

## STA 431 Quiz 4

1. (5 points) Suppose you estimate the  $m \times 1$  parameter vector  $\theta$  by numerical maximum likelihood, obtaining the vector of MLEs  $\hat{\theta}_n$  and the estimated asymptotic covariance matrix  $\hat{V}_n$ . Give a  $z$  statistic for testing  $H_0 : \mathbf{a}^\top \theta = 0$ , where  $\mathbf{a}$  is an  $m \times 1$  non-zero vector of constants. Start with the asymptotic distribution of  $\mathbf{a}^\top \hat{\theta}_n$ . Your final answer is a formula for  $z$ . Circle the formula.

$$\mathbf{a}^\top \hat{\theta}_n \sim N(\mathbf{a}^\top \theta, \mathbf{a}^\top V_n \mathbf{a}), \text{ so}$$

$$z = \frac{\mathbf{a}^\top \hat{\theta}_n - \mathbf{a}^\top \theta}{\sqrt{\mathbf{a}^\top V_n \mathbf{a}}} \sim N(0, 1), \text{ and the}$$

test statistic for  $H_0 : \mathbf{a}^\top \theta = 0$  is

$$z = \frac{\mathbf{a}^\top \hat{\theta}_n}{\sqrt{\mathbf{a}^\top \hat{V}_n \mathbf{a}}}$$

Final sentence: If a test statistic has a standard normal distribution, it is called a  $z$ -statistic. A  $t$ -statistic is similar but follows a  $t$ -distribution, which is centered at zero but has a wider spread than the standard normal distribution. A  $F$ -statistic is similar but follows an  $F$ -distribution, which is centered at one but has a wider spread than the standard normal distribution.

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2. (2 points) Starting with your answer to Question 1, show that for  $H_0 : \mathbf{a}^\top \boldsymbol{\theta} = h$ , the Wald test statistic  $W_n = z^2$ .

$$W_n = (\mathbf{a}^\top \hat{\boldsymbol{\theta}}_n - 0)^\top (\mathbf{a}^\top \hat{V}_n \mathbf{a})^{-1} (\mathbf{a}^\top \hat{\boldsymbol{\theta}}_n - 0)$$

$$= \frac{(\mathbf{a}^\top \hat{\boldsymbol{\theta}}_n)^2}{\mathbf{a}^\top \hat{V}_n \mathbf{a}}$$

Because all 3  
matrices are  $1 \times 1$

$$= z^2$$

3. (3 points) In Question 3 of this week's assignment, you calculated a 95% confidence interval for the quantity  $2\alpha - \beta$ , where  $\alpha$  and  $\beta$  were the parameters of a beta distribution. Your answer was a set of two numbers, the lower confidence limit and the upper confidence limit. Write the numbers in the space below.

$$(-0.395, 0.166)$$

On your printout, circle the numbers and write "Question 3" beside them. *Do not answer this question if you do not have a printout.*

**Please attach your printout to the quiz paper. The printout should show your complete R input and output.** Make sure your name and student number appear on the printout.

## R work for Question 3

```
> # Q3: Numerical MLE for beta
>
> rm(list=ls())
> bdata = scan("https://www.utstat.toronto.edu/brunner/openSEM/data/beta24.data.txt")
Read 500 items
> # Beta minus log likelihood
> bml1 = function(ab,xx)
+   {
+     nn = length(xx); a = ab[1]; b = ab[2]
+     value = nn*(lgamma(a)+lgamma(b) - lgamma(a+b)) -
+             (a-1)*sum(log(xx)) - (b-1)*sum(log((1-xx)))
+     return(value)
+   } # End of function bml1
>
> bsearch = optim(par=c(1,1), fn = bml1,
+                  method = "L-BFGS-B", lower = c(0,0), hessian=TRUE, xx=bdata)
> bsearch

$par
[1] 1.956054 4.026869

$value
[1] -184.783

$counts
function gradient
      12          12

$convergence
[1] 0

$message
[1] "CONVERGENCE: REL_REDUCTION_OF_F <= FACTR*EPSMCH"

$hessian
[,1]      [,2]
[1,] 240.64932 -90.94232
[2,] -90.94232  49.90191
```

```

> # (a) MLE
> thetahat = bsearch$par
> thetahat # (alphahat, betahat)
[1] 1.956054 4.026869

> # (b) Likelihood ratio test of H0: beta = 2 alpha
> # Search restricted parameter space
> bml10 = function(beta,datta) bml1(c(beta/2,beta), xx=datta)
> bsearch0 = optim(par=1, fn = bml10, method = "L-BFGS-B", lower = 0, datta=bdata)
> bsearch0

$par
[1] 3.943671

$value
[1] -184.458

$counts
function gradient
      9         9

$convergence
[1] 0

$message
[1] "CONVERGENCE: REL_REDUCTION_OF_F <= FACTR*EPSMCH"

>
> # (c) Test H0: mu = 2.1. Reject if |z| > 1.96
> z = (muhat-2.1)/se_muhat; z
[1] -2.844819

> Gsq = 2 * (bsearch0$value - bsearch$value)
> dfree=1
> pval = 1-pchisq(Gsq,dfree)
> c(Gsq,dfree,pval)
[1] 0.6498473 1.0000000 0.4201673

>
> # (c) Wald test
> source("https://www.utstat.toronto.edu/brunner/openSEM/fun/Wtest.txt")
> L = rbind(c(2,-1))
> Vhat = solve(bsearch$hessian)
> Wtest(L,Tn=thetahat,Vn=Vhat)
      W      df   p-value
0.6436909 1.0000000 0.4223774

>
> # (d) CI for 2 alpha - beta
> a = rbind(2,-1)
> se = as.numeric(sqrt(t(a) %*% Vhat %*% a)); se
[1] 0.1430393

> est = as.numeric(t(a) %*% thetahat); est
[1] -0.114761

> # (est/se)^2 # Wald stat
> lower95 = est - 1.96*se; upper95 = est + 1.96*se
> c(lower95, upper95)
[1] -0.3951180  0.1655961

```

Question 3