

# IS622 Week 12 Exercises

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**Exercise 9.4.2:** If we wish to start out, as in Fig. 9.10, with all U and V entries set to the same value, what value minimizes the RMSE for the matrix M of our running example?

Each UV element =  $x^2 + x^2 = 2x^2$

M - UV =  
[[ $(5 - (2x^2))^2 + (2 - 2x^2)^2 + (4 - 2x^2)^2 + \dots$ ]]

Set derivative to zero:

$-8x[(5 - 2x^2) + (2 - 2x^2) + (4 - 2x^2) + \dots] = 0$

x cannot be zero so:

$[(5 - 2x^2) + (2 - 2x^2) + (4 - 2x^2) + \dots] = 0$

$75 - 46x^2 = 0$

$x = \sqrt{75/46}$

= 1.2769

```
x <- 1.2769

U <- matrix(rep(x,10), nrow=5, ncol=2)
V <- matrix(rep(x,10), nrow=2, ncol=5)
UV <- U %*% V

M <- matrix(c(5,2,4,4,3,
              3,1,2,4,1,
              2,NA,3,1,4,
              2,5,4,3,5,
              4,4,5,4,NA), nrow=5)

M <- t(M)
MUV <- M - UV

# Sum of squared error
print(sum((MUV)^2, na.rm=TRUE))
```

```
## [1] 38.43478
```

---

**Exercise 9.4.3:** Starting with the U and V matrices in Fig. 9.16, do the following in order:

```
U <- matrix(c(2.6,1,
              1.178466, 1,
              1,1,
              1,1,
              1,1), nrow=5, ncol=2)

V <- matrix(c(17.4/10.76, 1,1,1,1,
```

```
1,1,1,1,1), nrow=2, ncol=5)
```

```
UV <- U %*% V
```

```
# Fig. 9.16 starting point
print(U)
```

```
##          [,1] [,2]
## [1,] 2.600000  1
## [2,] 1.000000  1
## [3,] 1.178466  1
## [4,] 1.000000  1
## [5,] 1.000000  1
```

```
print(V)
```

```
##          [,1] [,2] [,3] [,4] [,5]
## [1,] 1.6171  1    1    1    1
## [2,] 1.0000  1    1    1    1
```

```
print(UV)
```

```
##          [,1]      [,2]      [,3]      [,4]      [,5]
## [1,] 5.204461 3.600000 3.600000 3.600000 3.600000
## [2,] 2.617100 2.000000 2.000000 2.000000 2.000000
## [3,] 2.905698 2.178466 2.178466 2.178466 2.178466
## [4,] 2.617100 2.000000 2.000000 2.000000 2.000000
## [5,] 2.617100 2.000000 2.000000 2.000000 2.000000
```

(a) **Reconsider the value of  $u_{11}$ . Find its new best value, given the changes that have been made so far.** From the earlier steps on page 329, we can see the pattern for the derivative equation simplifies to:

$$\text{sum}(M[1,]) - \text{sum}(V[2,]) - \text{sum}(V[1,])x = 0$$

$$13 - 5.617x = 0$$

$$x = 13/5.617$$

$$x = 2.314361$$

```
# Solve for x
u11 <- (sum(M[1,]) - sum(V[2,])) / sum(V[1,])
print(u11)
```

```
## [1] 2.314361
```

```
# Updated U
U2 <- U
U2[1,1] <- u11
print(U2)
```

```
##           [,1] [,2]
## [1,] 2.314361  1
## [2,] 1.000000  1
## [3,] 1.178466  1
## [4,] 1.000000  1
## [5,] 1.000000  1
```

```
# Updated UV
U2V <- U2 %*% V
print(U2V)
```

```
##           [,1]      [,2]      [,3]      [,4]      [,5]
## [1,] 4.742555 3.314361 3.314361 3.314361 3.314361
## [2,] 2.617100 2.000000 2.000000 2.000000 2.000000
## [3,] 2.905698 2.178466 2.178466 2.178466 2.178466
## [4,] 2.617100 2.000000 2.000000 2.000000 2.000000
## [5,] 2.617100 2.000000 2.000000 2.000000 2.000000
```

```
# Updated SSE
MU2V <- M - U2V
print(sum((MU2V)^2, na.rm=TRUE))
```

```
## [1] 57.47466
```

---

**(b) Then choose the best value for  $u_{52}$ .** Similar to equation above, but switch  $v[1,]$  and  $v[2,]$  because dealing with  $U_{i2}$ :

$\text{sum}(M[5,]) - \text{sum}(V[1,]) - \text{sum}(V[2,])x = 0$   
*Skip  $M[5,5]$  because of NA value*

$12.383 - 4x = 0$   
 $x = 3.095725$

```
# Solve for x
u52 <- (sum(M[5,-5]) - sum(V[1,-5])) / sum(V[2,-5])
print(u52)
```

```
## [1] 3.095725
```

```
# Updated U
U3 <- U2
U3[5,2] <- u52
print(U3)
```

```
##           [,1]      [,2]
## [1,] 2.314361 1.000000
## [2,] 1.000000 1.000000
## [3,] 1.178466 1.000000
## [4,] 1.000000 1.000000
## [5,] 1.000000 3.095725
```

```
# Updated UV
U3V <- U3 %*% V
print(U3V)
```

```
##           [,1]      [,2]      [,3]      [,4]      [,5]
## [1,] 4.742555 3.314361 3.314361 3.314361 3.314361
## [2,] 2.617100 2.000000 2.000000 2.000000 2.000000
## [3,] 2.905698 2.178466 2.178466 2.178466 2.178466
## [4,] 2.617100 2.000000 2.000000 2.000000 2.000000
## [5,] 4.712825 4.095725 4.095725 4.095725 4.095725
```

```
# Updated SSE
MU3V <- M - U3V
print(sum((MU3V)^2, na.rm=TRUE))
```

```
## [1] 39.90641
```

(c) Then choose the best value for **v22**. Same derivative equation, but switch V for U:

$\text{sum}(M[,2]) - \text{sum}(U[,1]) - \text{sum}(U[,2])y = 0$

*Skip  $M[3,2]$  because of NA value*

$6.686 - 6.096y = 0$

$y = 1.096775$

```
# Solve for y
v22 <- (sum(M[-3,2]) - sum(U3[-3,1])) / sum(U3[-3,2])
print(v22)
```

```
## [1] 1.096775
```

```
# Updated V
V2 <- V
V2[2,2] <- v22
print(V2)
```

```
##           [,1]      [,2] [,3] [,4] [,5]
## [1,] 1.6171 1.000000    1    1    1
## [2,] 1.0000 1.096775    1    1    1
```

```
# Updated UV
U3V2 <- U3 %*% V2
print(U3V2)
```

```
##           [,1]      [,2]      [,3]      [,4]      [,5]
## [1,] 4.742555 3.411136 3.314361 3.314361 3.314361
## [2,] 2.617100 2.096775 2.000000 2.000000 2.000000
## [3,] 2.905698 2.275241 2.178466 2.178466 2.178466
## [4,] 2.617100 2.096775 2.000000 2.000000 2.000000
## [5,] 4.712825 4.395314 4.095725 4.095725 4.095725
```

```
# Updated SSE  
MU3V2 <- M - U3V2  
print(sum((MU3V2)^2, na.rm=TRUE))
```

```
## [1] 39.94891
```