# THE UNIVERSITY OF AUCKLAND

### FIRST SEMESTER, 2011 Campus: City

### **COMPUTER SCIENCE**

#### **COMPSCI 773: Intelligent Vision Systems**

### (Time allowed: TWO hours)

#### NOTE: Attempt all questions!

Write the answers in the boxes below the questions.

Marks for each question are shown just before each answer box.

This is an open book exam. Candidates **may** bring calculators, notes, reference books, or other written material into the examination room.

Section:	Α	B	С	Total
Possible marks:	25	50	25	100
Awarded marks:				

SURNAME:

#### FORENAME(S):

#### STUDENT ID:

QUESTION/ANSWER SHEETS FOLLOW

## Section A: Patrice: 3D geometry/calibration: 25 marks

1.

[25 marks]



**Section B:** Epipolar geometry and binary machine vision

#### Section B:.1 Calibration

2. Consider a 3 by 3 calibration matrix with  $r_1$ ,  $r_2$ , and  $r_3$  colum vectors. In both Tsai and Zhang's calibration,  $r_1$  and  $r_2$  are obtained first. Explain why and how  $r_3$  can be inferred from  $r_1$  and  $r_2$ ? [3 marks]



4. Consider the 3D world reference frame in which all cartesian points are written as  $X_w = \begin{bmatrix} X_w \\ Y_w \\ Z_w \end{bmatrix}$ . Consider the camera reference frame in which all cartesian points are written as  $M_c = \begin{bmatrix} X_c \\ Y_c \\ Z_c \end{bmatrix}$ .

Consider the 3 by 3 rotation R and translation T which relates the camera reference frame to the world reference frame. Write the transform M such that  $X_w = MX_c$  as a 4 by 4 homogeneous matrix. [3 marks]

5. Write the homogeneous matrix  $\tilde{M}$  which relates  $X_c$  to  $X_w$  as a function of R and T ( $X_c = \tilde{M}X_w$ ). [3 marks]

6. Application: Consider q4 and q5, Rotation  $R = \begin{bmatrix} 1\sqrt{2} & 1\sqrt{2} & 0 \\ -1\sqrt{2} & 1\sqrt{2} & 0 \\ 0 & 0 & 1 \end{bmatrix}$  and translation T  $r_2 = \begin{bmatrix} 1 \end{bmatrix}$ 

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 $\begin{bmatrix} 1 \\ 0 \\ 1 \end{bmatrix}$ . Compute *M* and  $\tilde{M}$ . Show your working. [4 marks]

#### Section B:.2 Stereo vision

7. Two identical cameras, with optical centres  $O_1$  and  $O_2$ , are placed in epipolar positions with parallel optical axes  $(O_1O_1 \text{ and } O_2O_2)$  as displayed in the above figure. The distance between the optical centres is known as the baseline distance b and the focal length for both camera is given by f. p is the physical width of one pixel on the cameras sensor and n the number of pixels on

one scanline with  $W_{chip}$  the cameras sensor width, or scanline width. A point P at depth Z appears in each image at different position on a scanline. The disparity  $d_P$  of point P, is given by  $d_P = d_2 - d_1$ .

Exhibit the formula which links the disparity  $d_P$  to the depth Z at point P, the focal length f and the baseline b (Show your working). [3 marks]

8. Consider  $R_1$ ,  $T_1$  and  $R_2$ ,  $T_2$  rotation and translation matrices which relate camera 1, respectively camera 2, with the **same** calibration object. Find the matrix P which relates camera 1 and camera 2 optical centers ( $O_2 = PO_1$ ) as a function of matrices  $R_1$ ,  $T_1$ ,  $R_2$ , and  $T_2$ . Show your working. [3 marks]

9. Consider the following values for  $R_1$ ,  $T_1$  and  $R_2$ ,  $T_2$ . Compute the baseline b. [3 marks]

[.....]

10. Consider point  $M_1$  in camera 1 situated at the horizontal distance  $x_1$  from the camera 1 optical center.  $M_1$  is the projection of world point M into camera 1. Compute  $X_1$  horizontal coordinate of point  $M_1$  as a function of  $x_1$ , camera 1 and 2 parameters and  $Z_M$  the shortest distance between point M and  $O_1O_2$ . Show your working. [3 marks]

11. Knowing Z and the stereo system parameters f, and b, infer  $x_2$ . Consider point  $M_1$  in camera 1 situated at the horizontal distance  $x_2$  is the horizontal distance from the camera 1 optical center of point  $M_2$  which is the projection of world point M into camera 2. [3 marks]

### QUESTION/ANSWER SHEET

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12. What is the disparity for point M in the cameta systsem defined in questionX [3 marks]

13. what is the disparity value when point P is at the horizon, respectively on the cameras scanline? [2 marks]



14. Practically, the camera resolution (that is its pixels width p and sensors width  $W_{chip}$ ) will determine the minimum measurable depth  $Z_{min}$ . Give the formula which gives  $Z_{min}$  as a function of the sensors width, b and f. Compute  $Z_{min}$  when the cameras are 5 centimetres apart, the focal length is 25 mm, the number of pixel elements per line is 1000 and the pixel width is 5  $\mu$ m.

[5 marks]

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[2 marks]

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#### Section B:.3 Calibration

15. Explain what is the Radius of Ambiguity and what is it used for.

16. The world reference frame is situated on the cube and follows the clock-wise orientation rule (x-axis horizontal rightwards, y-axis vertical upwards). Patches  $P_1$ ,  $P_2$  and  $P_3$  with respective centre at coordinates [100, 100, 0], [104, 100, 0], [100, 104, 0] are circular targets on the plane used to calibrate a camera. After calibration, the rotation matrix R linking the camera optical centre to the world reference frame is equal to [1, 0, 0; 0, -1, 0; 0, 0, 1], the translation vector T linking the WRF centre to the camera optical centre is given by  $T = [0, 0, -1000]^T$  where  $v^T$  is the transpose of vector v. The focal length f is calculated equal to 5mm and the camera sensor specifications are: Width 4.800 mm (640 elements)

Height 3.600 mm (480 elements)

A distortion-free lens is assumed. After some processing steps on the image of the calibration plane acquired for calibration purpose, the target  $P_1$  is found to have its centre at position (389,308.333) in the **image**.

Draw the different reference frames as well as the patch centres and image point respecting the usual convention as well as the above-mentioned requirements. [3 marks]

17. Compute the corresponding Radius of Ambiguity using the L<sub>2</sub> Euclidean distance as a distance measure. [5 marks]

[2 marks]

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18. in your opinion, is the calibration satisfactory?

19. Assume a radial distortion effect with  $\kappa_1 = -0.00066 \ mm^{-2}$  and Tsai formulation between distorded and undistorded coordinates:  $r_u = r_d (1 + \kappa_1 r^2)$ Compute the new radius of ambiguity. Comments? [5 marks]

## Section C: Epipolar Geometry and Stereo Matching: 50 marks

20. Let the baseline of a two-camera system coincide with the X-axis of the world XYZ-coordinates. How are both the cameras placed one with respect to another if the epipole in the left image coincides with the principal point (trace of the optical axis) and the epipole in the right image is sitting infinitely far along the X-axis and has zero y-coordinate? [4 marks]

21. How are two cameras placed one with respect to another if epipoles in both images are sitting infinitely far along the Y-axis of the world co-ordinate frame and have the same x-coordinate? [4 marks]

22. Given a camera with the projection matrix  $P_1 = \begin{bmatrix} 0.25 & 0 & 0 & -4 \\ 0 & 0.5 & 0 & -2 \\ 0 & 0 & 0.25 & -1 \end{bmatrix}$ , determine the optical centre of this camera? [6 marks]

23. Given the same camera as in Question 22 above, and the second camera with the projection matrix

 $\begin{bmatrix} 0.5 & 0 & 0 & 4 \\ 0 & 0.25 & 0 & 2 \\ 0 & 0 & 0.5 & 1 \end{bmatrix}$ , determine the point  $\widetilde{\mathbf{D}}_1 = \begin{bmatrix} \mathbf{D}_1 \\ 0 \end{bmatrix}$  at the infinity of the projection  $P_2 =$ 

ray, which projects the 3D point with homogeneous coordinates  $[1, 1, 1, 1]^T$  to the image plane of the first camera, and project  $\widetilde{\mathbf{D}}_1$  to the image plane of the second camera. [6 marks]

- 24. What relationship does exist between the fundamental matrix  $\mathbf{F} = [F_{i,j}]_{i,j=1}^3$  of a pair of cameras and the homogeneous coordinates  $\widetilde{p}_1$  and  $\widetilde{p}_2$  of corresponding points with the Cartesian coordinates  $p_1$  and  $p_2$  in the left and right images, respectively, of a stereo pair captured by the cameras. [5 marks]
- 25. In terms of the relationship in Question 24, specify the epipolar line  $\mathbf{a}^{\mathsf{T}} \widetilde{\mathbf{p}}_1 = 0$  in the left image that corresponds to the point with Cartesian coordinates  $\mathbf{p}_2 = (x_2, y_2)$  in the right image. [4 marks]
- 26. In which point(s) do all the epipolar lines of the right and left image of a stereo pair intersect? [3 marks]

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- 27. Describe, in brief, main reasons why stereo matching that searches for corresponding areas in a stereo pair of images is an ill-posed, in the math sense, problem. [4 marks]
- 28. 3D stereo reconstruction of human heads / faces typically uses stereo pairs captured with cameras having a vertically oriented baseline. Explain in brief why such pairs are more appropriate than the pairs with the conventional horizontal baseline. [4 marks]
- 29. Describe in brief which differences between the corresponding image signals are taken into account in the the correlation based matching.

Hint: Consider math models of signals and noise that lead to the matching score.

[6 marks]

30. Describe in brief which problem does the dynamic programming stereo (DPS) solve. [6 marks] *Hint*: Consider simplifications of a 3D surface model and the choice of the matching score leading to DPS.

## Section D: Patrice: PCA: 25 marks

31. the database A contains ten 2D points:

$$\begin{array}{c} x_1 \begin{pmatrix} 3\\3 \end{pmatrix}, x_2 \begin{pmatrix} 1\\1 \end{pmatrix}, x_3 \begin{pmatrix} 2\\3 \end{pmatrix}, x_4 \begin{pmatrix} 2\\1 \end{pmatrix}, x_5 \begin{pmatrix} 6\\5 \end{pmatrix}, x_6 \begin{pmatrix} 7\\6 \end{pmatrix}, x_7 \begin{pmatrix} 5\\7 \end{pmatrix}, x_8 \begin{pmatrix} 7\\7 \end{pmatrix}, \\ x_9 \begin{pmatrix} 8\\9 \end{pmatrix} \text{ and } x_{10} \begin{pmatrix} 9\\8 \end{pmatrix} \end{array}$$

Points  $x_1$ ,  $x_2$ ,  $x_3$  and  $x_4$  belong to class 1,  $x_5$ ,  $x_6$ ,  $x_7$  belong to class 2,  $x_8$ ,  $x_9$  and  $x_10$  belong to class 3.

#### Section D:.1 PCA

(a) Compute the covariance matrix of the centred database given by:  $C = \sum_{i=1}^{i=10} y_i y_i^T$ 

[5 marks]

[3 marks]

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(b) Compute the eigenvalues  $(\lambda_1, \lambda_2)$  of the matrix C.

(c) Find the eigenvectors  $e_1, e_2$  associated to the eigenvalues  $\lambda_1, \lambda_2$ .

[2 marks]

(d) Find the principal components of the database vectors along the direction of the largest variance. [2 marks]

(e) Express each vector of the database  $x_i$  as a weighted linear combination of eigenvectors  $e_1$  and  $e_2$ . [3 marks]

Compute the Euclidean distance between points  $x_6$  and  $x_8$  ( $d_{68}$ ),  $x_5$  and  $x_7$  ( $d_{57}$ ),  $x_8$  and  $x_9$  ( $d_{89}$ ). Compute the same distances using the projected coordinates in the direction of the largest variance. Any comments? [5 marks]



## Section D:.2 LDA

- 32. Use the same database as in question 31.
  - (a) Compute the between-class scatter matrix  $S_B$  and the within-class scatter matrix  $S_W$  for the database A. [7 marks]

(b) Find the direction (described by the vector e) which maximises the distance between the projected mean values of the classes of the database A while keeping the within class variances low. In other terms, do the LDA ! [6 marks]

- (d) Compare the distances obtained in question ?? with their values when the database points are projected along the direction obtained via LDA analysis. Comments? [3 marks] CONTINUED
- (c) Draw the database set and the directions of projections computed via PCA and LDA. [3 marks]

- 33. Compute for each class 1,2 and 3 the mean and standard deviation before and after projection on the main PCA and LDA axis. What do you think of the following two assertions:
  - (a) PCA maximises the variance of the overall dataset
  - (b) LDA maximises the between-class variance while minimizing the within-class variance [6 marks]

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