

# Assignment 5: Discrete Fourier Transform

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**Q6: FFT-Based Image Registration**

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## 1. Implementation on Images [Not Noisy]

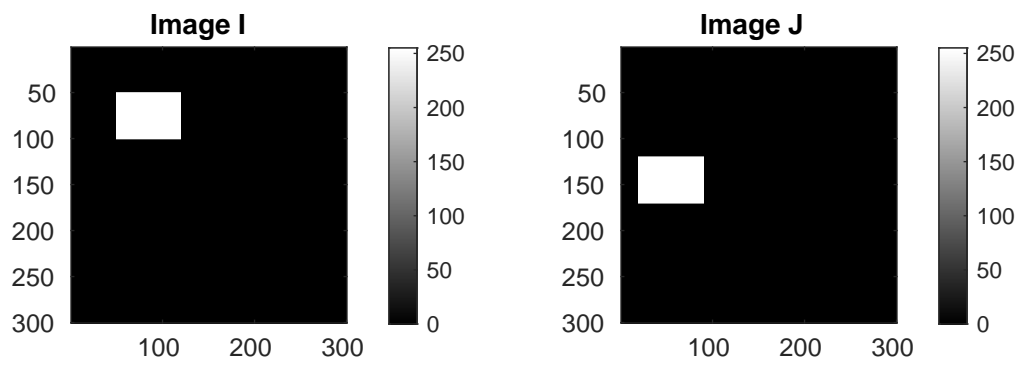


Fig 1: Images I & J [J is obtained by translation of rectangle in I by  $(t_x = -30, t_y = 70)$ ]

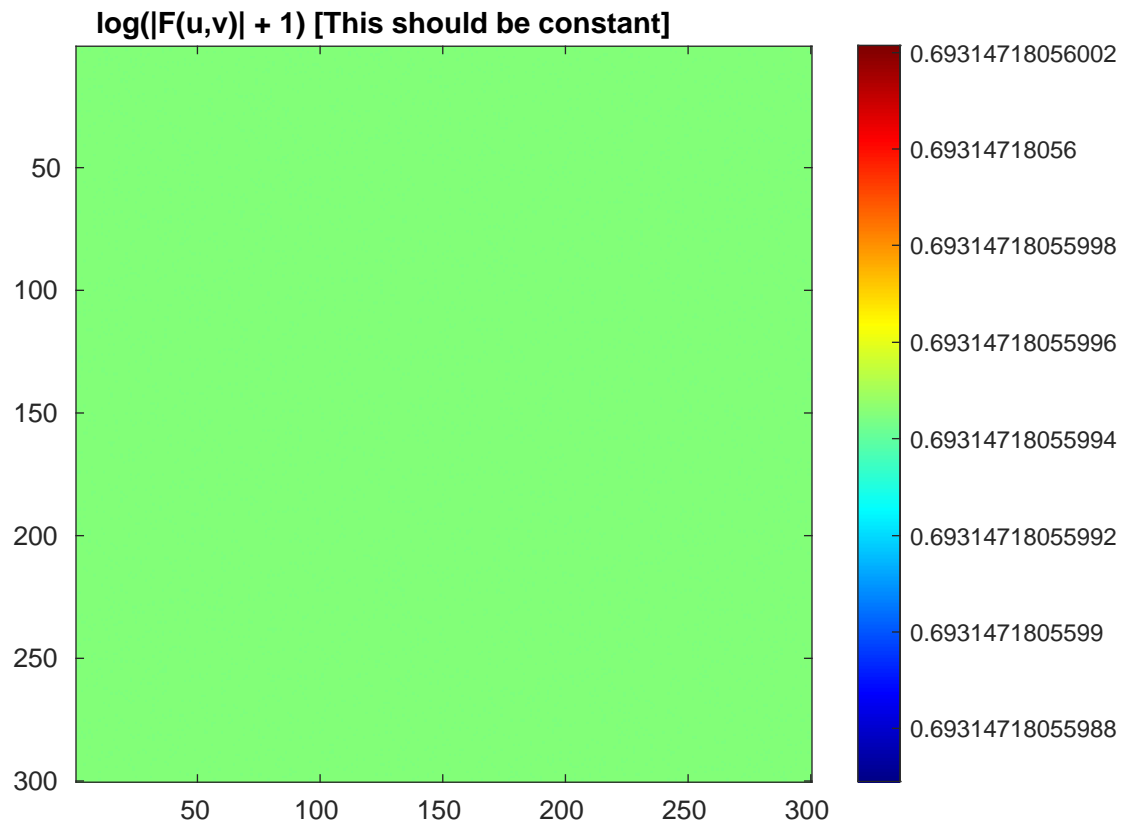


Fig 2: Logarithm of the Fourier magnitude of the cross-power spectrum

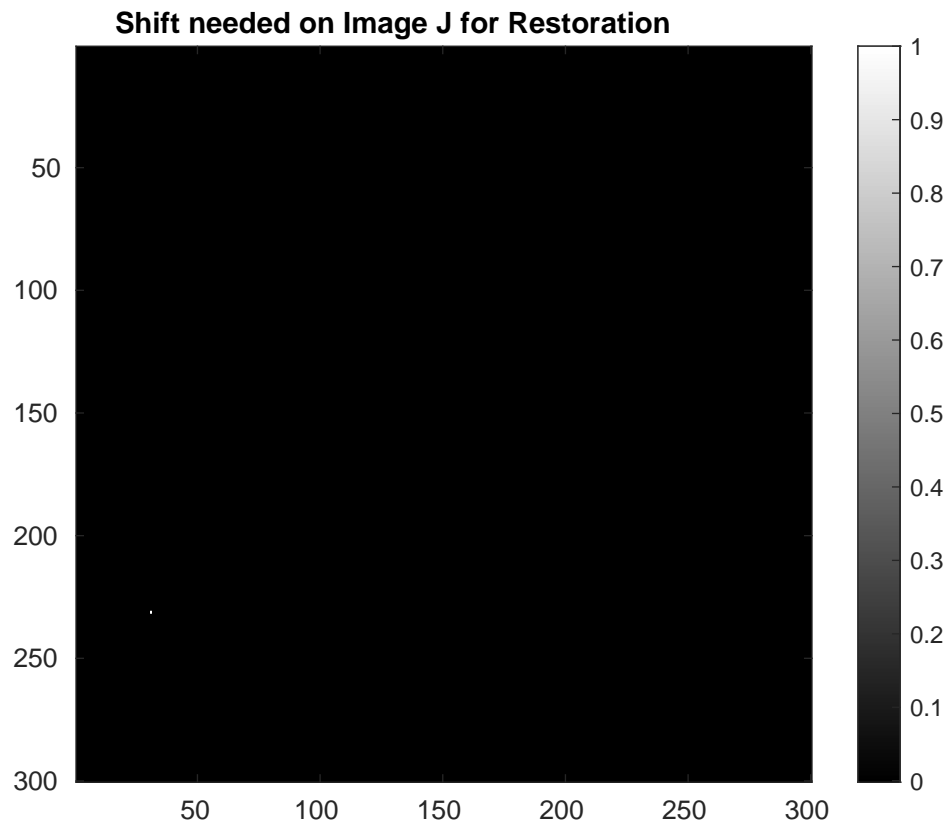


Fig 3: Shift needed on Image J for Restoration

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## 2. Implementation on Images [Noisy]

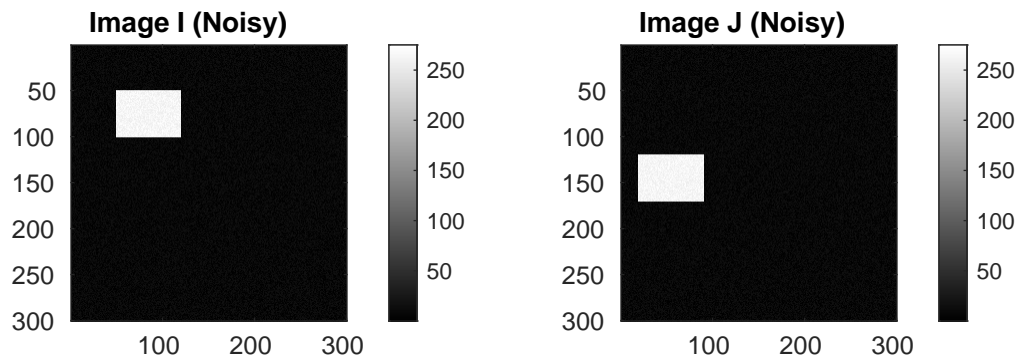


Fig 4: Noisy variants of images I & J [J is obtained by translation of rectangle in I by  $(t_x = -30, t_y = 70)$ ]

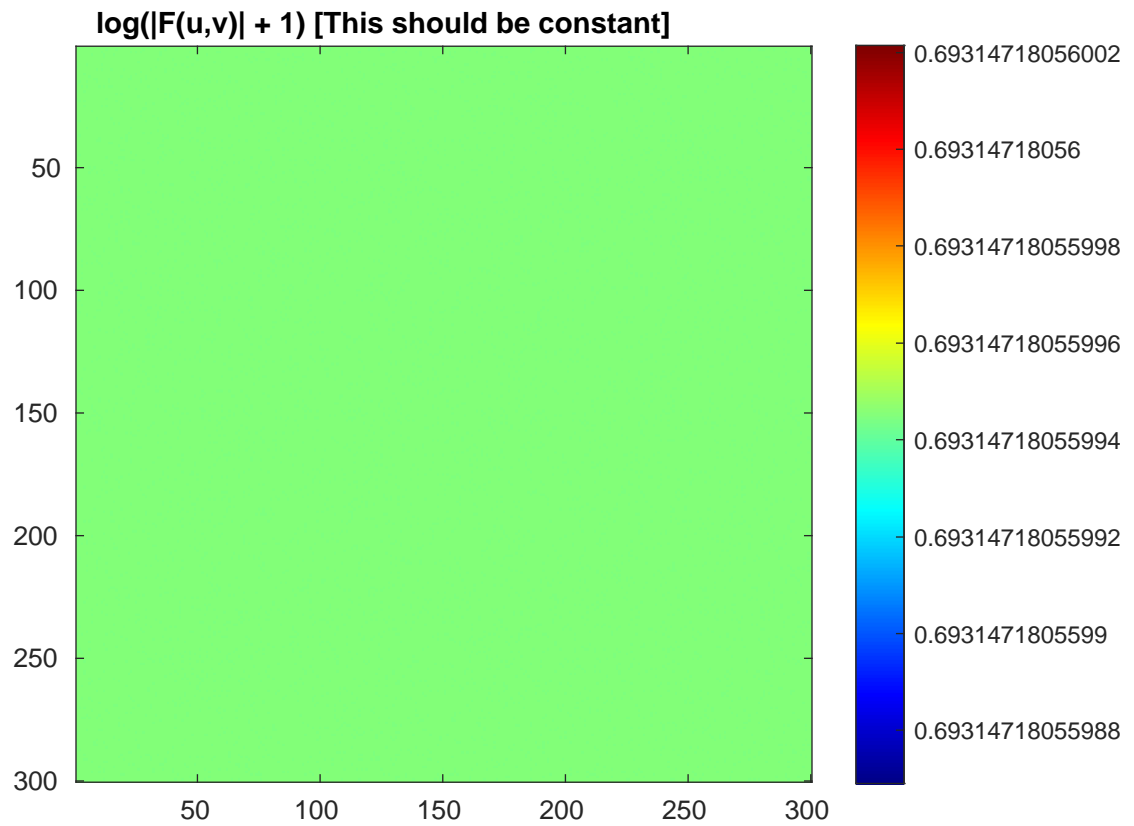


Fig 5: Logarithm of the Fourier magnitude of the cross-power spectrum

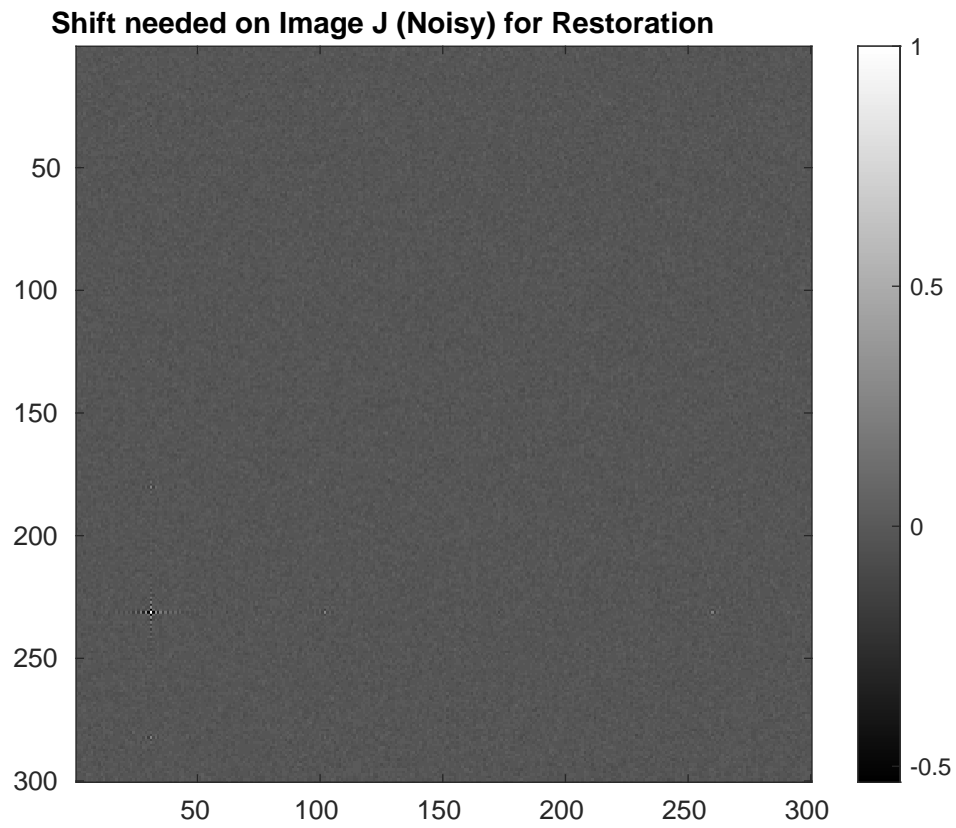


Fig 6: Shift needed on Noisy Image J for Restoration

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## Verification of result produced using Cross-Power Spectrum:

- Figure 3 shows a spike at (31, 231), which could be interpreted as as (31, -71) on applying a wrap-around on the image of size 300 \* 300 while translation. This clearly is the translation to restore Image J back to Image I since the initial translation applied was (-30, 70). Note that the extra '1' is due to the MATLAB indexing.
- Similar to the previous case, figure 6 shows a spike at (31, 231), which could be interpreted as as (31, -71) on applying a wrap-around on the image of size 300 \* 300 while translation. But this time, due to the noise present, the spike is not a clean spike, but surrounded by other frequencies of non-zero magnitude. Moreover, the relative magnitude of the spike w.r.t. surrounding region is not as high as the previous case compared
- We also see that the plots of logarithm of the Fourier magnitudes is a constant of value  $= \log(2)$  because the result of the cross-power spectrum is a complex number of unit magnitude always.



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## Analysis of Time Complexities:

- For an Image of size  $N * N$ , using the cross-power spectrum to predict translation required for restoration involves the calculation of Fourier transforms using FFT [each being of  $O(N \log(N))$ ] followed by a conjugation [ $O(N)$ ] & vectorized pointwise multiplication & division [ $O(1)$ ]. Thus, the overall time complexity is  $O(N \log N)$ .
- If we use pixel-wise image comparison for an  $N * N$  image, the time complexity of predicting the translation would be  $O(N^2)$

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## Approach for Correcting Rotation between Images:

[Here in the analysis, we consider correction if pure rotation of the image & ignore any translation or scaling]

If  $f_2(x,y)$  is a rotated version of  $f_1(x, y)$  [with a rotation of  $\theta_0$ ], doing a Fourier Transform in the cartesian coordinates would yield  $F_2(u, v) = F_1(u\cos(\theta_0) + v\sin(\theta_0), -u\sin(\theta_0) + v\cos(\theta_0))$ . Clearly, their magnitudes are the same. So, we can use the same concept of cross-power spectrum as before by converting the rotation by  $\theta_0$  into a translation. This can be achieved by converting the images into polar coordinates & taking their Fourier Transform:

$$f_2(r, \theta) = f_1(r, \theta - \theta_0)$$

$$F_2(m, n) = \exp(-2\pi j(n.\theta_0)) * F_1(m, n)$$

Thus, cross-power spectrum of  $F_1(m, n)$  &  $F_2(m, n)$  would yield  $\exp(2\pi j(n.\theta_0))$ , using which we can calculate the rotation.

Any translation in  $x$  &  $y$  would lead to a change in  $r$  by  $r_0$ , such that the cross power spectrum would yield  $\exp(2\pi j(m.r_0 + n.\theta_0))$ . Hence, displacement & rotation can be figured out. The exact  $(x, y)$  translations can be figured out using the original cross-power spectrum in the cartesian coordinates.