

Suppose  $\mathbb{X} = U\Lambda V^\top$ . Then a plug-in PCR-based estimate of  $\beta$  is  $\tilde{\beta}_d = V_d\Lambda_d^{-1}U_d^\top Y$ .

We can make a plug-in estimate (using the notation from Ding McDonald)  $\hat{\beta}_d = U_d(F)\Lambda_d(F)^{-1}U_d(F)^\top \mathbb{X}^\top Y$ . Also, write  $U = [U_d, U_{p-d}]$  to be the decomposition of  $U$  into the first  $d$  columns and last  $p-d$  columns and write  $\tilde{U}_d$  and  $\tilde{U}_{p-d}$  to indicate padding with zeros to give the same dimension as  $U$ . Now,  $U_d(F) \approx V_d$ ,  $\Lambda_d(F)^{-1} \approx \Lambda^{-2}$ , and  $U_d(F)^\top V \approx [I_d \ 0]$ . So, I'll proceed as usual to distill this expression down to these parts<sup>1</sup>

$$\|\hat{\beta}_d - \tilde{\beta}_d\|_2^2 = \|U_d(F)\Lambda_d(F)^{-1}U_d(F)^\top \mathbb{X}^\top Y - V_d\Lambda_d^{-1}U_d^\top Y\|_2^2 \quad (1)$$

$$= \|U_d(F)\Lambda_d(F)^{-1}U_d(F)^\top (V\Lambda[U_d, U_{p-d}]^\top)Y - V_d\Lambda_d^{-1}U_d^\top Y\|_2^2 \quad (2)$$

$$= \|U_d(F)\Lambda_d(F)^{-1}U_d(F)^\top V\Lambda(\tilde{U}_d^\top Y + \tilde{U}_{p-d}^\top Y) - V_d\Lambda_d^{-1}U_d^\top Y\|_2^2 \quad (3)$$

$$\leq \|U_d(F)\Lambda_d(F)^{-1}U_d(F)^\top V\Lambda U_d^\top Y - V_d\Lambda_d^{-1}U_d^\top Y\|_2^2 + \|U_d(F)\Lambda_d(F)^{-1}U_d(F)^\top V\Lambda \tilde{U}_{p-d}^\top Y\|_2^2 \quad (4)$$

$$\leq \|U_d(F)\Lambda_d(F)^{-1}U_d(F)^\top V_d\Lambda_d - V_d\Lambda_d^{-1}U_d^\top Y\|_2^2 \|U_d^\top Y\|_2^2 + \|U_d(F)\Lambda_d(F)^{-1}U_d(F)^\top V\Lambda \tilde{U}_{p-d}^\top Y\|_2^2 \quad (5)$$

$$= \|U_d(F)\Lambda_d(F)^{-1}U_d(F)^\top V_d\Lambda_d - V_d\Lambda_d^{-1}U_d^\top Y\|_2^2 M_d + R_d \quad (6)$$

$$= \|U_d(F)\Lambda_d(F)^{-1}U_d(F)^\top V_d\Lambda_d - (U_d(F)\Lambda_d(F)^{-1}\Lambda_d + U_d(F)\Lambda_d(F)^{-1}\Lambda_d) - V_d\Lambda_d^{-1}U_d^\top Y\|_2^2 M_d + R_d \quad (7)$$

$$\leq M_d \left( \|U_d(F)\Lambda_d(F)^{-1}\|_2^2 \|U_d(F)^\top V_d - I\|_2^2 \|\Lambda_d\|_2^2 - \Lambda_d + \|U_d(F)\Lambda_d(F)^{-1}\Lambda_d - V_d\Lambda_d^{-1}U_d^\top Y\|_2^2 \right) + R_d \quad (8)$$

$$\text{and so on..} \quad (9)$$

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<sup>1</sup> Needing repeated constant 2 for  $\|a+b\|_2^2 \leq 2(\|a\|_2^2 + \|b\|_2^2)$