

Solutions for lab session 1

- **Exercises**

A

1. Model : Y is a random variable (r.v.), the number of events, $Y \sim \text{Bin}(n, \pi)$, events are independent with the same success probability for each individual.

Probability function:

$$\Pr(Y=k) = \binom{n}{k} \pi^k (1-\pi)^{n-k}, k = 0, 1, \dots, n.$$

Likelihood function

$$L(\pi|k) = \binom{n}{k} \pi^k (1-\pi)^{n-k}, 0 < \pi < 1.$$

Log-Likelihood function

$$l(\pi|k) = \ln \left\{ \binom{n}{k} \right\} + k \ln \left(\frac{\pi}{1-\pi} \right) + n \ln(1-\pi), 0 < \pi < 1$$

2. Model: X is a r.v., systolic blood pressure (mmHg), $X \sim N(\mu, 5)$.

Probability density function:

$$f(x|\mu) = \frac{1}{\sqrt{2\pi \times 5}} \exp \left\{ -\frac{(x-\mu)^2}{2 \times 5} \right\}, -\infty < x < \infty.$$

Likelihood function

$$L(\mu|x) = \frac{1}{\sqrt{2\pi \times 5}} \exp \left\{ -\frac{(x-\mu)^2}{2 \times 5} \right\}, -\infty < \mu < \infty.$$

Log-Likelihood function

$$l(\mu|x) = -\frac{1}{2} \ln(10\pi) - \frac{(x-\mu)^2}{10}$$

3. Model: Y_i , ($i=1, \dots, n$) are i.i.d. r.v.'s, cholesterol (mmol/l)
 $Y_i \sim N(\mu, 4)$.

Probability density function:

$$f(y_1, y_2, \dots, y_n | \mu) = f(y | \mu) = \prod_{i=1}^n f(y_i | \mu) = \prod_{i=1}^n \frac{1}{\sqrt{2\pi \times 4}} \exp \left\{ -\frac{(y_i - \mu)^2}{2 \times 4} \right\}$$

$$= \left(\frac{1}{\sqrt{2\pi \times 4}} \right)^n \exp \left\{ -\frac{\sum_{i=1}^n (y_i - \mu)^2}{2 \times 4} \right\}, -\infty < y_i < \infty.$$

Likelihood function:

$$L(\mu | y) = \left(\frac{1}{\sqrt{2\pi \times 4}} \right)^n \exp \left\{ -\frac{\sum_{i=1}^n (y_i - \mu)^2}{2 \times 4} \right\}, -\infty < \mu < \infty.$$

Log-likelihood function:

$$l(\mu | y) = -\frac{n}{2} \ln(2\pi \times 4) - \frac{1}{2 \times 4} \sum_{i=1}^n (y_i - \mu)^2, -\infty < \mu < \infty.$$

B.

1. $k=2, n=6$

Log-likelihood function:

$$l(\pi | k=2) = \text{constant} + 2 \ln(\pi) + 4 \ln(1-\pi)$$

$$l'(\pi) = \frac{2}{\pi} - \frac{4}{1-\pi},$$

$$l'(\hat{\pi}) = 0 \Rightarrow \hat{\pi} = \frac{1}{3}$$

2. $n = 10$

Log-likelihood function:

$$l(\mu | y) = \text{constant} - \frac{1}{8} \sum_{i=1}^{10} (y_i - \mu)^2$$

$$l'(\mu) = \frac{1}{4} \sum_{i=1}^{10} (y_i - \mu),$$

$$l'(\hat{\mu}) = 0 \Leftrightarrow \frac{1}{4} \sum_{i=1}^{10} (y_i - \hat{\mu}) = 0 \Leftrightarrow \sum_{i=1}^{10} y_i - 10\hat{\mu} = 0 \Leftrightarrow \hat{\mu} = \sum_{i=1}^{10} y_i / 10 = 6.15$$

A Stata program to sketch the likelihood:

```

drop _all
set obs 451

*Enter data
gen y=6 if _n==1
replace y=6.2 if _n==2
replace y=6.8 if _n==3
replace y=5.3 if _n==4
replace y=5.9 if _n==5
replace y=6.1 if _n==6
replace y=6 if _n==7
replace y=7 if _n==8
replace y=5.9 if _n==9
replace y=6.3 if _n==10

*Variance = 4
local s2=4

*Create sequence of possible m values (-6 to 12 ;step 0.05)
gen m=-6+(_n-1)/20

gen y_mi_sq=.
gen loglike=.

*For all possible m values calculate the log-likelihood

local i=1
while(`i'<=451){
    replace y_mi_sq=(y-m[`i'])^2
    egen Sy_mi_sq=sum( y_mi_sq)
    replace loglike= -(1/(2*s2))*Sy_mi_sq[1] if _n==`i'
    drop Sy_mi_sq
    local i=`i'+1
}

*Store maximum likelihood in `y' and MLE in `x'
gsort -loglike
local y=loglike[1]
local x=m[1]

sort m
*Graph the log-likelihood vs. m values
sc loglike m,xlab(-6(1)18) xline(`x') yline(`y') ms(i) c(l)

```