# Linear Algebra Exercises

#### Rayhan Momin

#### August 2, 2017

### Exercise 1

Let x be a given  $n \times 1$  vector and consider the problem

$$v(x) = \max_{y,u} \left\{ -y'Py - u'Qu \right\}$$

subject to the linear constraint

$$y = Ax + Bu$$

Here:

- P is an  $n \times n$  matrix and Q is an  $m \times m$  matrix
- A is an  $n \times n$  matrix and B is an  $n \times m$  matrix
- $\bullet$  both P and Q are symmetric and positive semidefinite

One way to solve this problem is to form the Lagrangian

$$\mathcal{L} = -y'Py - u'Qu + \lambda' \left[ Ax + Bu - y \right]$$

where  $\lambda$  is an  $n \times 1$  vector of Lagrange multipliers Show that these conditions imply that

- 1.  $\lambda = -2Py$
- 2. The optimizing choice of u satisfies  $u = -(Q + B'PB)^{-1}B'PAx$
- 3. The function v satisfies  $v(x) = -x'\tilde{P}x$  where  $\tilde{P} = A'PA A'PB(Q + B'PB)^{-1}B'PA$

## My Solution to Exercise 1

1.

$$\frac{\partial \mathcal{L}}{\partial y} = \frac{\partial (-y'Py)}{\partial y} - \frac{\partial \lambda' y}{\partial y}$$
 = 0 (1)

$$= -(P + P')y - \lambda \qquad = 0 \tag{2}$$

$$= -2Py - \lambda \qquad \qquad = 0 \tag{3}$$

$$\lambda = -2Py \tag{4}$$

**2**.

$$\frac{\partial \mathcal{L}}{\partial u} = -\frac{\partial (u'Qu)}{\partial u} + \frac{\lambda'Bu}{\partial u}$$
 = 0 (1)

$$= -(Q + Q')u + (\lambda'B)' \tag{2}$$

$$= -2Qu + B'\lambda \tag{3}$$

Recall  $\lambda = -2Py$ 

$$Qu = -B'Py (4)$$

(5)

Recall y = Ax + Bu

$$= -B'P(Ax + Bu) \tag{6}$$

$$= -B'PAx - B'PBu \tag{7}$$

$$Qu + B'PBu = -B'PAx (8)$$

$$(Q + B'PB)u = -B'PAx (9)$$

$$u = -(Q + B'PB)^{-1}B'PAx (10)$$

**3.** Idea is to substitute in u and y into function v

$$v(x) = -y'Py - u'Qu \tag{1}$$

$$= -(Ax + Bu)'P(Ax + Bu) - u'Qu$$
(2)

Let u = -Sx

$$= -(Ax - BSx)'P(Ax - BSx) - (Sx)'QSx$$
(3)

$$= -\left[ ((Ax)' - (BSx)')P(Ax - BSx) + (x'S'QSx) \right] \tag{4}$$

$$= -[(x'A' - x'S'B')(PAx - PBSx) + (x'S'QSx)]$$
(5)

$$= -\left[x'A'PAx - x'S'B'PAx - x'A'PBSx + x'S'B'PBSx + x'S'QSx\right] \tag{6}$$

Note that S'B'PA and A'PBS are symmetric  $n \times n$  matrices. B'PB - Q is a symmetric  $m \times m$  matrix.

$$= -x' [A'PA - S'B'PA - (A'PBS)' + S'(B'PB + Q)'S] x$$
(7)

$$= -x' [A'PA - 2S'B'PA + S'(Q + B'PB)S] x$$
(8)

(9)

Substitute back in  $S = (Q + B'PB)^{-1}B'PA$ 

$$= -x' \left[ A'PA - 2(B'PA)'(Q + B'PB)^{-1}(B'PA) + (B'PA)'(Q + B'PB)^{-1}B'PA \right] x \tag{10}$$

$$= -x' \underbrace{\left[ A'PA - A'PB(Q + B'PB)^{-1}B'PA \right]}_{\tilde{P}} x$$

$$= -x'\tilde{P}x$$

$$(11)$$

$$= -x'\tilde{P}x\tag{12}$$