

Prob#	1	2	3	4	5	6	7	8	Total
Score	20	13	10	9	9	5	12	6	84

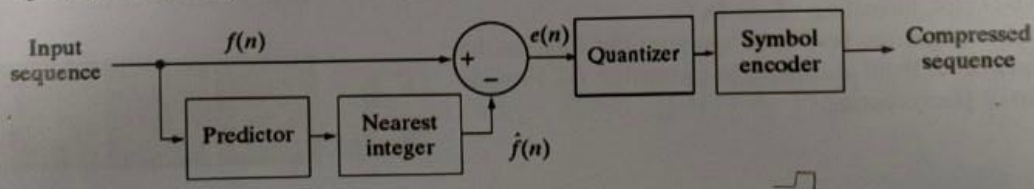
1. [24%] Answer the following questions:

- What is the purpose of subband coding? How is it used in discrete wavelet transform of an image?
- Consider the periodic sequence "1 3 2 1 3 2 1 3 2..." down-sampled by a factor of 2. Use this as an example to explain the cause of "aliasing". How is this related to the sampling theorem?
- For JPEG coding, the quantization matrix ( $Z(u,v)$ ) is a pre-specified normalization matrix multiplied by a positive constant. How is this constant related to the compression ratio and the quality of the reconstructed image?
- Explain what the "impulse response" of a frequency-domain filter is, and use it to explain the "ringing" caused by ideal LPF in images.
- The "degradation function" of an image is given as  $g(x,y) = h(x,y) * f(x,y) + \eta(x,y)$ . Here  $f$  and  $g$  represent the images before and after degradation, respectively. Explain what  $h$  and  $\eta$  represent.
- Explain the source of wrap-around error in discrete Fourier transform, and the standard procedure to prevent it.

2. [16%] These are questions related to the group presentations. Each is worth 2 points, up to a total of 16 points. Clearly indicate the questions you're answering.

- Give two applications of image inpainting.
- The active contour energy function involve internal and external energy terms. Which is intended to make the contour "fit to image edges"?
- What is the meaning of "saliency" in images? human 眼睛 注意.
- Name a type of convolutional neural networks used in image compression.
- Pairs of image patches are used to train models for learning based super resolution. What is the relation between the two images in a pair?
- Give two methods/techniques of obtaining depth information of images.
- Describe the least-significant-bits method of image watermarking.
- One denoising method using CNN aims to learn a residual function. What does this function try to model?
- What information is used when grouping pixels into superpixels with the SLIC algorithm?
- What does the "blending" step in image stitching do?
- What differences are in the multiple images used to produce a HDR image?

3. [10%] Explain why this block diagram for a lossy predictive coder is incorrect, and how you can fix it.

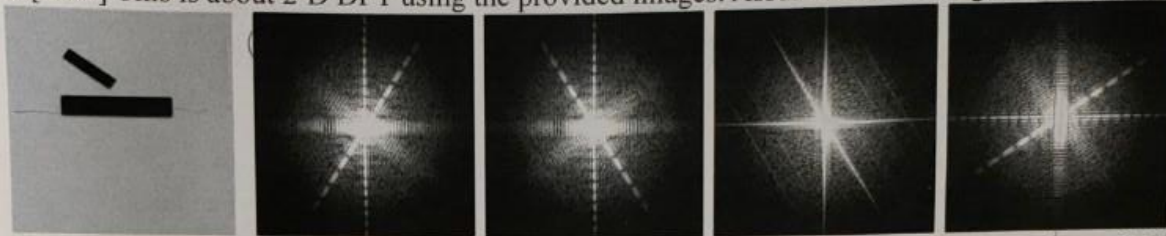


4. [10%] This problem is about arithmetic coding. Given the intervals for the four symbols  $a_1, a_2, a_3, a_4$ ,

- Give the 3-element string obtained by decoding 0.25.
- Find the shortest binary number needed to encode the 2-element string  $a_2 a_3$ .

Source Symbol	Probability	Initial Subinterval
$a_1$	0.2	[0.0, 0.2)
$a_2$	0.2	[0.2, 0.4)
$a_3$	0.4	[0.4, 0.8)
$a_4$	0.2	[0.8, 1.0)

5. [10%] This is about 2-D DFT using the provided images. Assume that the original size is 100x100.

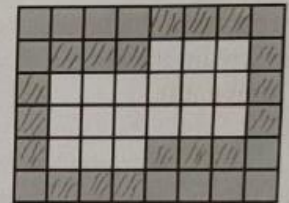


- Among the right four images, which is the likely Fourier transform of the leftmost image? Explain.
- The transform images have the brightest part near the center. How do we achieve this centering?
- What happens if the two rectangles in the original image are rotated clockwise by 10 degree?
- What happens if the two rectangles are moved downward by 30 pixels?
- What happens if the original image is resampled to 200x200 while keeping the appearance unchanged?

6. [10%]

- In the binary image, the white pixels are the foreground pixels. Using a structuring element consisting of the center pixel and its 4 neighbors, draw the foreground pixels after the morphological operation given below. Here set  $A$  contains the foreground pixels and set  $B$  is the structuring element. The operation  $\oplus$  is dilation.

$$(A \oplus B) - A$$



- Give the two structuring elements needed for using hit-or-miss transform to detect the shape represented by  $B$  in (a).

7. [12%] For the following sequence of pixel values: 1' 2' 3' 4' 5' 6' 7' 8' 7' 6' 5' 4' 3' 2' 1' 0

- Compute the entropy of the sequence itself.
- Create the "difference sequence" by replacing every pixel value (except for the first one) with its difference from the previous pixel value.
- Compute the entropy of the difference sequence.
- Use the above results to explain the benefit of predictive coding in image compression.

The equation for entropy is given by  $H = -\sum_f p(f) \log_2[p(f)]$ . Here  $p(f)$  is its probability of a symbol  $f$ .

8. [8%] The transfer function of a filter is given by  $H(u, v) = \frac{[D(u, v)]^2}{D_0^2 + [D(u, v)]^2}$ .

- Draw its  $H$ -vs- $D$  plot, indicating where  $D_0$  is.
- The three right images are results of applying the filter to the leftmost image. Order them according to increasing  $D_0$ . Provide an explanation of your ordering.

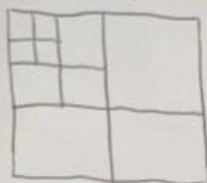




3.955.45

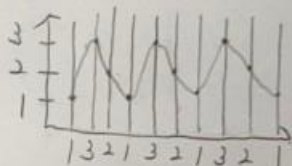
subband coding

(a)

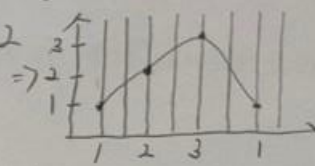


為了降低需儲存之資訊，原來在DWT需存下  $1/4$  之原圖，以及其他相鄰 pixel 之差異量，用 subband coding 對縮小之圖片做同樣事情

(b) 原先之 sequence



若 downsample by 2



由於 downsample 導致 sequence 改變，形成不同之頻率稱為 aliasing。

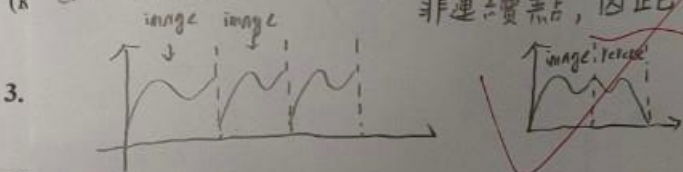
(c) 在 JPEG 當中，經過 DCT 之結果會由  $z(u,v)$  quantization,  $z(u,v)$  值愈大，量化後值愈小，所需 bit 愈少，但品質愈差，因為量化會將區間內值壓成一樣，區間愈大壓縮值愈多，而乘上之 positive constant 則可控制此量化區間 ( $z(u,v)$ ) positive constant 大 compression ratio 上升 quality 下降。

(d) impulse response 為  $\delta$  function 當作 filter 在 frequency-domain, 用以得到一頻率之值，ideal LPF 可想成多個在低頻之  $\delta$  function，由於  $\delta$  function 轉回 spatial domain 為 constant function。

(e)  $h(x,y)$  為 degradation function (通常為一特定之 filter)

$n(x,y)$  為 noise function

(f) 由於圖片在做 DFT 時，會將圖片當作一段波峰到波谷，因此在做 DFT 之前會想成無限 repeat 之 image 拼成之訊號，但圖片左右，上下不會正好能相連，導致訊號有非連續點，因此將圖片反轉拼貼，使其形成連續訊號。



(a) 還原因傳輸而損失之 pixel，去除圖片中之特定物骨體 +2

(b)

(c) human 關注之圖片區域 +2

(d) SR CNN, SR Flow

(e) 一張為 HR (High resolution) image, 一張為 LR (Low resolution image), 兩張為相同圖片僅解析度不同 +2

(f) 利用 Lidar, Kinect, 去得到 depth information.

2. 利用 CNN 預測單張影像深度

✓ +2

(g)

(h) inverse noising function. ✗ +1

(i)

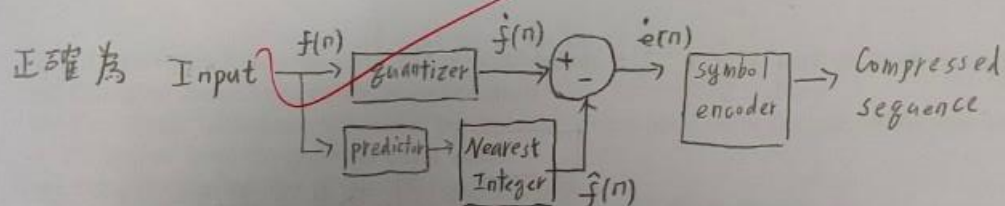
(j) 在 image stitching 時, 直接將 image 拼貼會有不連續感, 用 image blending 將 image 拼起來以消除此情形。blending =  $\alpha A + (1-\alpha)B$ ,  $A, B$  為圖

✓ +2

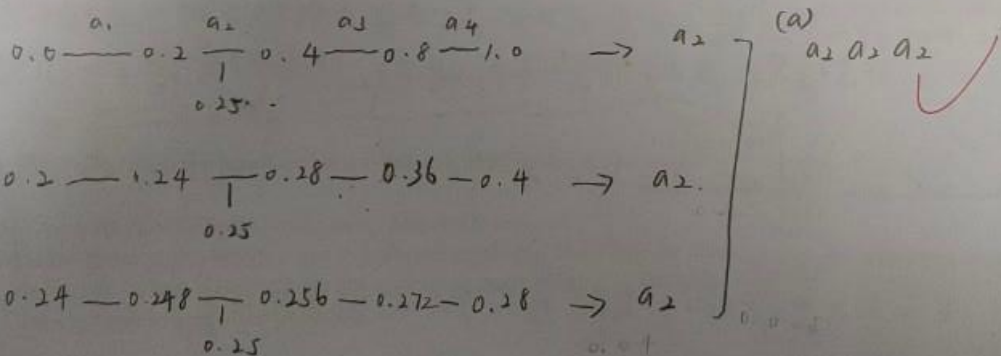
(k) 為不同曝光時間之照片, 以此來重建其光場, 形成 HDR image

✓ +2

3. 由於  $e(n)$  為 2 相鄰 bit 之差異, 以此做 quantize, quantizer 所造成之 loss 會影響到還原時的預測, 使其愈來愈不準。



4.



$a_2 a_2 \rightarrow 0.28 \sim 0.36 \rightarrow$  最短 binary number 為  $0.3125 = \frac{1}{4} + \frac{1}{16}$

$$0.3125_{10} = \frac{0.00101}{0.0101}$$

-1



張數 = 309553045

(a) 第一張，若以此為例



由於此圖片在 x 軸訊號為

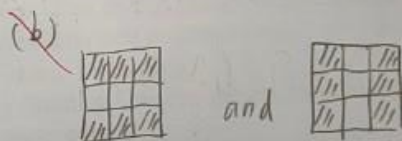
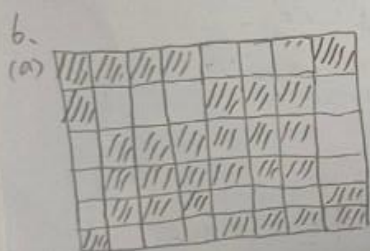
比 y 軸之訊號 ~~窄~~ 之寬，因此需更多高頻資訊，所以 x 方向之間距較小，由此推出 (2)

(b) 乘上  $f(x,y) = -1^{(x+y)}$

(c) 在 frequency-domain 也會跟著正旋轉 10 度

(d) 在 frequency-domain 不會改變

(e) 在 frequency-domain 會 rescale 2 倍 -1



7.

0 1 2 3 4 5 6 7 8  
1 2 2 2 2 2 2 2 1 total = 16

$$(a) -\sum_{i=0}^8 P(i) \log P(i) = -\left(\frac{1}{16} \cdot \log \frac{1}{16} \times 2 + \frac{2}{16} \cdot \log \frac{2}{16} \times 7\right)$$

$$= \frac{4}{16} \times 2 + \frac{6}{16} \times 7 = \frac{50}{16} = \frac{25}{8} \#$$

(b)

1 2 3 4 5 6 7 8 7 6 5 4 3 2 1 0  
→ 0 1 2 3 4 5 6 7 -1 -1 -1 -1 -1 -1 -1

(c)

$$-1 \ 0 \ 1$$

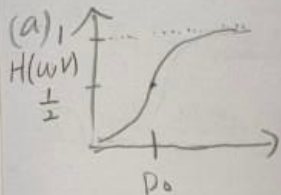
$$8 \ 1 \ 7$$

$$-\sum_{i=-1}^1 P(i) \log P(i) = -\left(\frac{8}{16} \cdot \log \frac{8}{16} + \frac{1}{16} \log \frac{1}{16} + \frac{7}{16} \log \frac{7}{16}\right)$$

$$= -\left(-\frac{1}{2} - \frac{1}{4} + \frac{7}{16} \log \frac{7}{16}\right)$$

(d) 由於相鄰 bit 通常有許多相同之訊息，用 predictive code 減少訊息量以利用於壓縮

8.  $H(u, v) = \frac{1}{1 + \left[ \frac{D_0}{D(u, v)} \right]^2}$



→ high-pass

(b)  $D_0$  愈大, 能通過之波就愈高頻,

