

## MVA HW#3 Attachment

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Before doing the questions, let's define the following 4 functions that can greatly help the computation:

```
> multi.mean_and_cov = function(data, na.action=F){
+   setClass('mean_and_cov', representation(mean = 'numeric', cov = 'matrix'))
+   returnValue(new('mean_and_cov', mean = apply(data, 2, mean), cov = cov(data)))
+ }

> test.TSquare = function(mu=rep(0,ncol(data)), data){
+   n = nrow(data)
+   p = ncol(data)
+   mean = apply(data, 2, mean)
+   diff = mean - mu
+   T.sq = n * t(diff) %*% solve(cov(data)) %*% (diff)
+   F = (n - p) / ((n - 1) * p) * T.sq
+   cat('T-square Test\n-----\n', 'T-square value: ', T.sq,
+       '\nP-value: ', 1 - pf(F, p, n - p), '\n', sep = '')
+ }
```

```
> TF.convert=function(T.sq = 0, F=0, n, p, T_to_F = TRUE){
+   if(T_to_F){
+     F = (n - p) / ((n - 1) * p) * T.sq
+     df1 = p
+     df2 = n - p
+     r = data.frame(F, df1, df2)
+     returnValue(r)
+   } else {
+     T.sq = F * (n - 1) * p / (n - p)
+     df1 = p
+     df2 = n - 1
+     returnValue(data.frame(T.sq, df1, df2))
+   }
+ }
```

# this function computes the confident region and simultaneous and Bonferroni confident interval at the specified confident level

```
> T.ellipse = function(data, confident.level=0.95){
+   n = nrow(data)
+   p = ncol(data)
+   cat('\n\nT.sq confidence ellipse')
+   center = colMeans(data)
+   cat('\ncenters\n')
+   print(center)
+   T.critical = TF.convert(F=qf(confident.level, p, (n-p)),
+                           n=n, p=p, T_to_F = FALSE)
+   cat('\nThe Critical T value\n')
+   print(T.critical)
+   S = cov(data)
+   cat('\ncovariance matrix\n')
+   print(S)
+   ei = eigen(S)
+   cat('\nwith eigenvalue and vectors\n')
+   print(ei)
+   length = 2 * sqrt(ei$values) * sqrt(1/nrow(data) * T.critical^2)
+   cat('\nlength\n')
+   print(length)
+   axes = NULL
+   for(i in 1:length(length)){
+     axes = cbind(axes, length[i]/2 * ei$vectors[,i])
+   }
+   cat('\naxes\n')
+   print(axes)
+   distance.simontaneous = sqrt(T.critical^2 * S/nrow(data)) * sqrt(diag(S))
+   CI.simontaneous = rbind(center - distance.simontaneous, center + distance.simontaneous)
+   rownames(CI.simontaneous) = c('low', 'high')
+   cat('\nsimontaneous confident interval:\n')
+   print(t(CI.simontaneous))
+   T.Bonferroni = (qt(df=nrow(data)-1, p=(1-confident.level)/(2*ncol(data)), lower.tail=F))
+   cat('\nt value for Bonferroni: \n')
+   print(t.Bonferroni)
+   distance.Bonferroni = t.Bonferroni * sqrt(diag(S)/nrow(data))
+   CI.Bonferroni = rbind(center - distance.Bonferroni, center + distance.Bonferroni)
+   rownames(CI.Bonferroni) = c('low', 'high')
+   cat('\nBonferroni confident interval:\n')
+   print(t(CI.Bonferroni))
+ }
```

### Problem #5.1

```
> mu = matrix(c(7,11))
> X = matrix(c(2,8,6,8,12,9,9,10), ncol = 2)
> summary = multi.mean_and_cov(X)
> print(summary)
An object of class "mean_and_cov"
Slot "mean":
[1] 6 10

Slot "cov":
      [,1] [,2]
[1,] 8.000000 -3.333333
[2,] -3.333333 2.000000

> test.TSquare(mu=c(7,11), X)
T-square Test
-----
T-square value: 13.63636
P-value: 0.1803279
```

### Problem #5.3

```
> cov.xbar = (nrow(X)-1)/nrow(X) * summary@cov
> cov.mu = cov.xbar + (summary@mean - mu) %*% t(summary@mean - mu)
> T.sq = (nrow(X)-1) * (det(cov.mu)/det(cov.xbar)-1)
> cov.xbar
      [,1] [,2]
[1,] 6.0 -2.5
[2,] -2.5 1.5
> cov.mu
      [,1] [,2]
[1,] 7.0 -1.5
[2,] -1.5 2.5
> T.sq
[1] 13.63636
```

### Problem #5.4

```
> x1 = c(3.7, 5.7, 3.8, 3.2, 3.1, 4.6, 2.4, 7.2, 6.7, 5.4, 3.9, 4.5, 3.5, 4.5, 1.5, 8.5, 4.5, 6.5, 4.1, 5.5)
> x2 = c(48.5, 65.1, 47.2, 53.2, 55.5, 36.1, 24.8, 33.1, 47.4, 54.1, 36.9, 58.8, 27.8, 40.2, 13.5, 56.4, 71.6, 52.8, 44.1, 40.9)
> x3 = c(9.3, 8.0, 10.9, 12.0, 9.7, 7.9, 14.7, 6.8, 5.1, 11.3, 12.7, 12.3, 9.8, 8.4, 10.1, 7.1, 8.2, 10.9, 11.2, 9.4)
> x = cbind(x1, x2, x3)
> T.ellipse(x, 0.9)
```

T.sq confidence ellipse centers

	x1	x2	x3
4.640	45.400	9.965	

The Critical T value

	T.sq	df1	df2
1	8.172573	3	19

covariance matrix

	x1	x2	x3
x1	2.879368	10.0100	-1.809053
x2	10.010000	199.7884	-5.640000
x3	-1.809053	-5.6400	3.627658

with eigenvalue and vectors

eigen() decomposition

	\$values		
[1]	200.462464	4.531591	1.301392

\$vectors

	[,1]	[,2]	[,3]
[1,]	-0.05084144	-0.57370364	0.81748351
[2,]	-0.99828352	0.05302042	-0.02487655
[3,]	0.02907156	0.81734508	0.57541452

length

[1]	18.101348	2.721571	1.458473
-----	-----------	----------	----------

axes

	[,1]	[,2]	[,3]
[1,]	-0.4601493	-0.78068768	0.59613898
[2,]	-9.0351388	0.07214943	-0.01814089
[3,]	0.2631172	1.11223146	0.41961339

simultaneous confident interval:

	low	high
x1	3.555292	5.724708
x2	36.364555	54.435445
x3	8.747476	11.182524

t value for Bonferroni:

```
[1] 2.294392
```

Bonferroni confident interval:

```
      low      high
x1 3.769435 5.510565
x2 38.148336 52.651664
x3 8.987840 10.942160
```

## Problem #5.5

```
> T.ellipse(x)
```

T.sq confidence ellipse  
centers

```
      x1      x2      x3
4.640 45.400 9.965
```

The Critical T value

```
      T.sq df1 df2
1 10.7186    3   19
```

covariance matrix

```
      x1      x2      x3
x1 2.879368 10.0100 -1.809053
x2 10.010000 199.7884 -5.640000
x3 -1.809053 -5.6400 3.627658
```

with eigenvalue and vectors

eigen() decomposition

```
$values
[1] 200.462464 4.531591 1.301392
```

\$vectors

```
      [,1]      [,2]      [,3]
[1,] -0.05084144 -0.57370364 0.81748351
[2,] -0.99828352 0.05302042 -0.02487655
[3,] 0.02907156 0.81734508 0.57541452
```

length

```
[1] 20.730065 3.116804 1.670276
```

axes

```
      [,1]      [,2]      [,3]
[1,] -0.5269732 -0.89406082 0.68271156
[2,] -10.3472410 0.08262713 -0.02077535
[3,] 0.3013276 1.27375209 0.48055055
```

simultaneous confident interval:

```
      low      high
x1 3.397768 5.882232
x2 35.052408 55.747592
x3 8.570664 11.359336
```

t value for Bonferroni:

```
[1] 2.625106
```

Bonferroni confident interval:

```
      low      high
x1 3.643952 5.636048
x2 37.103078 53.696922
x3 8.846992 11.083008
```

## Problem #5.18

```
> x1 = c(468,428,514,547,614,501,421,527,527,620,587,541,56
1,468,614,527,507,580,507,521,574,587,488,488,587,421,481,4
28,640,
+ 574,547,580,494,554,647,507,454,427,521,468,587,50
7,574,507,494,541,362,408,594,501,687,633,647,647,614,633,4
48,408,
+ 441,435,501,507,620,415,554,348,468,507,527,527,43
5,660,733,507,527,428,481,507,527,488,607,561,614,527,474,4
41,607)
> x2 = c(41,39,53,67,61,67,46,50,55,72,63,59,53,62,65,48,3
2,64,59,54,52,64,51,62,56,38,52,40,65,61,64,64,53,51,58,65,
52,57,
+ 66,57,55,61,54,53,41,47,36,28,68,25,75,52,67,65,5
9,65,55,51,36,60,54,42,71,52,69,28,49,54,47,47,50,70,73,45,
62,37,
+ 48,61,66,41,69,59,70,49,41,47,67)
> x3 = c(26,26,21,33,27,29,22,23,19,32,31,19,26,20,28,21,2
7,21,21,23,25,31,27,18,26,16,26,19,25,28,27,28,26,21,23,23,
28,21,
+ 26,14,30,31,31,23,24,25,17,17,23,26,33,31,29,34,2
5,28,24,19,22,20,21,24,36,20,30,18,25,26,31,26,28,25,33,28,
29,19,
+ 23,19,23,28,28,34,23,30,16,26,32)
> x = cbind(x1,x2,x3)
> mu = c(500,50,30)
> multi.mean_and_cov(x)
An object of class "mean_and_cov"
Slot "mean":
      x1      x2      x3
526.58621 54.70115 25.12644

Slot "cov":
      x1      x2      x3
x1 5808.0593 596.84002 222.02967
```

```
x2 596.8400 125.60732 23.35218
x3 222.0297 23.35218 23.11173
```

```
> test.TSquare(mu=mu,X)
```

T-square Test

-----

T-square value: 223.4327

P-value: 0

```
> T.ellipse(X)
```

T.sq confidence ellipse  
centers

```
      x1      x2      x3
526.58621 54.70115 25.12644
```

The Critical T value

```
      T.sq df1 df2
1 8.333483    3   86
```

covariance matrix

```
      x1      x2      x3
x1 5808.0593 596.84002 222.02967
x2 596.8400 125.60732 23.35218
x3 222.0297 23.35218 23.11173
```

with eigenvalue and vectors

eigen() decomposition

```
$values
[1] 5878.58213 63.59827 14.59800
```

\$vectors

```
      [,1]      [,2]      [,3]
[1,] 0.99392352 0.103560215 -0.037300504
[2,] 0.10326884 -0.994606566 -0.009660483
[3,] 0.03809977 -0.005749802 0.999257398
```

length

```
[1] 47.459149 4.936354 2.364996
```

axes

```
      [,1]      [,2]      [,3]
[1,] 23.5853823 0.25560495 -0.04410776
[2,] 2.4505257 -2.45486515 -0.01142350
[3,] 0.9040913 -0.01419153 1.18161969
```

simultaneous confident interval:

```
      low      high
x1 502.99940 550.17302
x2 51.23249 58.16980
x3 23.63855 26.61432
```

t value for Bonferroni:

```
[1] 2.441709
```

Bonferroni confident interval:

```
      low      high
x1 506.63589 546.53652
x2 51.76727 57.63503
x3 23.86794 26.38493
```

## Problem #5.21

```
> x1 = c(1.103,0.842,0.925,0.857,0.795,0.787,0.933,0.799,0.
945,0.921,0.792,0.815,0.755,0.88,0.9,0.764,0.733,0.932,0.85
6,0.89,0.688,0.94,0.493,0.835,0.915)
> x2 = c(1.052,0.859,0.873,0.744,0.809,0.779,0.88,0.851,0.8
76,0.906,0.825,0.751,0.724,0.866,0.838,0.757,0.748,0.898,0.
786,0.95,0.532,0.85,0.616,0.752,0.936)
> x3 = c(2.139,1.873,1.887,1.739,1.734,1.509,1.695,1.74,1.8
11,1.954,1.624,2.204,1.508,1.784,1.902,1.743,1.863,2.028,1.
39,2.187,1.65,2.334,1.037,1.509,1.971)
> x4 = c(2.238,1.741,1.809,1.547,1.715,1.474,1.656,1.777,1.
759,2.009,1.657,1.846,1.458,1.811,1.606,1.794,1.869,2.032,
1.324,2.087,1.378,2.225,1.268,1.422,1.869)
> x5 = c(0.873,0.59,0.767,0.706,0.549,0.782,0.737,0.618,0.8
53,0.823,0.686,0.678,0.662,0.81,0.723,0.586,0.672,0.836,0.5
78,0.758,0.533,0.757,0.546,0.618,0.869)
> x6 = c(0.872,0.744,0.713,0.674,0.654,0.571,0.803,0.682,0.
777,0.765,0.668,0.546,0.595,0.819,0.677,0.541,0.752,0.805,
0.61,0.718,0.482,0.731,0.615,0.664,0.868)
> x = cbind(x1,x2,x3,x4,x5,x6)
> T.ellipse(X)
```

T.sq confidence ellipse

centers

```
      x1      x2      x3      x4      x5      x6
0.84380 0.81832 1.79260 1.73484 0.70440 0.69384
```

The Critical T value

```
      T.sq df1 df2
1 19.91988    6   24
```

covariance matrix

```
      x1      x2      x3      x4      x5      x6
x1 0.013001583 0.010378442 0.02234696 0.02008568 0.009120708 0.007957842
x2 0.010378442 0.011417893 0.01853122 0.02109951 0.008529783 0.008908512
x3 0.02234696 0.01853122 0.08035850 0.06576985 0.016828123 0.012836600
x4 0.02008568 0.02109951 0.06676985 0.06948447 0.017735483 0.016793598
x5 0.009120708 0.008529783 0.01682812 0.01773548 0.011568417 0.008071150
x6 0.007957842 0.00808512 0.01283660 0.01679360 0.008071150 0.010599140
```

with eigenvalue and vectors

eigen() decomposition

```
$values
[1] 0.1635333121 0.0183637399 0.0080694108 0.0033556694 0.0022219234 0.0008859511
```

\$vectors

	[,1]	[,2]	[,3]	[,4]	[,5]	[,6]
[1,]	-0.2177374	0.33726261	0.51708011	0.400776794	-0.2725153	0.58016025
[2,]	-0.2040296	0.43154108	0.03119159	0.425371500	-0.1982959	-0.74223251
[3,]	-0.6729085	-0.50008903	0.43396201	-0.051478287	0.2659833	-0.18810889
[4,]	-0.6325336	0.02442084	-0.69021068	0.009887147	-0.2605705	0.23434869
[5,]	-0.1812878	0.43022767	0.23536179	-0.809715391	-0.2519046	-0.08688367
[6,]	-0.1587212	0.51404763	-0.10745352	0.007089769	0.8272328	0.12104525

length

[1] 0.72194899 0.24192679 0.16037043 0.10341725 0.08415268  
0.05313837

axes

	[,1]	[,2]	[,3]	[,4]	[,5]	[,6]
[1,]	-0.07859764	0.040796431	0.041462181	0.0207236167	-0.011466444	0.015414386
[2,]	-0.07364950	0.052200673	0.002501104	0.0219953750	-0.008343567	-0.019720515
[3,]	-0.24290280	-0.060492467	0.034797338	-0.0026613714	0.011191605	-0.004997900
[4,]	-0.22837851	0.002954028	-0.055344694	0.0005112508	-0.010963851	0.006226454
[5,]	-0.06544029	0.052041799	0.018872536	-0.0418692689	-0.010599222	-0.002308428
[6,]	-0.05729430	0.062180946	-0.008616184	0.0003666022	0.034806928	0.003216074

simultaneous confident interval:

	low	high
x1	0.7420179	0.9455821
x2	0.7229380	0.9137020
x3	1.5395599	2.0456401
x4	1.4995425	1.9701375
x5	0.6083914	0.8004086
x6	0.6019414	0.7857386

t value for Bonferroni:

[1] 2.875094

Bonferroni confident interval:

	low	high
x1	0.7782338	0.9093662
x2	0.7568766	0.8797634
x3	1.6295961	1.9556039
x4	1.5832656	1.8864144
x5	0.6425529	0.7662471
x6	0.6346406	0.7530394