

6.819 PSET 5

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### 1. Wiener Filter In Frequency Domain

$$Y = H \star X + N$$

$$P_{XX}[u, v] = |X_F[u, v]|^2, P_{HH}[u, v] = |H_F[u, v]|^2$$

$$\begin{aligned}\epsilon^2 &= E(|\hat{X}_F[u, v] - X_F[u, v]|^2) = \sum_{u, v} |\hat{X}_F[u, v] - X_F[u, v]|^2 \\ &= \sum_{u, v} |X_F[u, v] - G.Y|^2 \\ &= \sum_{u, v} |X_F - G.Y|^2\end{aligned}$$

, but  $Y = HX_F + N$

$$\begin{aligned}&= \sum_{u, v} |X_F - G.(HX_F + N)|^2 \\ &= \sum_{u, v} [X_F(1 - GH) \mp GN]^2 \\ &= \sum_{u, v} [X_F(1 - GH) - GN]^2 \\ &= \sum_{u, v} [X(1 - GH) - GN][X^*(1 - GH)^* - G^*N^*] \\ &= \sum_{u, v} [XX^*(1 - GH)(1 - GH)^* - X(1 - GH)G^*N^* - GNX^*(1 - GH)^* + GNN^*G^*] \\ &= \sum_{u, v} [X_F[u, v]^2 - X_F[u, v]^2GH - X_F[u, v]^2G^*H^* + X_F[u, v]^2H_{XX}^*GG^* + GNN^*G^*] \\ \text{but } P_{XX}[u, v] &= |X_F[u, v]|^2 \text{ and } P_{HH}[u, v] = |H_F[u, v]|^2 \\ &= \sum_{u, v} [P_{XX} - P_{XX}GH - P_{XX}G^*H^* + P_{XX}H_{XX}^*GG^* + GNN^*G^*]\end{aligned}$$

$$\begin{aligned}
&= \sum_{u,v} [P_{XX} - P_{XX}GH - P_{XX}G^*H^* + P_{XX}H_{XX}G]^2 \\
&= \sum_{u,v} [P_{XX} - P_{XX}GH - P_{XX}G^*H^* + P_{XX}H_{XX}|G|^2 + |G|^2\sigma^2]
\end{aligned}$$

but  $|G|^2 = G_R^2 + G_{im}^2$

Hence ,

$$\begin{aligned}
\epsilon^2 = \sum_{u,v} [P_{XX} - P_{GG}(G_R + jG_{im})(H_R + H_{im}) - P_{XX}G^*(H_R - jH_{im})^* + P_{XX}H_{XX}(G_R^2 + G_{im}^2) \\
+ G^2(G_R^2 + G_{im}^2)]
\end{aligned}$$

$$\frac{\partial \epsilon^2}{\partial G_R} = -P_{GG}H - P_{XX}H^* + P_{XX}H_{XX} - 2GR + 2\sigma^2 G_R^2$$

$$G_R = \frac{H_F^{real} P_{XX}}{P_{XX} P_{HH} + \sigma^2}$$

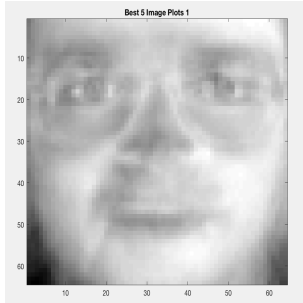
$$G_{im} = \frac{H_F^{im} P_{XX}}{P_{XX} P_{HH} + |N_F[u,v]|^2}$$

$$G_F^{Real}[u,v] = \frac{H_F^{real} P_{XX}}{P_{XX} P_{HH} + |N_F[u,v]|^2}$$

$$G_F^{Complex}[u,v] = \frac{H_F^{im} P_{XX}}{P_{XX} P_{HH} + |N_F[u,v]|^2}$$

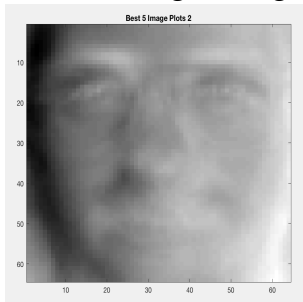
## 2. EigenFaces

First Image using 1st eigenvector



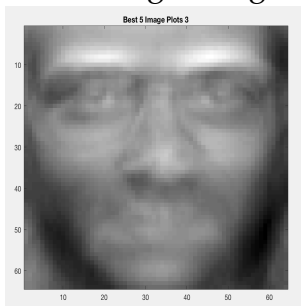
First Image

Second Image using second eigenvector



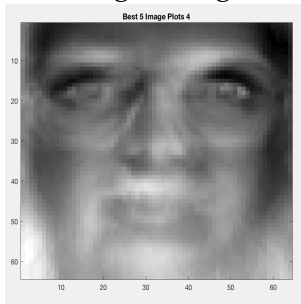
Second Image

Third Image using third eigenvector



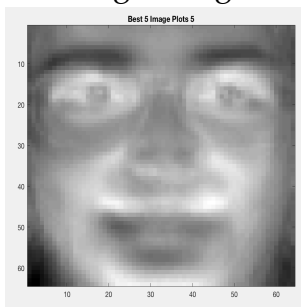
Third Image

4th Image using 4th eigenvector



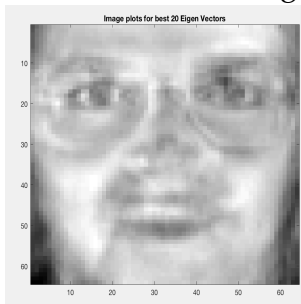
4th Image

5th Image using 5th eigenvector



5th Image

Reconstruction Image using best 20 eigenvectors



Reconstruction Image

***Choosing Best 5 Images***

*PCA Reconstruction = PC Scores.EigenVectors<sup>T</sup> + Mean*

From this equation , it can be seen that the quality of the reconstruction image is directly proportional to the quality of the eigen vectors , hence the higher eigen vector values will produce better images , so I chose the *k* largest eigenvector values as the basis.