
water_mark = imresize(water_mark, [m n]);  
  
[water_mark_LL, water_mark_L,  
water_mark_HL, water_mark_HH] =  
    dwt2(water_mark, wave);
```

- Read watermark image as B
- Resize watermark image to match base image
- Run 2-D 1-L DWT on watermark image
- Save all 4 frequency bands

4.4. De-Watermarking

```
wm = C;  
[wm_LL, wm_LH, wm_HL, wm_HH] = dwt2(wm, wave);  
rec_watermark = (wm_LL - host_LL) / 0.03;  
ext = idwt2(rec_watermark, water_mark_LH,  
            water_mark_HL, water_mark_HH, wave);
```

- Read result image as C
- Run 2-D 1-L DWT on result image
- Save all 4 frequency bands
- Run 2-D 1-L IDWT on result image's bands
- Save extracted watermark as ext

4.4. De-Watermarking

```
figure
    subplot(1,2,1);
    imshow(uint8(ext));
    title('Extracted watermark');
    subplot(1,2,2);
    imshow(255 - uint8(ext));
    title('Negative watermark');
    y = 'De-watermarked successfully';
end
```

- Show extracted watermark
- Show extracted watermark with inverse color (sometimes easier to see)
- Return success message
- Quit function

V.

CONCLUSION

Out-takes on the overall
procedures the project

5. CONCLUSION

Compression

- More DWT depth = Better results
- Reviewed families not much different
 - Others un-reviewed families might be different
- Images with low freq. = easier to compress
- Images with patterns and high freq. = hard to compress

5. CONCLUSION

Watermarking

- Different families = no difference AT ALL!
- Depth 5 was also reviewed, not mentioned in the report
 - Also no difference at all!
- Only (k,q) values lead to different results
- K=1 leads to best results
- Higher Q = bigger file size

VI.

FUTURE WORKS

What needs to be done,
suggested revisions and
extensions on method and
functionality

6. FUTURE WORK

- Try other wavelet families: `bior`, `sym`, `spiht`, etc.
- Try higher DWT levels
- Try both global and local thresholding for coeff. Matrices
 - Using `ddencom`, `adaptthresh`, etc.
- Try larger image
- Try tiling the watermark
- Add exception catching for bad inputs

VI.

REFERENCES

Books, links, blogposts, etc.

6. REFERENCES

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THANK YOU

