

# EE C145B / BioE C165 Spring 2004: Midterm

## **READ THIS BEFORE YOU BEGIN:**

Questions 1,2 and 3 are compulsory. You must choose to answer six questions from among 4-12. You may answer bonus questions 13-15 if you wish. If you answer more than six questions from among 4-12, only the first six of these will be graded unless you delete the answers to those you do not wish to be graded. Questions 8 and 11 also contain bonus points. You must include either or both of these among the six elective questions if you wish to score these bonus points.

Questions marked with an asterisk are more difficult. It may be prudent to answer them towards the end of the examination period.

## **READ THROUGH ALL QUESTIONS BEFORE YOU BEGIN.**

Total points: 210 + 55 bonus.

## **Question 1 (46) COMPULSORY**

Match the following to elements of the list below. More than one match is possible for each. You must list all the matches (in ascending numerical order) to get credit for each. Ask yourself “is this match always true?”.

1. 2D convolution matrix \_\_\_\_\_
2. 2D Hamming window (in space) \_\_\_\_\_
3. histogram equalization \_\_\_\_\_
4. left singular vectors or matrix containing them \_\_\_\_\_
5. SVD \_\_\_\_\_
6. Radon transform \_\_\_\_\_
7. median filter \_\_\_\_\_
8. right singular vectors or matrix containing them \_\_\_\_\_
9. singular values or diagonal matrix containing them \_\_\_\_\_
10. DFT \_\_\_\_\_
11. DSFT \_\_\_\_\_
12. 1st derivative edge detector \_\_\_\_\_
13. FT \_\_\_\_\_
14. ideal ramp filter (analogue) \_\_\_\_\_

15. ideal reconstruction filter \_\_\_\_\_
16. convolution \_\_\_\_\_
17.  $h(x, y) = 3x^2$  \_\_\_\_\_
18. aliasing \_\_\_\_\_
19. Laplacian edge detector (discrete) \_\_\_\_\_
20. 2D discrete Radon transform matrix \_\_\_\_\_
21. Butterworth filter \_\_\_\_\_
22. Windowing \_\_\_\_\_
23. jinc function \_\_\_\_\_

List of possible matches:

1. Convolution matrix
2. non-linear
3. decreases spectral resolution
4. decreases spatial resolution
5. space domain
6. frequency domain
7. span range
8. span nullspace
9. non-negative
10. positive
11. attenuates edge effects
12. negative
13. non-positive
14. periodic in space domain
15. periodic in frequency domain
16. discrete frequency axis
17. discrete space axis
18. high pass
19. low pass
20. maximally flat in passband
21. lowest phase distortion
22. all pass

23. mutually normal
24. linear
25. conserves energy / mass
26. block Toeplitz
27. contains all radial frequencies up to cutoff
28. Toeplitz
29. separable
30. zero when applied to constant gray level
31. zero when applied to gray level ramp
32. mutually orthogonal
33. unitary
34. full rank
35. digital filter

## Question 2 (20) COMPULSORY

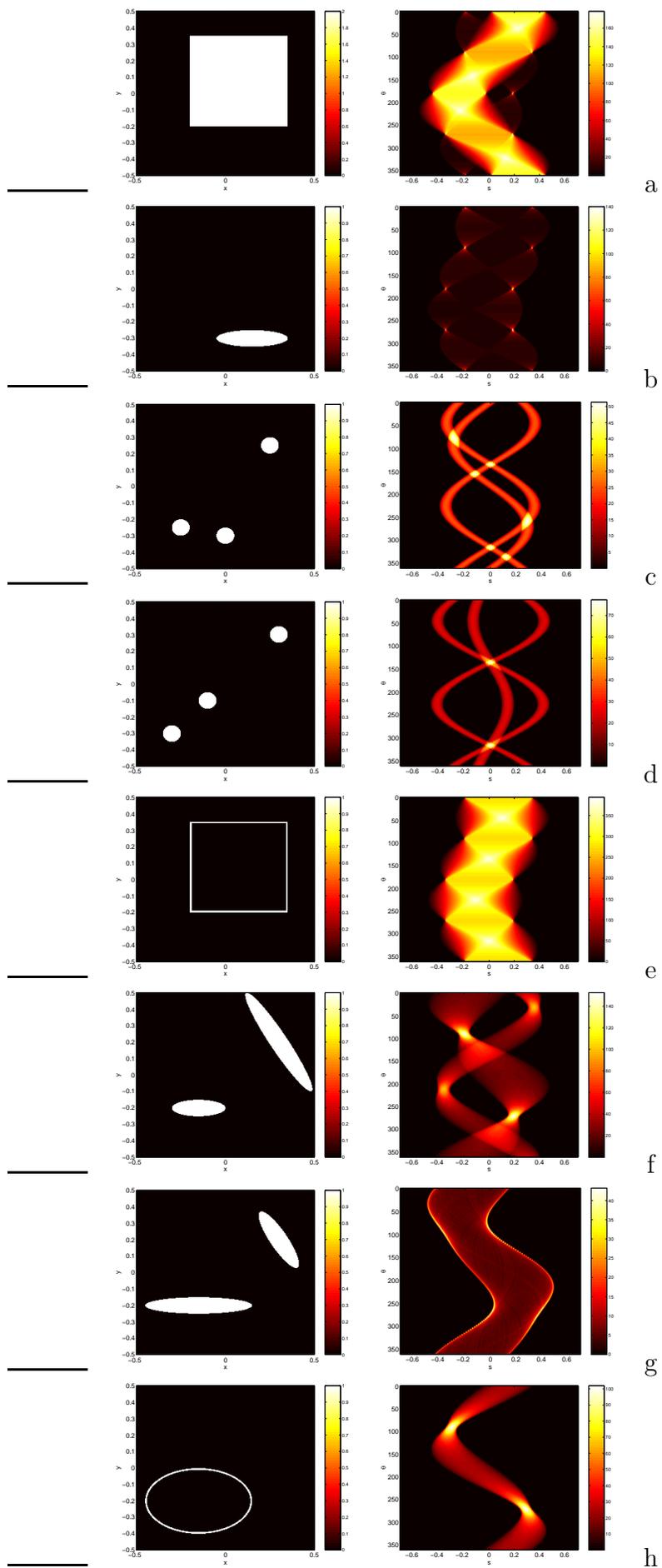
You are given the following matrix that represents the gray levels of an image:

$$\begin{bmatrix} 0.8 & 0.8 & 0.4 & 0.8 \\ 0.7 & 0.1 & 0.3 & 1.0 \\ 0.5 & 0.6 & 0.9 & 1.0 \\ 0.6 & 0.1 & 0.0 & 0.8 \end{bmatrix}$$

Equalize the histogram of this image. Show all steps. Use five histogram bins spanning the range  $[0, 10]$ . Map values to the lowest gray level in each bin.

## Question 3 (24) COMPULSORY

Match the elements in the left column to those in the right that could possibly be their Radon transforms. Enter the letter identifying the match on the line to the left of each row.



## Question 4 (20)

Show mathematically and graphically, starting with an arbitrary continuous space signal  $f(x)$  why its DFT is periodic and why the DFT assumes the samples of this signal are periodic. Assume signal is sampled without aliasing at  $u_s = X$  samples per distance unit. Hint: apply multiplication-convolution FT property, and use periodic combs of impulses to represent sampling.

## Question 5 (20)

1. Explain the difference between image enhancement and restoration.

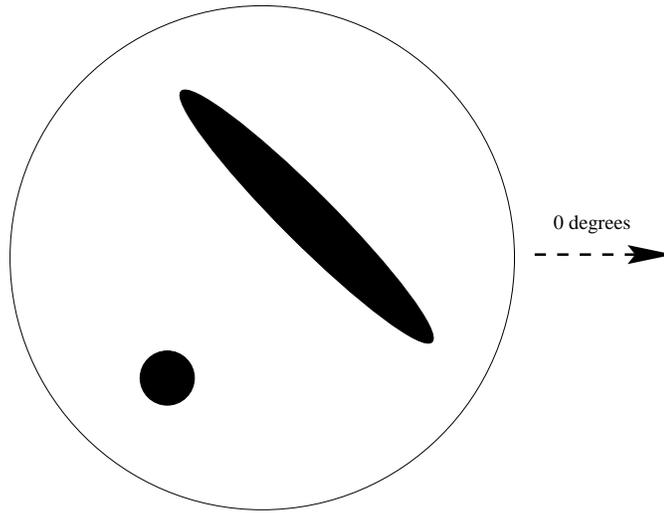






## Question 9 (20)

1. Draw the sinogram of the objects in the distribution below. The parameter  $\theta$  corresponds to the direction of  $\theta$  as defined in the Radon transform. Label the axes.



## Question 10 (20)

The following matrix contains a cropped area of a larger image:

$$\begin{bmatrix} 2 & 5 & 3 & 0 & 0 \\ 8 & 7 & 1 & 8 & 2 \\ 5 & 4 & 3 & 0 & 5 \\ 1 & 2 & 9 & 11 & 2 \\ 6 & 5 & 3 & 8 & 4 \\ 1 & 0 & 6 & 7 & 2 \end{bmatrix}$$

Consider the element at row 3 and column 3 of this matrix.

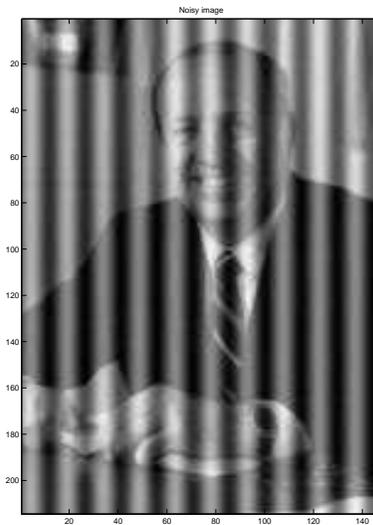
1. What would a  $5 \times 5$  median filter replace this value with? Specify your conventions.
2. What would a  $3 \times 3$  max filter replace this value with?

## Question 11 (20 + 10 bonus)

Prove that the values of  $F(u, v)$  along the radial line  $v = mu + c$  where  $c = 0$  in 2D Fourier space correspond to the 1D Fourier transform of the Radon projection of  $\mathcal{F}_1^{-1}\{F(u, v)\}$  for a particular value of  $\theta$ . Express  $\theta$  in terms of  $m$ . Hint: This is simply the proof of the projection theorem run through backwards.

## Question 12 (20)

Show diagrammatically how to remove the artifact in the image below.



1. Using a 1D digital filter:

2. Using an analog method:

### **Question 13 (10 bonus)**

We have seen in Problem Set II that any image can be viewed as an interference pattern of different 2D sinusoidal functions. You take a  $1024 \times 768$  picture in the Golden Gate Park that you want to use for your computer desktop background. Your default display has a resolution of  $1600 \times 1200$  pixels. You use photoshop to modify your image so that you have:

Image size =  $16 \times 12$  cm

Resolution = 100 pixels/cm

What is the frequency of the highest frequency sinusoid that may be present in your image?

### **Question 14 (15 bonus)**

\* Explain mathematically how you could calculate the SVD of a matrix  $\mathbf{F}$  given that you know how to find the eigenvectors and eigenvalues of a matrix. Give two reasons why this is not such a good way of finding the SVD.

## Question 15 (20 bonus)

\* In class, we derived the pseudoinverse by formulating the sum of squared residuals:

$$C = \sum_{m=1}^M r_m^2 = \sum_{m=1}^M \left[ \sum_{n=1}^N f_n^m(x_m) \theta_n - y_m \right]^2$$

and minimizing it by taking its derivative with respect to each of the parameters  $\theta_n$ , setting these equations equal to zero, and solving for  $\boldsymbol{\theta}$ . It is much easier to derive the pseudoinverse from the vector formulation. Show the matrix equation that gives the vector that minimizes  $C$ . Hint:

$$\frac{d}{d\mathbf{x}} \mathbf{Q} \mathbf{x} = \mathbf{Q}^T$$

$$\frac{d}{d\mathbf{x}} \mathbf{q} \mathbf{x} = \mathbf{q}^T$$

$$\frac{d}{d\mathbf{x}} \mathbf{x}^T \mathbf{Q} \mathbf{x} = 2 \mathbf{Q} \mathbf{x}, \text{ for } \mathbf{Q} = \mathbf{Q}^T$$

$$\frac{d}{d\mathbf{x}} \mathbf{x}^T \mathbf{Q} = \mathbf{Q}$$

$$\frac{d}{d\mathbf{x}} \mathbf{x}^T = \mathbf{I}$$