

Q2. Given :

$e$  is a unit vector which forms a basis for a vector space such that projecting  $x_i$ 's on this space gives a projection of them that is their best approximation.

It turns out that  $e$  is an eigen vector corresponding to largest eigen value  $\lambda_1$  of covariance matrix  $C$  of vectors  $x_i$ , by maximizing  $e^T C e$ .

To prove :

$f$  which is a unit vector  $\perp$  to  $e$  & forms another basis vector of ~~sub~~<sup>vector</sup> space onto which  $x_i$  are projected for which  $f^T C f$  is maximized, is the eigen vector of  $C$  with second largest eigen value assuming that all non-zero eigen values of  $C$  are distinct &  $\text{rank}(C) > 2$ .

Proof :

To maximize  $f^T C f$  with below two conditions

(i)  $f^T f = 1$

(ii)  $f^T e = 0$

we use method of Lagrange multipliers



$$J(f) = f^T C f - \lambda (f^T f - 1) + s (f^T e)$$

Taking derivative of  $J(f)$  w.r.t  $f$  and setting it zero

$$2 C f - \lambda 2 f - s e = 0 \rightarrow \textcircled{1}$$

Finding  $\lambda$  &  $s$

We know

$$C e = d_1 e$$

$$e^T C^T = d_1 e^T$$

$$e^T C^T f = d_1 e^T f$$

transpose on both sides

postmultiply by  $f$

$$e^T C^T f = 0 \rightarrow \textcircled{2}$$

$$e^T f = 0$$

Pre multiplying by  $e^T$  ~~post multiplying by~~ to

$$2 e^T C f - \lambda 2 e^T f - s e^T e = 0$$

$$0 - 0 - s = 0$$

from  $\textcircled{2}$  &  $e^T e = 1$  &  $e^T f = 0$

$$\therefore \boxed{s = 0}$$

Substituting 's' in eq<sup>n</sup> (1) = (1) v

$$2CF = \lambda 2F \Rightarrow CF = \lambda F$$

$$\therefore CF = \lambda F$$

so  $\lambda$  is an eigen value of C having 'F' as eigen vector.

$$F^T C F = \lambda F^T F = \lambda$$

but we have to maximize  $F^T C F$ ; so  $\lambda$  must be second largest eigen value as the first largest i.e.  $\lambda_1$  corresponds to eigen vector 'e'.

Hence F ~~corres~~ is an eigen vector of C corresponding to second largest eigen value.