## Assignment 1: CS 663, Fall 2021

## Question 4

All the images are of dimensions  $460 \times 532$ . Casting them as double arrays transforms them into arrays of size  $1 \times 244720$ .

- (a) J3 = imrotate(J3, 28.5, 'crop')
- (b)
  - 1. Normal Correlation function/Correlation coefficient between J1 and J4 calculated as follows:

$$NCC = \frac{\sum_{(x,y) \in \Omega} (J1(x,y) - \bar{J}1)(J4(x,y) - \bar{J}4)}{\sqrt{\sum_{(x,y) \in \Omega} (J1(x,y) - \bar{J}1)^2 \sum_{(x,y) \in \Omega} (J4(x,y) - \bar{J}4)^2}}$$

2. Joint entropy:

$$JE = \sum_{i1} \sum_{i2} p(J1 = i1, J4 = i2) \log_2 p(J1 = i1, J4 = i2)$$

3. Quadratic Mutual Information(QMI):

$$QMI = \sum_{i1} \sum_{i2} (p(J1 = i1, J4 = i2) - p(J1 = i1)p(J4 = i2))^{2}$$

Marginal Histograms built by integrating the joint histogram as follows:

$$p(J1 = i1) = \sum_{i2} (p(J1 = i1, J4 = i2))$$

$$p(J4 = i2) = \sum_{i1} (p(J1 = i1, J4 = i2))$$

i1 and i2 used in calculations of JE and QMI are bins of size 10 ranging from 0 - 260

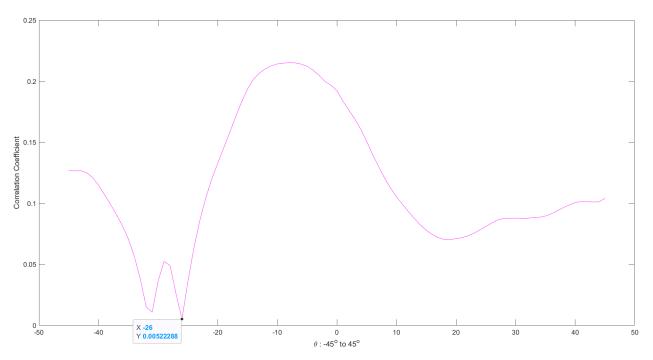


Figure 1: Correlation coefficient v/s  $\theta$ 

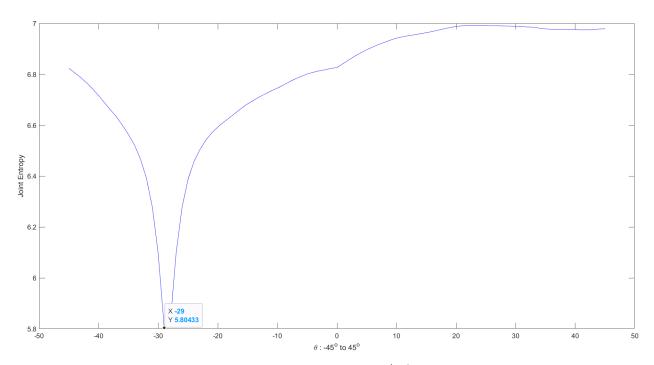


Figure 2: Joint Entropy v/s  $\theta$ 

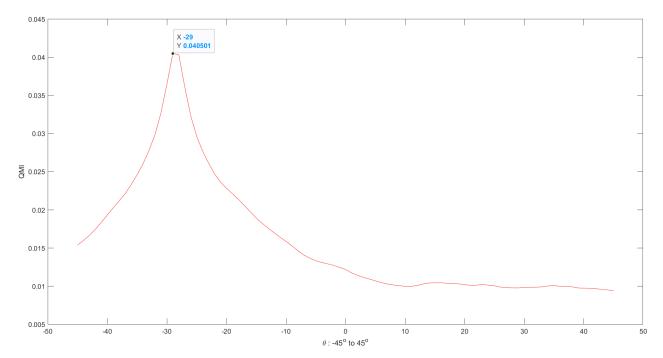


Figure 3: Quadratic MI v/s  $\theta$ 

- (d) From the plots, we can infer that the optimal rotation occurs at angles at which, the plot has a very steep peak or a trough.
  - 1. In the NCC plot, the best alignment occurs at the minimum value. In the plot, the NCC is minimum at  $\theta = -26^{\circ}$  (i.e.  $26^{\circ}$  clockwise). Also can be observed is that the plot has a local peak at  $-29^{\circ}$ .
  - 2. In the Joint Entropy plot, minimum is at  $-29^{o}$  and the entropy at  $-28^{o}$  is just negligibly higher.
  - 3. The QMI at  $\theta = -29^{\circ}$  and  $\theta = -28^{\circ}$  is almost the same.  $-29^{\circ}$  has the highest QMI and is, hence, the optimal angle in the QMI plot.

The three measures do a pretty good job at estimating the rotation which is 28.5°. The NCC plot's estimation is a bit off compared to others because it is only good at estimating alignment when the images' intesities are linearly related and the images we used likely have a functional relationship that isn't linear. Joint Entropy does a better job in this case.

(e)

Optimal rotation in **JE** vs  $\theta = -29$  degrees.

Defined a variable 'JH' to store the Joint Histogram between J1 and optimal J4. The code to plot this is as follows:

imagesc(5:10:255, 5:10:255, JH) colorbar

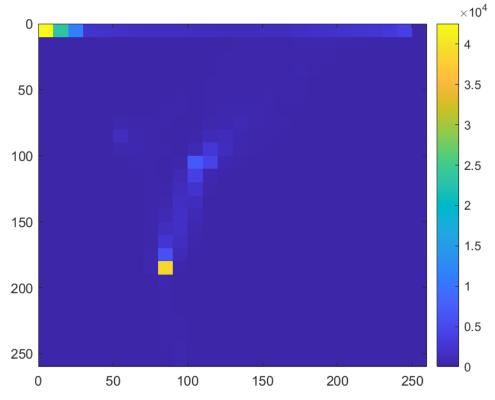


Figure 4: Joint Histogram between J1 and best J4

(f) We can say that the random variable  $I_1$  and  $I_2$  are statistically independent if

$$p(I_1 = i_1, I_2 = i_2) = p(I_1 = i_1)p(I_2 = i_2) \forall i_1, i_2 \in \Omega$$
$$QMI = \sum_{i_1} \sum_{i_2} (p(J_1 = i_1, J_4 = i_2) - p(J_1 = i_1)p(J_4 = i_2))^2$$

- We can observe that the above expression for QMI is always  $\geq 0$  and would equate to 0 if  $J_1$  and  $J_4$  satisfy the above condition of being statistically independent.
- We can say the statistical independence between intensity random variables of two images directly corresponds to the amount of misalignment between them.
- Hence, QMI would be very less or close to 0 for images which have no physical correspondance or are misaligned. And, this measure achieves its maximum when images are aligned. This can be observed from the plot.