

1. Let  $X$  be the ratio between a claim payment and insured capital. Let us assume that  $X \sim \text{beta}(\alpha, \beta)$ , i.e.

$$f_x(x|\alpha, \beta) = \frac{\Gamma(\alpha + \beta)}{\Gamma(\alpha)\Gamma(\beta)} x^{\alpha-1} (1-x)^{\beta-1}, \quad 0 < x < 1, \quad \alpha, \beta > 0$$

Using software R we get (observed data in array x)

```
> length(x)
[1] 500
> mean(x)
[1] 0.6715272
> sd(x)
[1] 0.1775871
> summary(x); length(x); sd(x)
  Min. 1st Qu.  Median    Mean 3rd Qu.   Max.
0.1471 0.5576 0.6811 0.6715 0.8059 0.9945
> # first parameter is alpha
> # second parameter is beta
> minusloglik_beta=function(theta){
+   -sum(dbeta(x,shape1=theta[1],shape2=theta[2],log=TRUE))
+ }
>
> theta.start=c(3,2.5)
> out=nlm(minusloglik_beta,theta.start,hessian=TRUE)
Warning messages:
1: In dbeta(x, shape1, shape2, log) : NaNs produced
2: In nlm(minusloglik_beta, theta.start, hessian = TRUE) :
  NA/Inf replaced by maximum positive value
3: In dbeta(x, shape1, shape2, log) : NaNs produced
4: In nlm(minusloglik_beta, theta.start, hessian = TRUE) :
  NA/Inf replaced by maximum positive value
> HH=out$hessian
> InvHH=solve(HH)
> InvHH_n=InvHH/500
> out
$minimum
[1] -181.6821
$estimate
[1] 3.963062 1.933768
$gradient
[1] -4.785322e-06 5.532537e-06
$hessian
      [,1] [,2]
[1,] 51.01073 -92.3800
[2,] -92.38000 243.9896
$code
```

```

[1] 1
$iterations
[1] 13
> InvHH
      [,1] [,2]
[1,] 0.06236915 0.02361438
[2,] 0.02361438 0.01303947
> InvHH_n
      [,1] [,2]
[1,] 1.247383e-04 4.722875e-05
[2,] 4.722875e-05 2.607895e-05

```

- a) What are the maximum likelihood estimates for  $\alpha$  and  $\beta$ ? Are these estimates reliable?
  - b) Determine a 95% confidence interval for  $\beta$ .
  - c) Using delta method, determine a 95% interval for  $\mu = \alpha / (\alpha + \beta)$
  - d) Without using delta method determine another 95% confidence interval for  $\mu$ .
2. Assume that  $X$  is gamma distributed with unknown parameters  $\alpha$  and  $\theta$ . From this population we collected data set B as a sample.

```

Using software R we got
> x=c(27,82,115,126,155,161,243,294,340,384,457,680,855,877,974,
+ 1193,1340,1884,2558,15743)
> minusLogLikGamma=function(param){
+ -sum(dgamma(x,shape=param[1],scale=param[2],log=TRUE))
+ }
> param.start=c(1,1000)
> out=nlm(minusLogLikGamma,param.start,hessian=TRUE)
Warning messages:
1: In dgamma(x, shape, scale, log) : NaNs produced
2: In nlm(minusLogLikGamma, param.start, hessian = TRUE) :
  NA/Inf replaced by maximum positive value
> out
$minimum
[1] 162.2934
$estimate
[1] 0.556156 2561.146495
$gradient
[1] -8.273560e-05 -6.824815e-09
$hessian
      [,1] [,2]
[1,] 82.443074234 7.808613e-03
[2,] 0.007808613 1.695064e-06

```

```

$code
[1] 1
$iterations
[1] 26
> solve(out$hessian)
      [,1] [,2]
[1,] 0.02151866 -99.12953
[2,] -99.12952956 1046606.28099

```

- What are the maximum likelihood estimates for  $\alpha$  and  $\theta$ ?
- Determine a 95% confidence interval for each parameter.
- Using delta method, determine a 95% interval for  $\mu = E(X)$

- To get a maximum likelihood estimate for the parameter  $\theta$  we defined the following function using R

```

> minusloglik_f=function(theta){
  -sum(log(x)-2*log(theta)-x/theta)
}>

```

Write the density function of the observed data.

- Assume that  $X$  is beta distributed with unknown parameters  $\alpha$  and  $\beta$ . From this population we collected a random sample (see file exer4.csv).
  - What is the sample average?
  - Plot an histogram of the observed sample
  - What are the maximum likelihood estimates for  $\alpha$  and  $\beta$ ?
  - Determine a 95% confidence interval for each parameter.
- Assume that we observed the random sample presented in file exer5.csv.
  - Plot an histogram of the observed sample
  - Assuming a Weibull distribution for the population, compute the maximum likelihood estimate for  $\theta$  and  $\tau$ ? Obtain a maximum likelihood estimate for  $P(X > 100)$ .
  - Assuming an inverse Weibull distribution for the population, compute the maximum likelihood estimate for  $\theta$  and  $\tau$ ? Obtain a maximum likelihood estimate for  $P(X > 100)$ .
  - Obtain a non-parametric estimate for  $P(X > 100)$  and compute a 95% confidence interval for this probability.

- A random sample of 400 claim amounts (thousands of euros) originates the following results:

Claim size	(0, 0.25]	(0.25, 0.5]	(0.5, 1.0]	(1.0, 2.0]	(2.0, 5.0]	(5.0, 10]	Over 10
Nº claims	20	40	110	130	60	30	10

- a. Assuming a gamma distribution for the population, compute the maximum likelihood estimate for  $\alpha$  and  $\theta$ ? Obtain a maximum likelihood estimate for  $P(X > 3)$ .
  - b. Compute a non-parametric estimate for  $P(X > 3)$ .
7. Repeat example 15.17 using improper prior  $\pi(\alpha) = 1/\alpha, \alpha > 0$
  8. Repeat example 15.17 using the discrete prior  $\pi(\alpha) = 1/3, \alpha = 1, 2, 3$ .
  9. Assume that, given  $\theta$ ,  $X$  follows a Bernoulli distribution with parameter  $\theta$ . Using a Bayesian approach obtain, for each case, the posterior distribution for  $\theta$  and compute the mean and the variance of the posterior distribution. Answer each question assuming that we observed : (i) a sample with size  $n = 10$  where  $\bar{x} = 0.1$ ; (ii) a sample with size  $n = 100$  where  $\bar{x} = 0.1$ ; (iii) a sample with size  $n = 1000$  where  $\bar{x} = 0.1$ .
    - a.  $\pi(\theta) = \begin{cases} 0.3 & \theta = 0.05 \\ 0.5 & \theta = 0.1 \\ 0.2 & \theta = 0.2 \end{cases}$
    - b.  $\pi(\theta) = 1/3, \theta = 1, 2, 3$ . Compare with the results obtained using the previous prior.
    - c.  $\pi(\theta) = 30\theta^2(1-\theta)^2, 0 < \theta < 1$ .
    - d.  $\pi(\theta) = 1, 0 < \theta < 1$ . Compare with the results obtained using the previous prior.

**Solutions:**

1. a) 3.963; 1.934 b) (1.710; 2.158) c) (0.6565; 0.6876) d) (0.6560; 0.6871)
2. a) 0.5562; 2561.1 b) (0.2686; 0.8437) (555.99; 4566.3) c) (587.14; 2261.7)
3. deliberately without solution
4. deliberately without solution
5. deliberately without solution
6. deliberately without solution
7. Gamma with parameters 2 and  $\theta$
8. Posterior: Gamma with parameters 9 and 0.2631
9. Posterior (0.0187 for  $\alpha = 1$ , 0.4288 for  $\alpha = 2$ , 0.5525 for  $\alpha = 3$ )