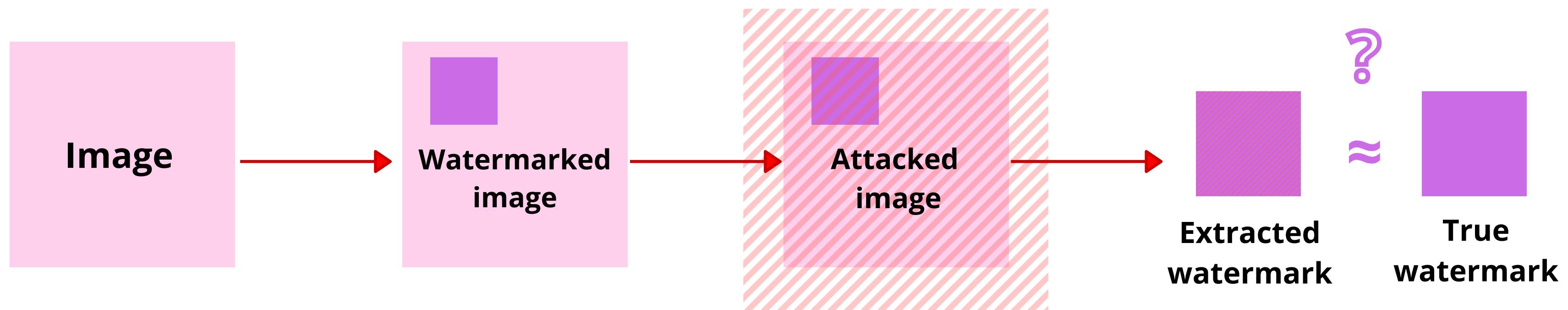


Watermarking colored image using SVD

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Problem statement



Applications

- Owner identification
 - Copyright protection
 - Source tracking

Problem statement



Metrics:

$$MSE(Im, Im^{noisy}) = \frac{1}{KNM} \sum_{k=0}^K \sum_{i=0}^N \sum_{j=0}^M (Im_{ijk} - Im_{ijk}^{noisy})^2$$

$$PSNR(Im, Im^{noisy}) = 10 \log_{10} \left(\frac{V_{max}^2}{MSE(Im, Im^{noisy})} \right)$$

V_{max} - maximal possible pixel value

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Algorithm

Intuition behind algorithm:

Singular values of an image have very good stability.

Thus, when a small perturbation is added to an image, its singular values do not change significantly. So we can make a watermark by adding noise to singular values.

- A 6x6 grid of black dots, arranged in six rows and six columns, centered on a white background.

Algorithm: Encode $\mathcal{O}(n^3)$

Starting with RGB image: $I(x, y) \rightarrow [r(x, y), g(x, y), b(x, y)]$

- For each color decompose image*;
- Apply watermark to diagonal matrix of singular values;
- Decompose the result of previous step;
- Use new singular values in initial SVD decomposition;

$$\begin{array}{c} I = UDV^T \\ \downarrow \\ D' = D + \alpha W \\ \downarrow \\ D' = U'D''V'^T \\ \downarrow \\ I^w = UD''V^T \end{array}$$

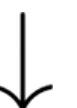
*can be replaced with DWT of each color

Algorithm: Decode $\mathcal{O}(n^3)$

Now we start with watermarked (probably distorted) image

- Decompose it;
- Construct new matrix using unitary matrices from previous slide;
- Compute extracted watermark using formula

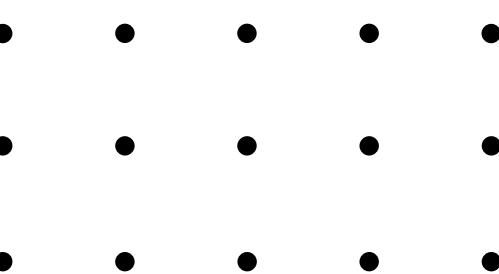
$$I^w = U^w D^w V^{wT}$$



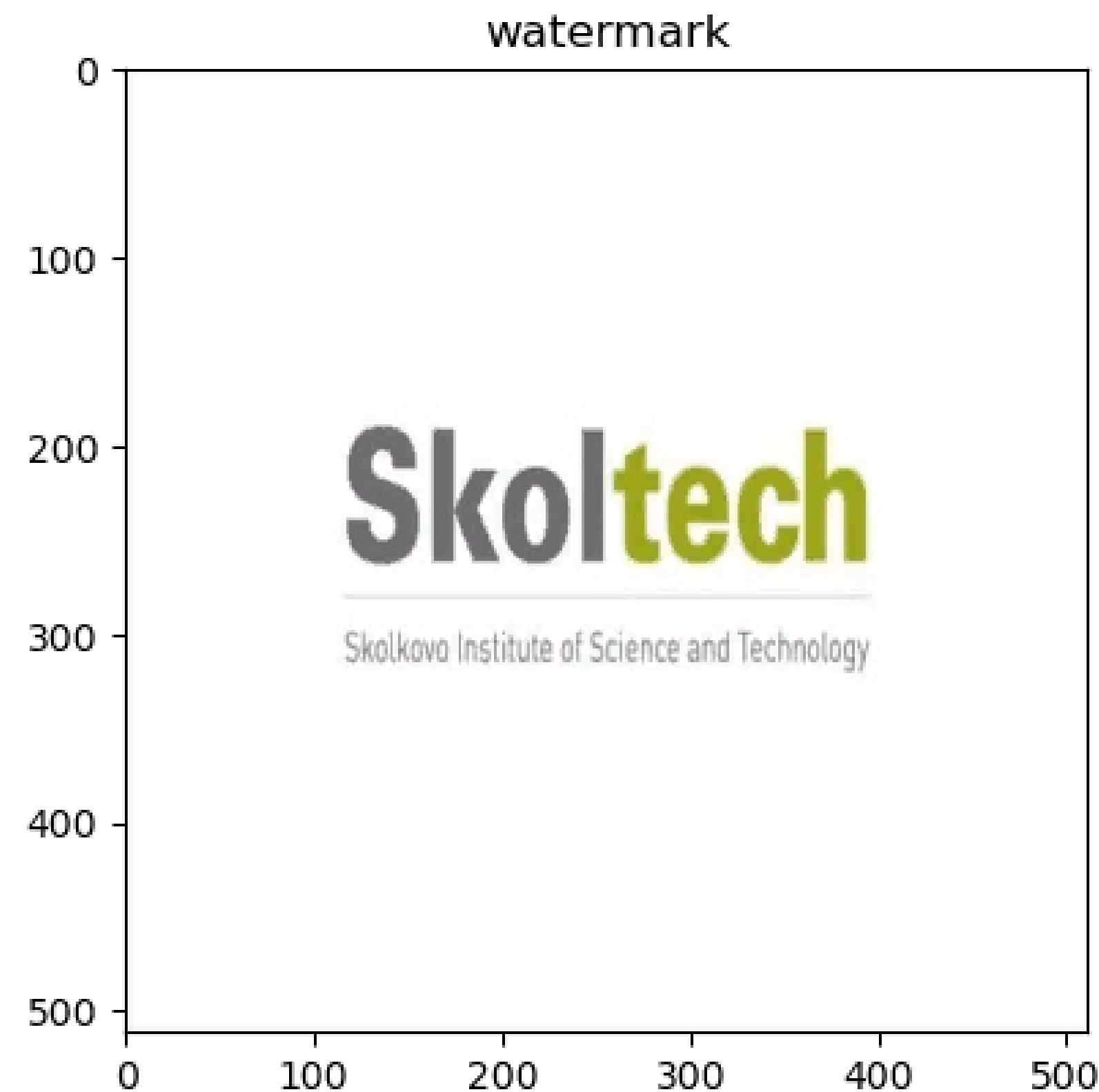
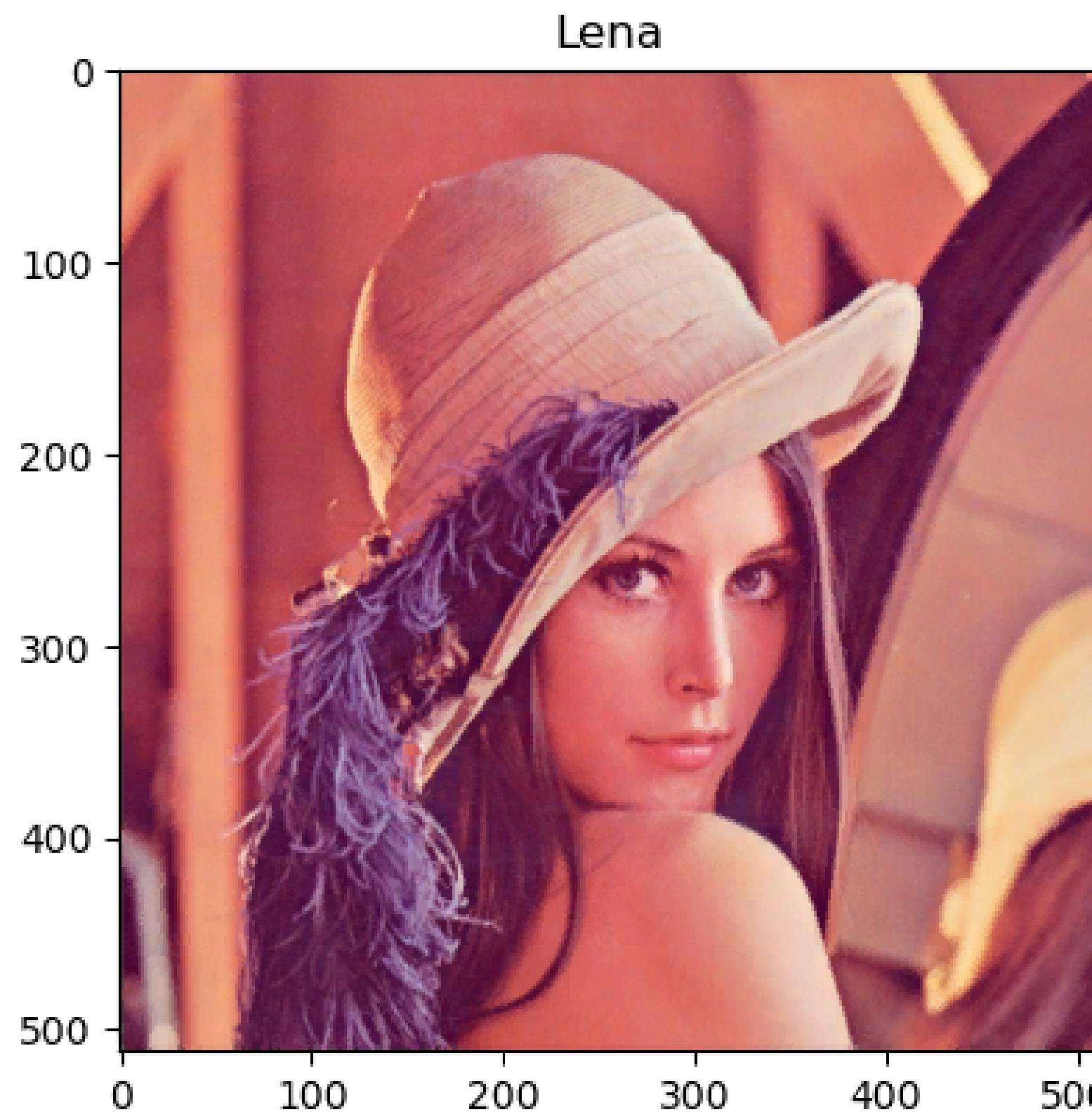
$$E = U' D^w V'^T$$



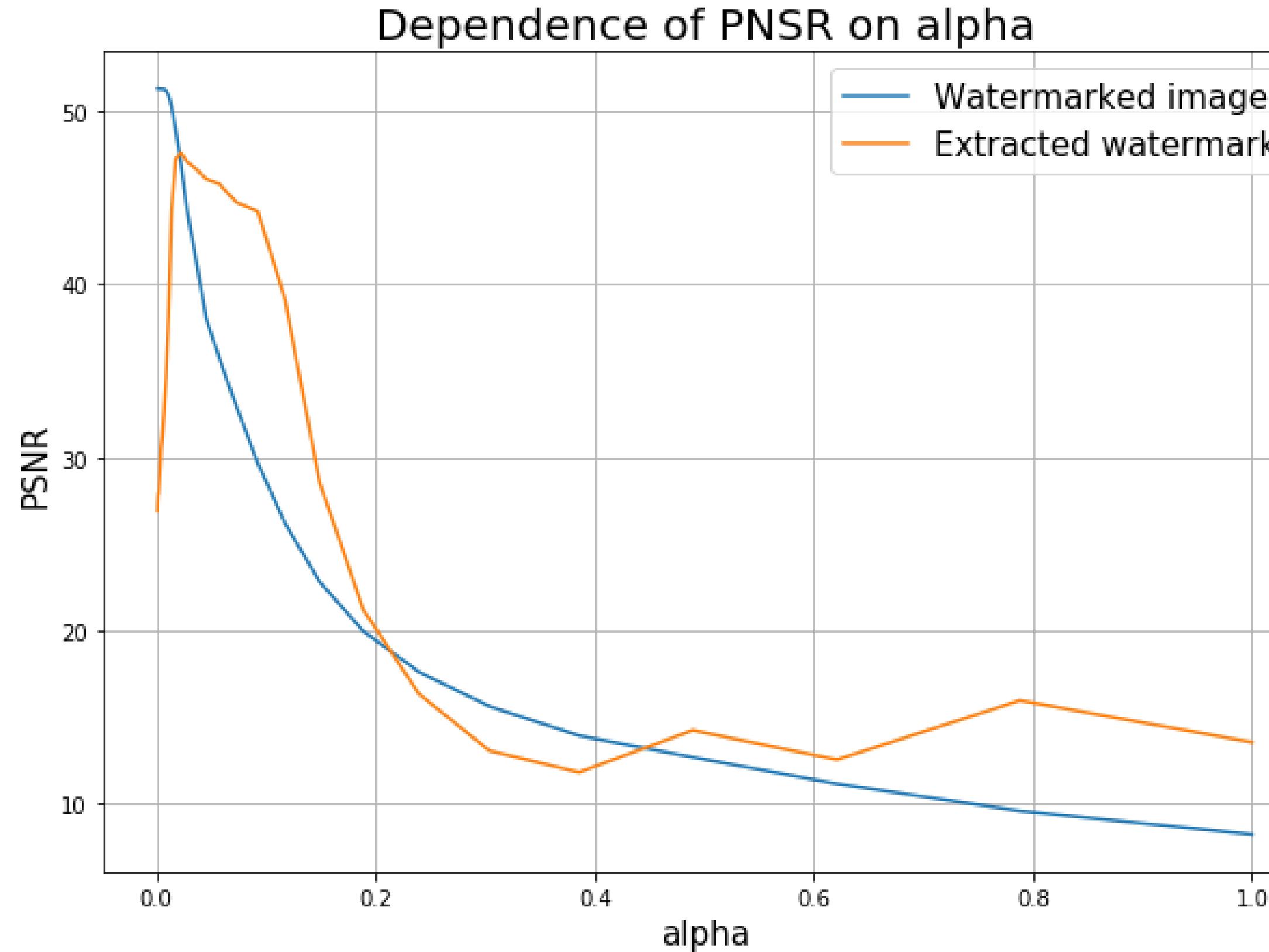
$$W^e = \frac{E - D}{\alpha} = \frac{U' D^w V'^T - D}{\alpha}$$



Input images

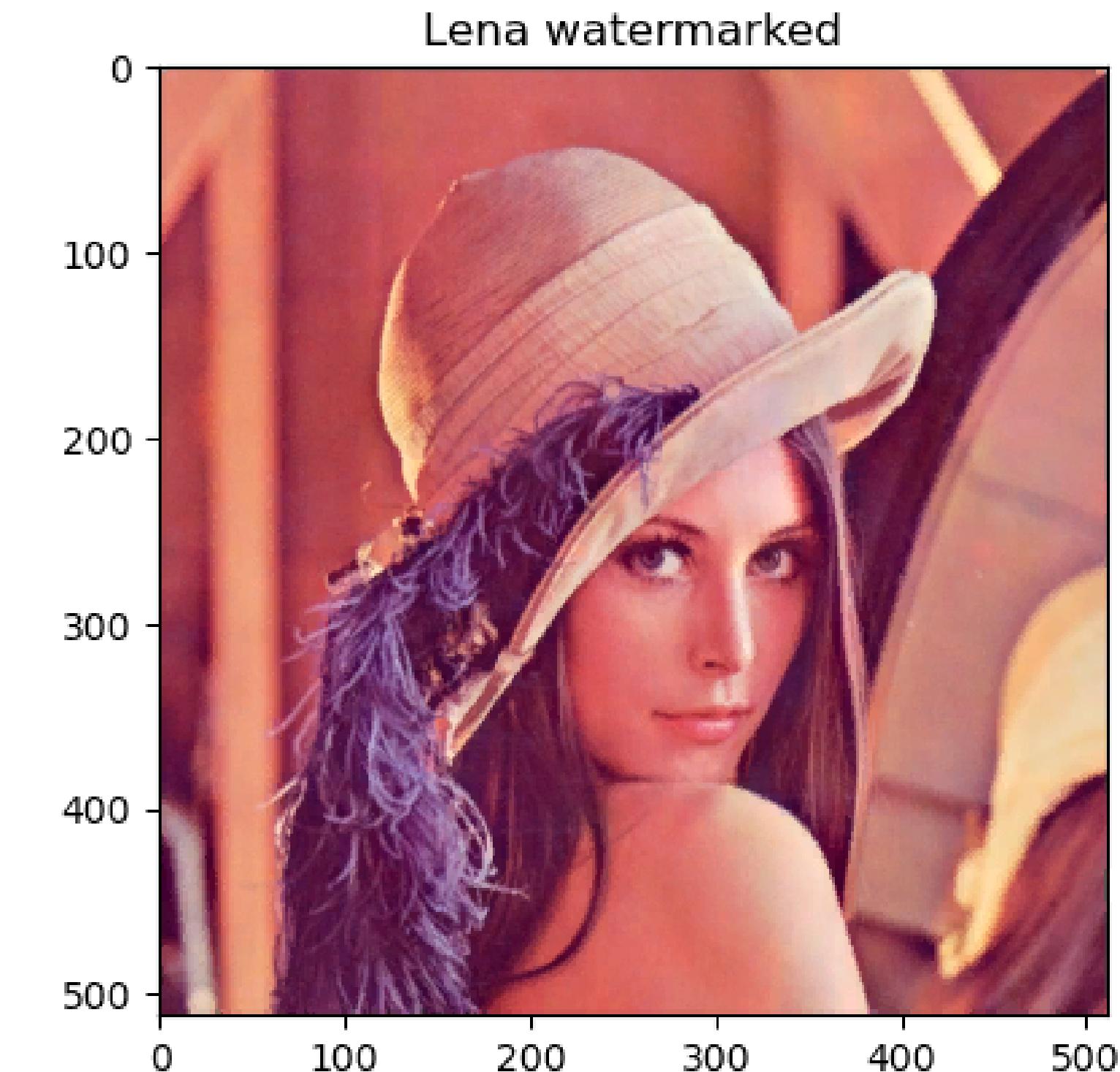
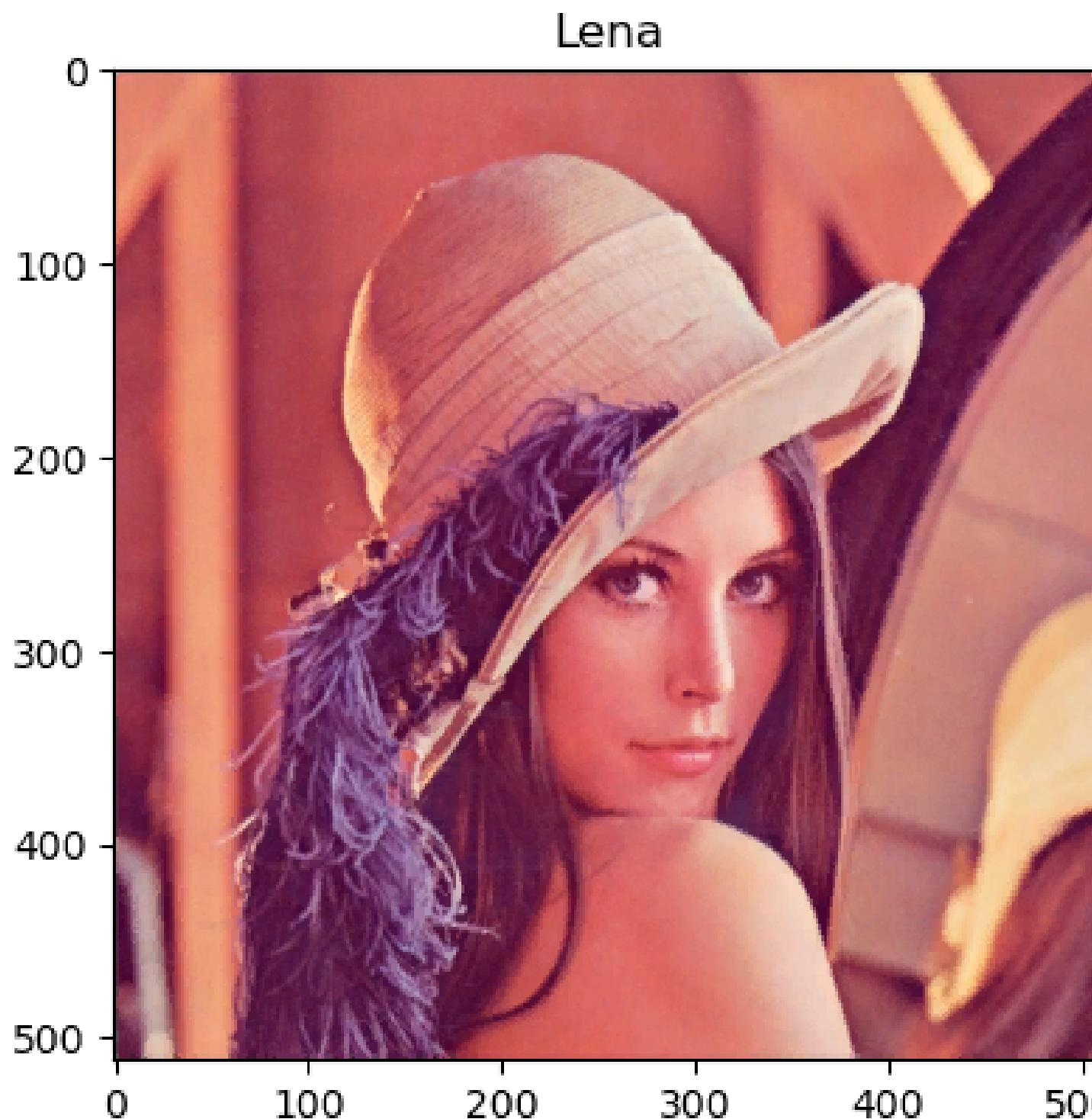


Choosing alpha



Best alpha ≈ 0.05

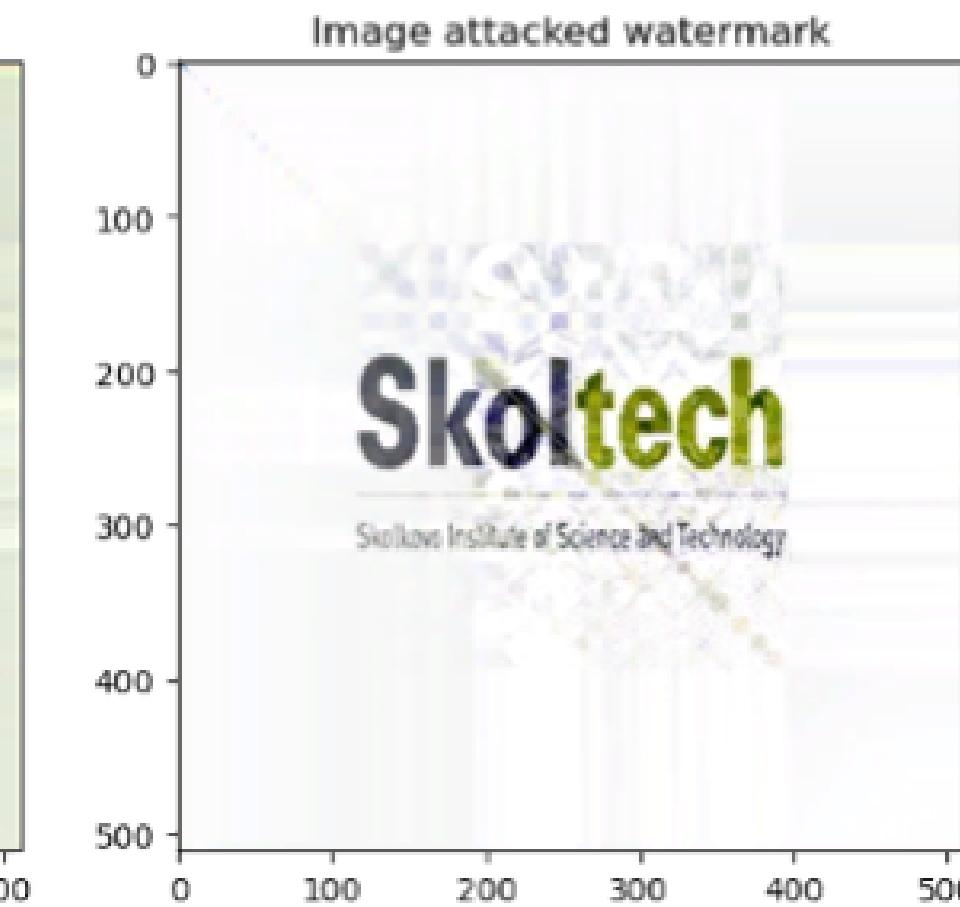
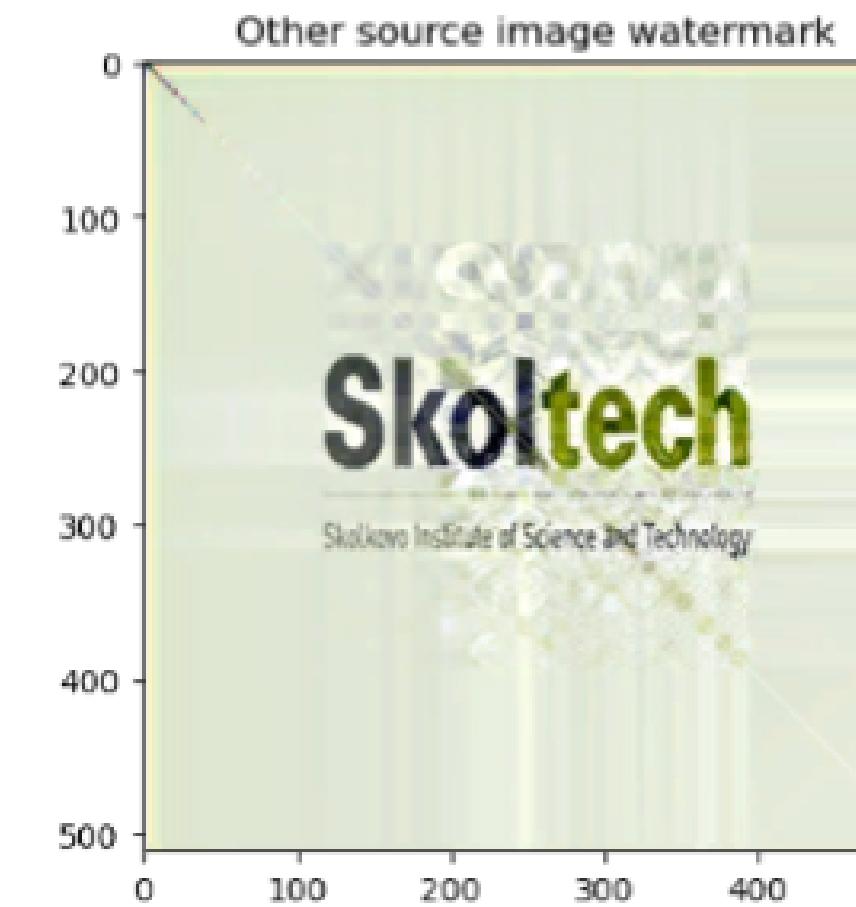
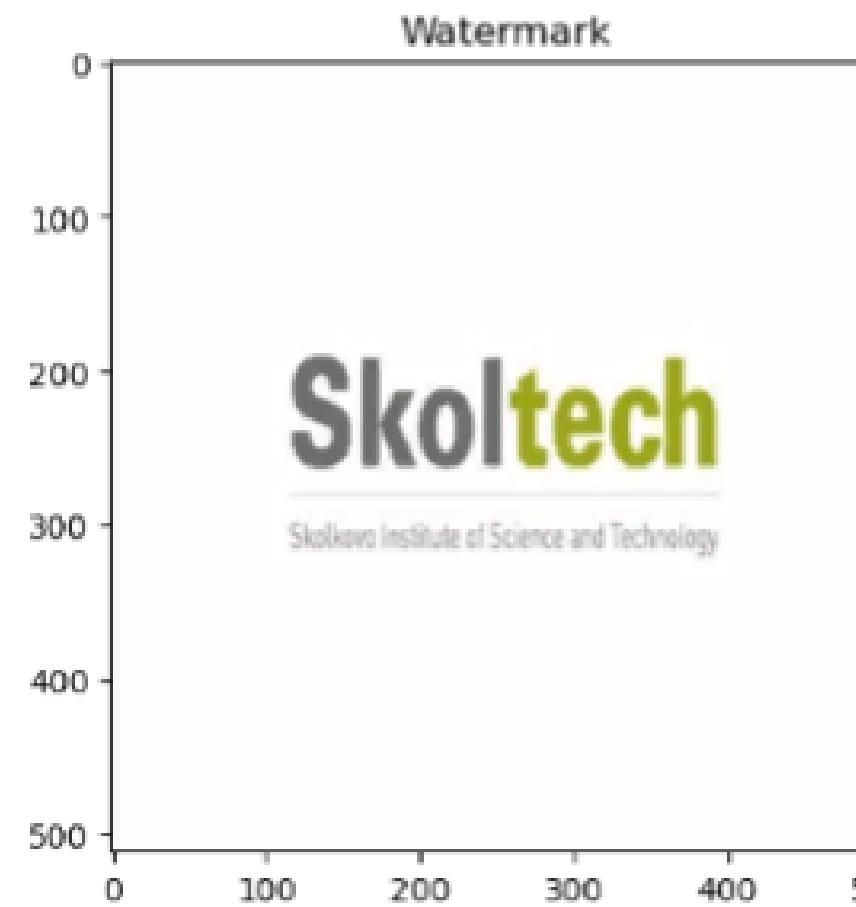
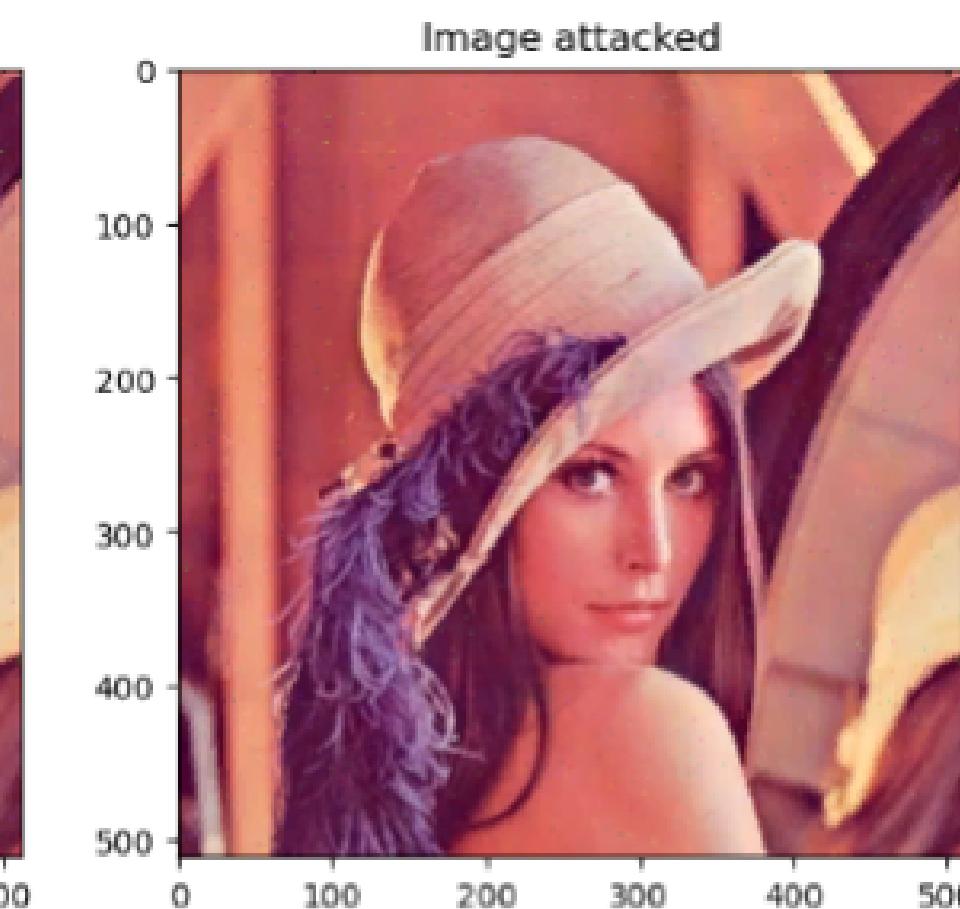
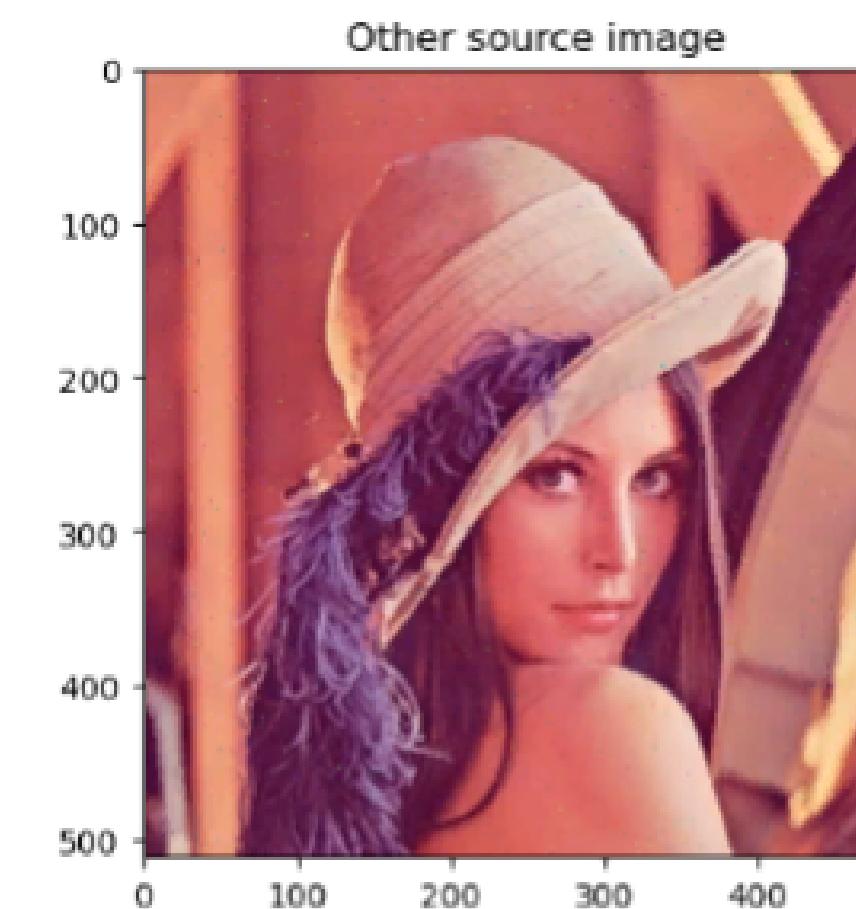
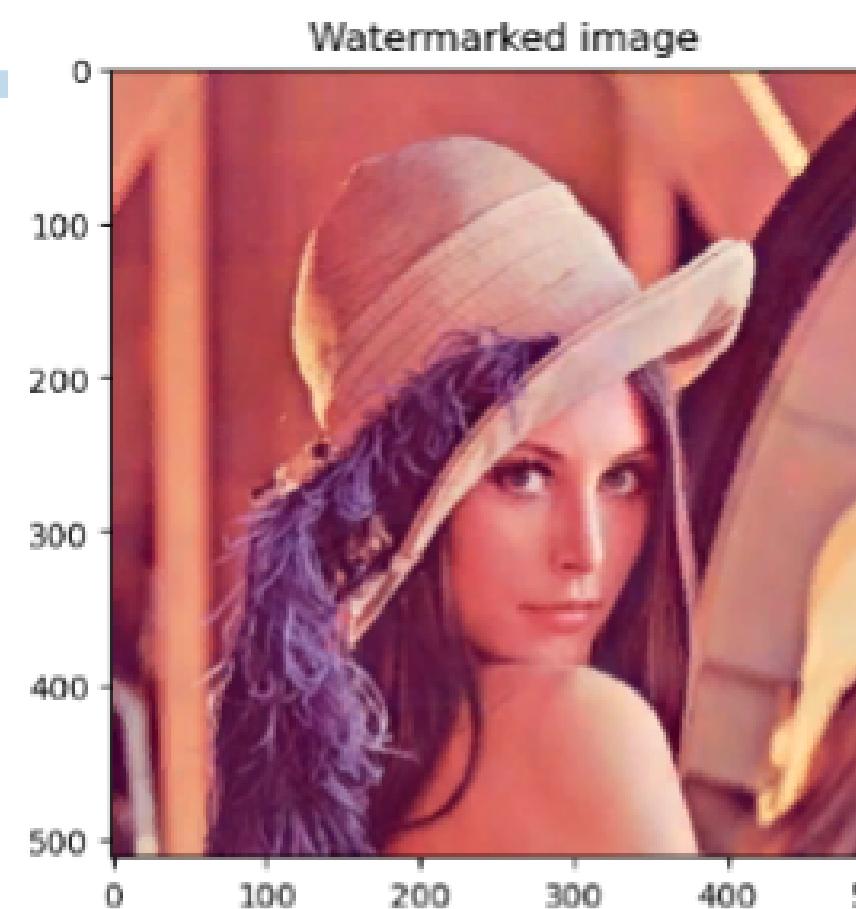
Applying watermark



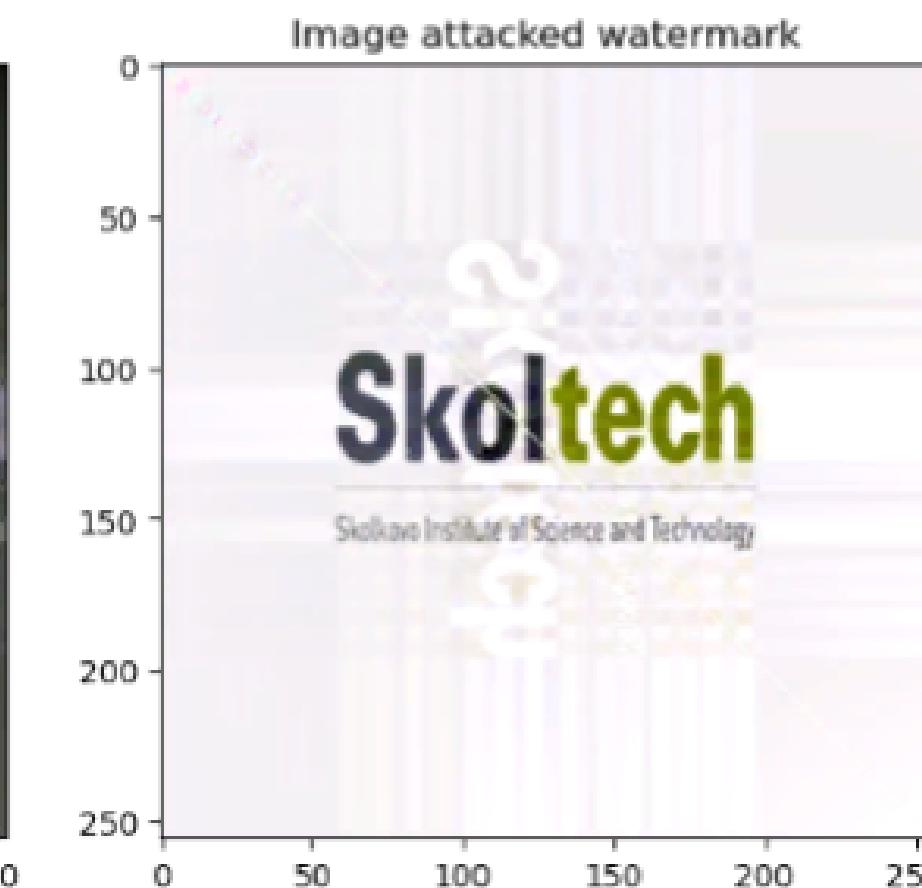
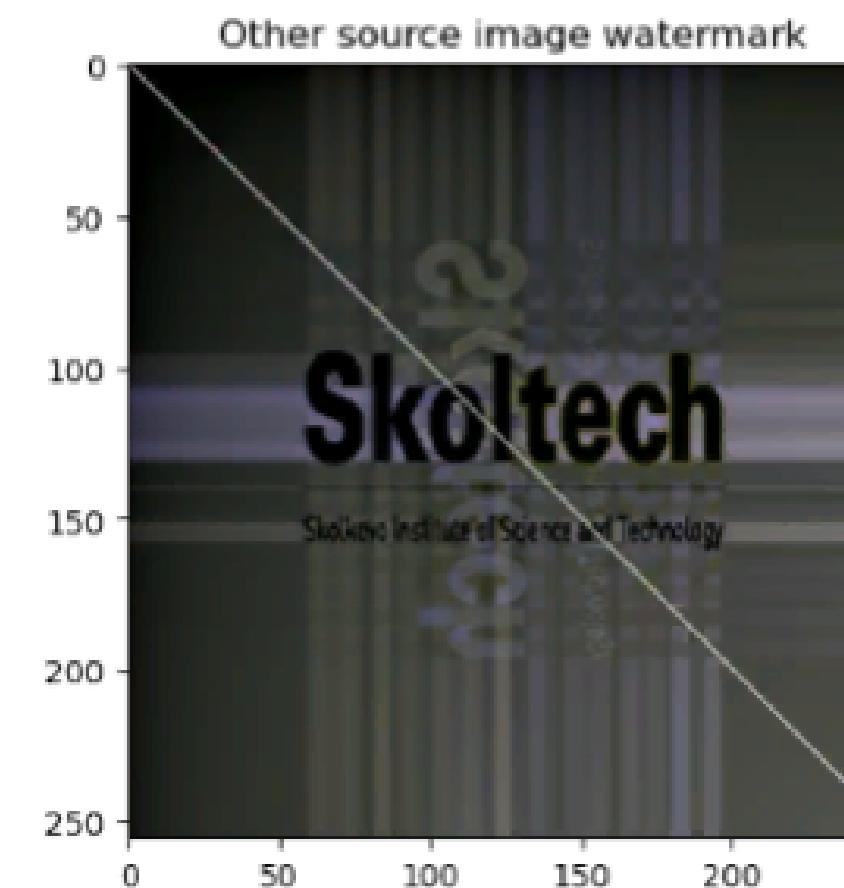
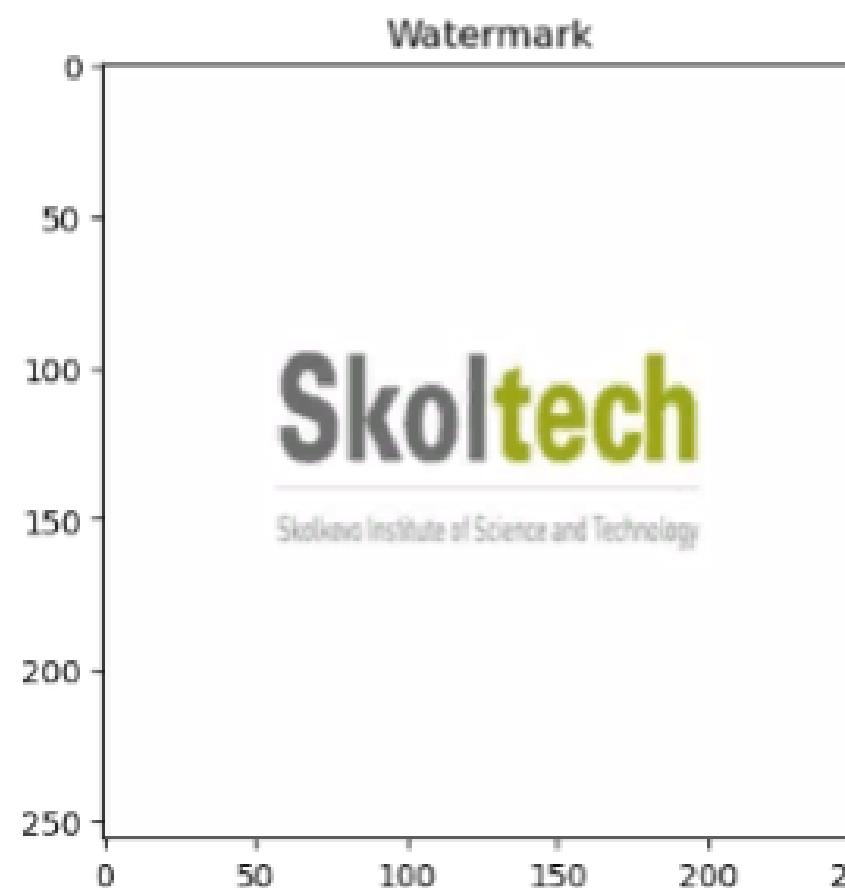
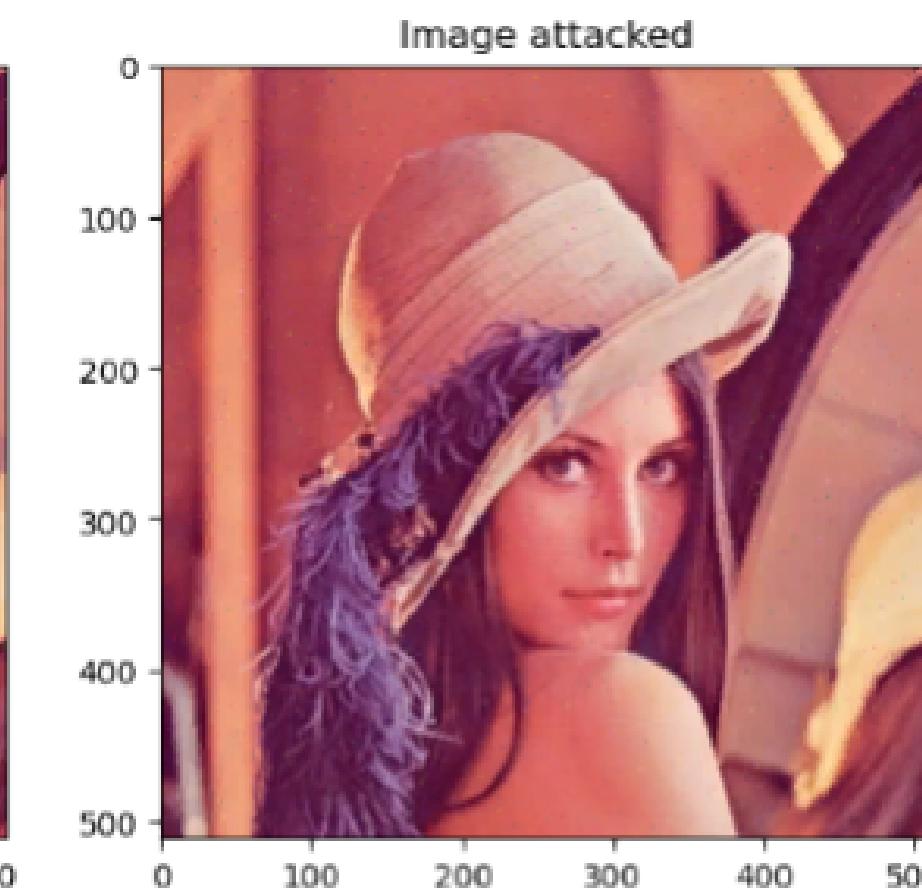
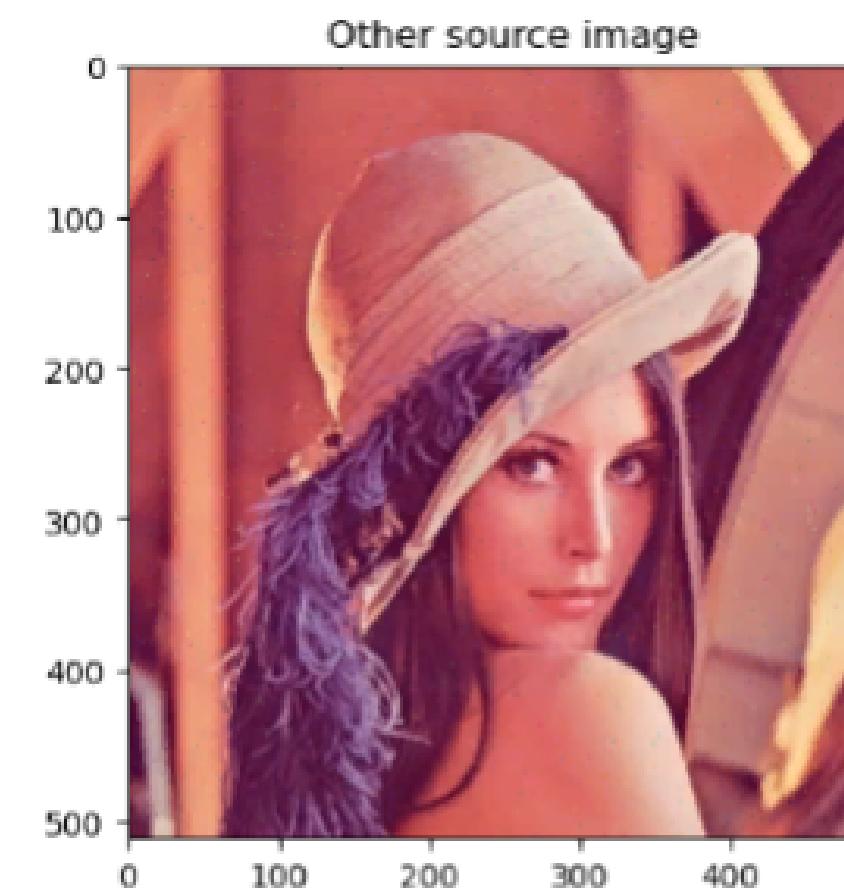
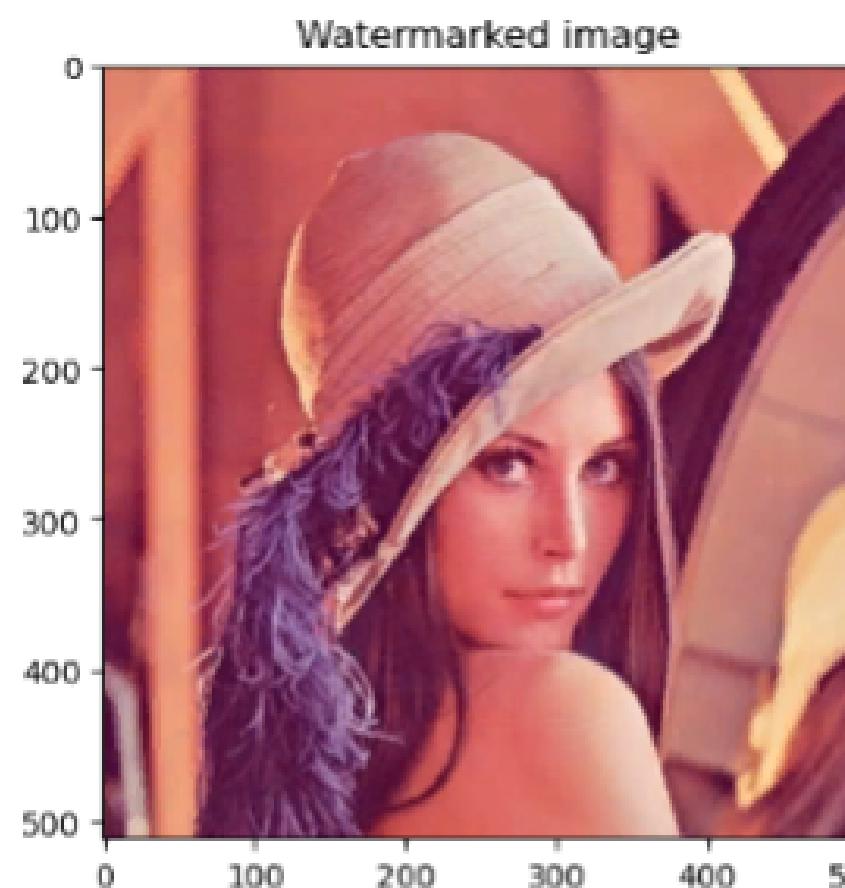
MSE = 13.630, PNSR = 36.786

A couple of
experiments...

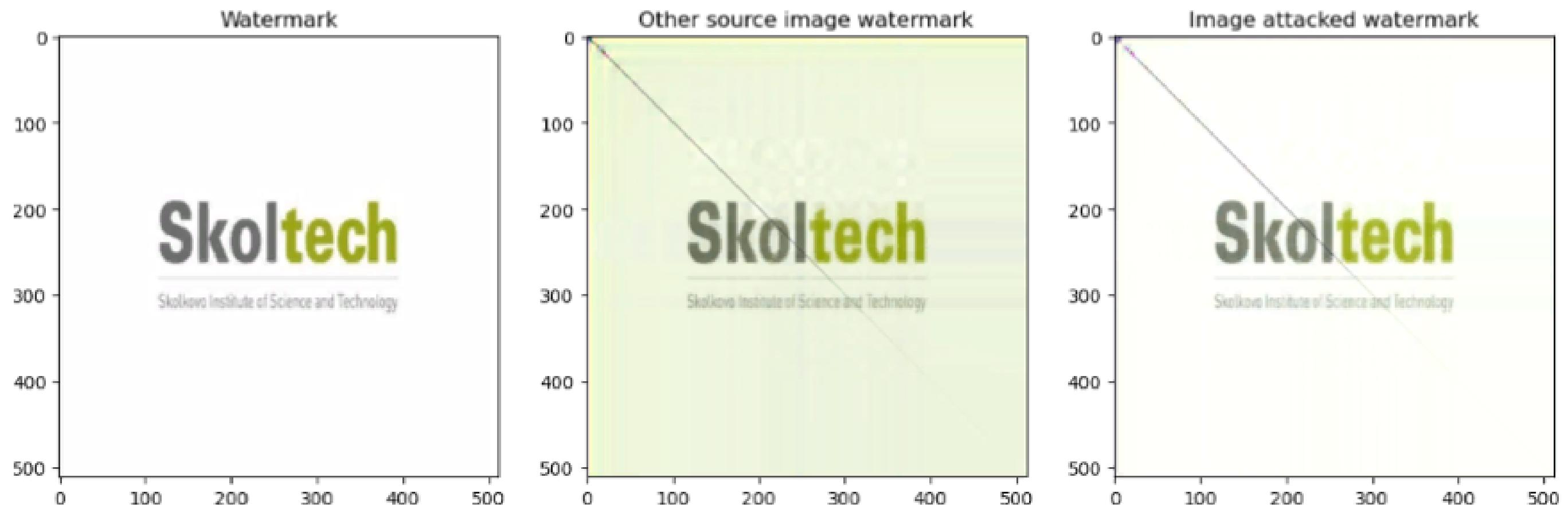
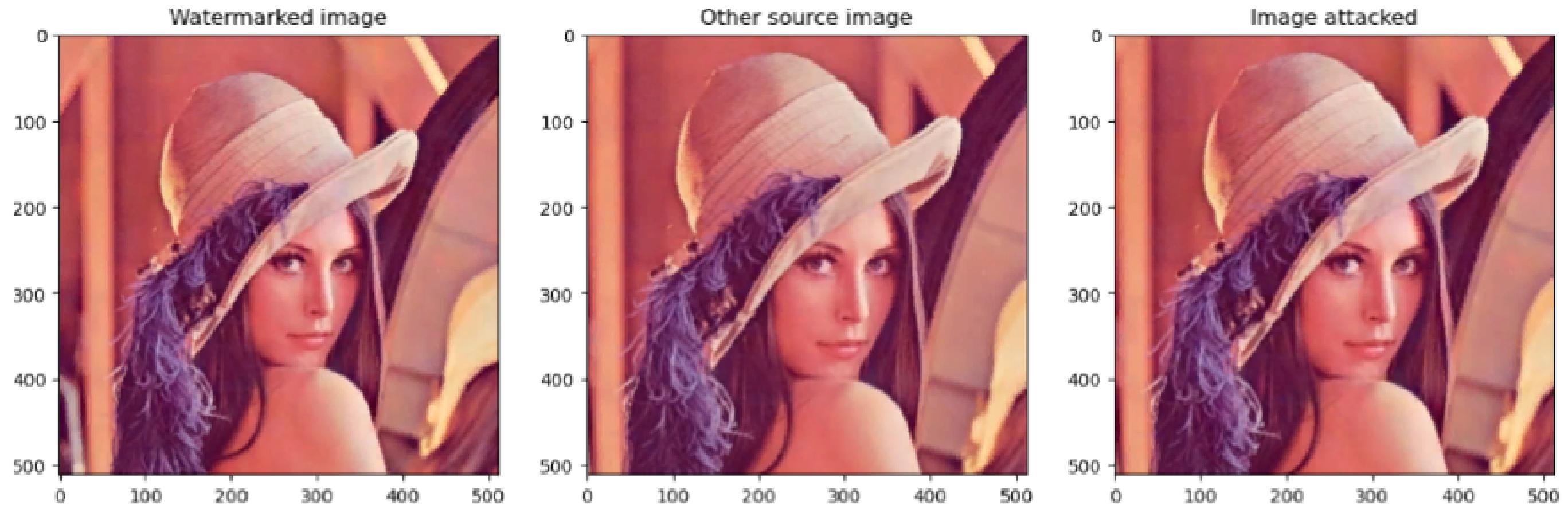
Salt&pepper noise



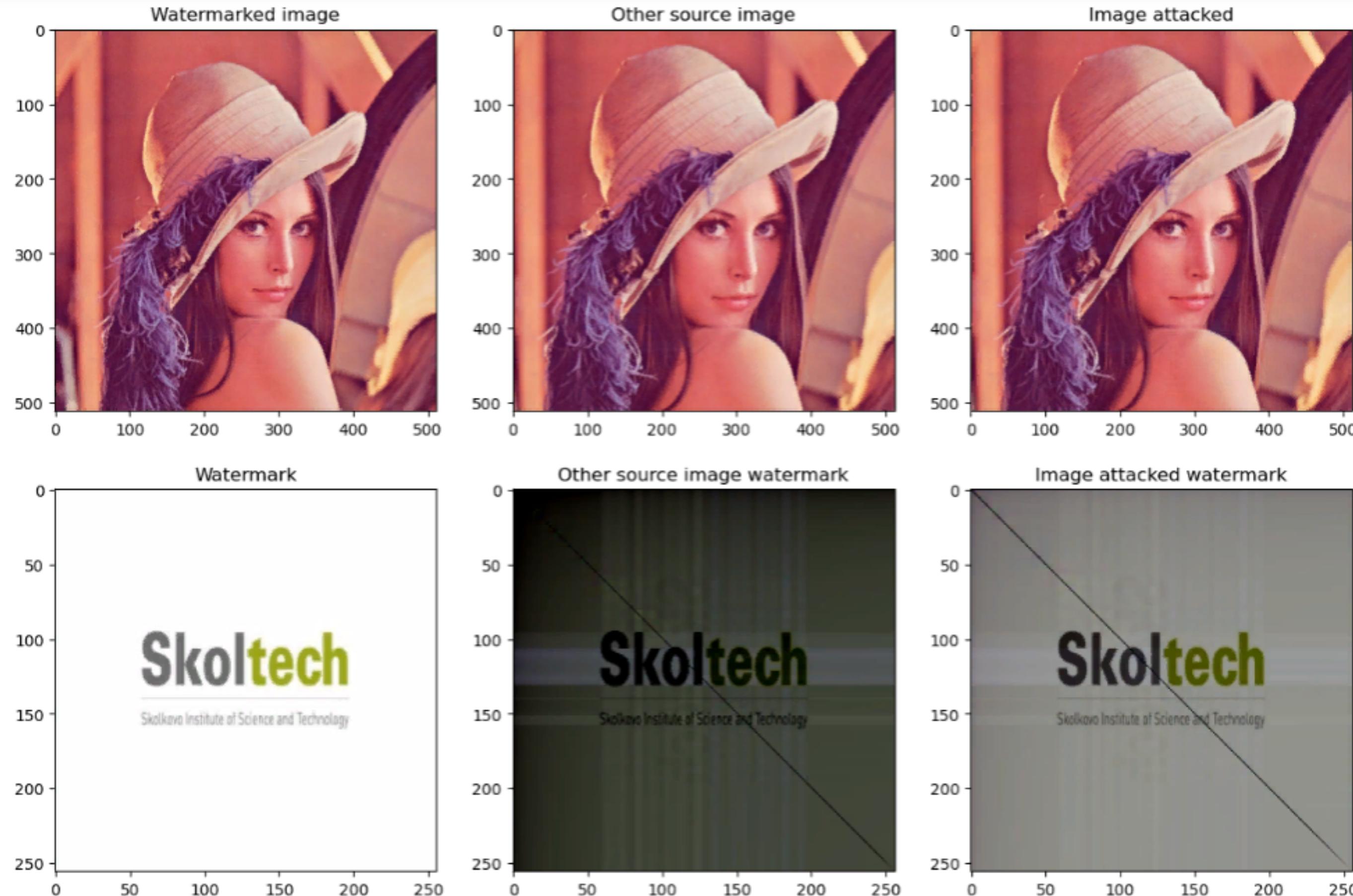
Salt&pepper noise (DWT)



Cropping



Cropping (DWT)



Experiments metrics

	pnsr_img_attacked	pnsr_img_other_source	mse_img_attacked	mse_img_other_source
sp_noise	32.46147	31.09300	36.89213	50.55689
rotate	10.32986	10.33867	6026.90544	6014.69024
blur	32.84674	32.40626	33.76032	37.36410
cropped	15.37378	15.40434	1886.69903	1873.46953
sharpened	5.06885	5.08301	20239.27372	20173.39373
compressed_100	37.68402	34.53477	11.08355	22.88774

Images

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Extracted
watermarks

	pnsr_wm_attacked	pnsr_wm_other_source	mse_wm_attacked	mse_wm_other_source
sp_noise	25.46994	2.32160	184.53826	38099.60198
rotate	2.12548	2.07023	39859.50643	40369.82611
blur	2.71275	1.94811	34818.11775	41521.14531
cropped	6.66577	2.14102	14012.10816	39717.16479
sharpened	11.83142	10.20719	4265.18902	6199.56836
compressed_100	22.69754	2.34751	349.40298	37872.93997

Results

- The algorithm allows **implementing a watermark without changes in the original image** noticeable to human eyes.
- This method **does not completely save us from false-positive** errors, but at the same time, the **watermark is extracted from watermarked images more clearly**.
- This method is **resistant to most of the considered attacks**.

References

- CHIH-CHIN LAI, CHENG-CHIH TSAI, DIGITAL IMAGE WATERMARKING USING DISCRETE WAVELET TRANSFORM AND SINGULAR VALUE DECOMPOSITION,
[HTTPS://IEEEXPLORE.IEEE.ORG/DOCUMENT/5560822](https://ieeexplore.ieee.org/document/5560822)
- FITA A, ENDEBU B, WATERMARKING COLORED DIGITAL IMAGE USING SINGULAR VALUE DECOMPOSITION FOR DATA PROTECTION,
[HTTPS://WWW.RESEARCHGATE.NET/PUBLICATION/330727358_WATERMARKING_COLORED_DIGITAL_IMAGE_USING_SINGULAR_VALUE_DECOMPOSITION_FOR_DATA_PROTECTION](https://www.researchgate.net/publication/330727358_WATERMARKING_COLORED_DIGITAL_IMAGE_USING_SINGULAR_VALUE_DECOMPOSITION_FOR_DATA_PROTECTION)



Thank you!

LET US KNOW IF YOU HAVE
QUESTIONS OR CLARIFICATIONS.