

R Textbook Companion for  
Mathematical Statistics And Data Analysis  
by John A. Rice<sup>1</sup>

Created by  
Debatosh Chakraborty  
BSMS (Integrated 5 year)  
Mathematics  
National Institute of Technology Agartala  
Cross-Checked by  
R TBC Team

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# Book Description

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R numbering policy used in this document and the relation to the above book.

**Exa** Example (Solved example)

**Eqn** Equation (Particular equation of the above book)

For example, Exa 3.51 means solved example 3.51 of this book. Sec 2.3 means an R code whose theory is explained in Section 2.3 of the book.

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# Chapter 1

## Probability

**R code Exa 1.3.A** Probability of coin toss

```
1 #Page 6
2
3 P_A = 0.5
4 P_B = 0.5
5 P_int = 0.25
6
7 prob = P_A + P_B - P_int
8
9 print(prob)
```

---

**R code Exa 1.3.B** AIDS infection

```
1 #Page 6
2
3 library(MASS)
4
5 P_A1 = fractions(1/500)
6 P_A2 = fractions(1/500)
```

```

7
8
9 prob_sum = P_A1 + P_A2
10
11 print(prob_sum)

```

---

**R code Exa 1.4.A** Atleast one head in two toss

```

1 #Page 7
2
3 P_one = 0.25
4
5 P_one_head = P_one *3
6
7 print(P_one_head)

```

---

**R code Exa 1.4.B** Simpsons Paradox

```

1 #Page 7
2
3 p_black1 = 5/(5+6)
4 p_white1 = 3/(3+4)
5
6 print(round(max(p_black1,p_white1),3))
7
8 p_black2 = 6/(6+3)
9 p_white2 = 9/(9+5)
10
11 print(round(max(p_black2,p_white2),3))
12
13 p_black_sum = (5+6)/(5+6+6+3)
14 p_white_sum = (3+9)/(3+4+9+5)
15

```

```
16 print(round(max(p_black_sum,p_white_sum),3))
```

---

#### R code Exa 1.4.1.A Combinations

```
1 #Page 8
2
3 Face_val = 13
4 suit = 4
5
6 combination = Face_val * suit
7
8 print(combination)
```

---

#### R code Exa 1.4.1.B Class representatives selection

```
1 #Page 8
2
3 boy = 12
4 girl = 18
5
6 total_ways = boy * girl
7
8 print(total_ways)
```

---

#### R code Exa 1.4.1.C 8 bit words

```
1 #Page 8
2
3 choice_one_bit = 2
4
```

```
5 choice_all_bit = runif(8,2,2)
6
7 total_choices = prod(choice_all_bit)
8
9 print(total_choices)
```

---

#### R code Exa 1.4.2.A Children lineup

```
1 #Page 10
2
3 total_lineup = factorial(5)
4
5 print(total_lineup)
```

---

#### R code Exa 1.4.2.B Different lines for lineup

```
1 #Page 10
2
3 total_lineup = choose(10,5) * factorial(5)
4
5 print(total_lineup)
```

---

#### R code Exa 1.4.2.C Choosing license plates

```
1 #Page 10
2
3 total_letters = 26
4
5 ways_letter_sample = total_letters^3
6
```

```

7 total_numbers = 10
8
9 ways_number_sample = total_numbers^3
10
11 total_plates = ways_letter_sample * ways_number_
    sample
12
13 print(total_plates)

```

---

#### R code Exa 1.4.2.D Choosing license plates without duplicates

```

1 #Page 10
2
3 total_letters = 26
4
5 ways_letter_sample = total_letters^3
6
7 total_numbers = 10
8
9 ways_number_sample = total_numbers^3
10
11 total_plates = ways_letter_sample * ways_number_
    sample
12
13 print(total_plates)
14
15 letter_chosing = choose(total_letters,3)*factorial
    (3)
16
17 number_chosing = choose(total_numbers,3)*factorial
    (3)
18
19 chosing_without_replace = letter_chosing * number_
    chosing
20 print(chosing_without_replace)

```

```

21
22 prob_no_duplicate = round(chosing_without_replace /
    total_plates,2)
23
24 print(prob_no_duplicate)

```

---

#### R code Exa 1.4.2.E Birthday Problem

```

1 #Page 10
2
3 prob = function(n){
4
5     A_comp = choose(365,n)*factorial(n)
6     p_A_comp = A_comp / 365**n
7     p_A = 1 - p_A_comp
8     return(p_A)
9 }
10
11 age = c(4,16,23,32,40,56)
12 bthdy = data.frame(age,prob(age))
13
14 print(round(bthdy,3))

```

---

#### R code Exa 1.4.2.F Sharing birthday

```

1 #Page 10
2
3 prob = function(n){
4
5     n_A_comp = 364**n
6     p_A_comp = n_A_comp / 365**n
7     p_A = 1 - p_A_comp
8     return(p_A)

```

```

9 }
10
11 func_people = function(n) prob(n)-0.5
12
13 num_people = uniroot(func_people, lower = 0, upper =
    365)
14
15 print(num_people)

```

---

#### R code Exa 1.4.2.G California Lottery

```

1 #Page 12
2
3 tot_num = 49
4 num_choose = 6
5
6 tot_way = choose(tot_num,num_choose)
7 print(tot_way)
8
9 new_rul_tot = 53
10
11 tot_way_new_rule = choose(new_rul_tot,num_choose)
12 print(tot_way_new_rule)

```

---

#### R code Exa 1.4.2.I Capture Recapture Method

```

1 #Page 13
2
3 prob = function(n){
4
5     total_grp = choose(n,20)
6     no_evnt = choose(10,4)*choose(n-10,16)
7     liklihood = no_evnt/total_grp

```

```
8   return(likelihood)
9 }
10
11 n = seq(20,100)
12
13 plot(n,prob(n))
14
15 print(max(prob(n)))
```

---

#### R code Exa 1.4.2.J Seven member committe

```
1 #Page 15
2
3 library(iterpc)
4
5 way = multichoose(c(3,2,2))
6
7 print(way)
```

---

#### R code Exa 1.4.2.K Nucleotide sequence

```
1 #Page 15
2
3 library(iterpc)
4
5 way = multichoose(c(2,4,3))
6
7 print(way)
```

---

#### R code Exa 1.5.A Urn both red



```

1 #Page 17
2
3 library(MASS)
4
5 p_r1 = fractions(3/4)
6 p_r2_r1 = fractions(2/3)
7
8 p_intersect = p_r1*p_r2_r1
9
10 print(p_intersect)

```

---

#### R code Exa 1.5.B Cloudy and raining probability

```

1 #Page 18
2
3 p_a_b = 0.3
4 p_b = 0.2
5
6 p_intersect = p_a_b*p_b
7
8 print(p_intersect)

```

---

#### R code Exa 1.5.C Red ball selection from urn

```

1 #Page 19
2
3 library(MASS)
4
5 p_r1 = fractions(3/4)
6 p_r2_r1 = fractions(2/3)
7 p_r2_b1 = 1
8 p_b1 = 1 - p_r1
9

```

```

10 p_r2 = p_r2_r1*p_r1 + p_r2_b1*p_b1
11
12 print(p_r2)

```

---

### R code Exa 1.5.D Occupation problem Glass and Hall

```

1 #Page 19
2
3 cname = c("u2", "m2", "l2")
4 rname = c('u1', 'm1', 'l1')
5
6 val = c(0.45, 0.48, 0.07, 0.05, 0.7, 0.25, 0.01,
          0.5, 0.49)
7
8 prob_matrix = matrix(val, nrow = 3, byrow = TRUE,
                       dimnames = list(rname, cname))
9
10 print(prob_matrix)
11
12 rval = c(0.1, 0.4, 0.5)
13
14 prob_u2 = sum(prob_matrix[, 'u2'] * rval)
15
16 print(prob_u2)

```

---

### R code Exa 1.5.E Coronary artery disease Diamond and Forrester

```

1 #Page 20
2
3 cname = c("d+", "d-")
4
5
6 val = c(0.42, 0.96, 0.24, 0.02, 0.2, 0.02, 0.15, 0)

```

```

7
8 prob_matrix = matrix(val, ncol = 2, byrow = TRUE )
9 colnames(prob_matrix) = cname
10
11 print(prob_matrix)
12
13 cval1 = c(0.05, 0.95)
14
15 prob_t0 = sum(prob_matrix[1,]*cval1)
16 prob_t1 = sum(prob_matrix[2,]*cval1)
17
18 prob_dplus_t0 = prob_matrix[1,'d+']*cval1[1]/prob_t0
19 prob_dplus_t1 = prob_matrix[2,'d+']*cval1[1]/prob_t1
20
21
22 print(c(prob_dplus_t0, prob_dplus_t1))
23
24 cval2 = c(0.92, 0.08)
25
26 prob_t0_2 = sum(prob_matrix[1,]*cval2)
27 prob_t1_2 = sum(prob_matrix[2,]*cval2)
28
29 prob_dplus_t0_2 = prob_matrix[1,'d+']*cval2[1]/prob_
    t0_2
30 prob_dplus_t1_2 = prob_matrix[2,'d+']*cval2[1]/prob_
    t1_2
31
32 print(c(prob_dplus_t0_2, prob_dplus_t1_2))

```

---

### R code Exa 1.5.F Polygraph Test

```

1 #Page 21
2
3 p_t = 0.99
4 p_plus_t = 0.14

```

```

5
6 p_t_plus = (p_plus_t*p_t)/(p_plus_t*p_t + (1-p_plus_
      t)*(1- p_t))
7
8 print(round(p_t_plus,2))

```

---

#### R code Exa 1.6.A Ace and Diamond probability

```

1 #Page 23
2
3 library(MASS)
4
5 p_a = fractions(4/52)
6 p_d = fractions(1/4)
7
8 p_intersect = p_a*p_d
9
10 print(p_intersect)

```

---

#### R code Exa 1.6.D No AIDS infection

```

1 #Page 24
2
3 p_transmit = 1/500
4
5 p_no_transmit = 1 - p_transmit
6
7 p_no_infection = round(p_no_transmit**500,2)
8
9 print(p_no_infection)
10
11 p_infection = round(1 - p_no_infection,2)
12

```

```
13 print(p_infection)
```

---

#### R code Exa 1.6.F Circuit fail

```
1 #Page 25
2
3 circuit = function(n,p){
4   (1-p)**n
5 }
6
7 n = 10
8 p = 0.05
9
10 circuit_work = round(circuit(n,p),2)
11 circuit_fail = 1 - circuit_work
12
13 print(c(circuit_work, circuit_fail))
14
15 system_fail = p**10
16
17 print(system_fail)
```

---

# Chapter 2

## Random Variables

R code Exa 2.1.2.A Tay Sachs disease

```
1 #Page 38
2
3 k = seq(0,4)
4
5 p_k = data.frame(k,p_k = round(dbinom(k,4,0.25),3))
6
7 print(p_k)
```

---

R code Exa 2.1.2.B Message receiving error

```
1 #Page 39
2
3 binom_approx = function(n,k,p){
4   r = seq(0,k)
5   sum(choose(n,r)*(p**r)*((1-p)**(n-r)))
6 }
7
8 p_2_error = binom_approx(5,2,0.1)
```

```
9  
10 print(p_2_error)
```

---

#### R code Exa 2.1.3.A State lottery frequency function

```
1 #Page 40  
2  
3 p = 1/9  
4  
5 ticket = seq(1,50)  
6  
7 plot(ticket, dgeom(ticket,p), ylab = "p(x)")
```

---

#### R code Exa 2.1.3.B Distribution of ticket

```
1 #Page 41  
2  
3 neg_bino_2 = function(k,p){  
4   (k-1)*p**2*(1-p)**(k-2)  
5 }  
6  
7 x = seq(1,50)  
8 p = 1/9  
9  
10 plot(x,neg_bino_2(x,p))
```

---

#### R code Exa 2.1.4.A Lottery mass function

```
1 #Page 42  
2
```

```
3 k = seq(0,6)
4
5 data.frame(k, p_k = dhyper(k,6,47,6))
```

---

#### R code Exa 2.1.5.A Binomial and poisson approximation

```
1 #page 44
2
3 k = seq(0,11)
4 prob = 1/36
5
6 p_binom = round(dbinom(k, size = 100, p = prob),4)
7
8 p_pois = round(dpois(k, lambda = 100*prob),4)
9
10 approximation = data.frame(k, binomial_probability =
    p_binom, poisson_probability = p_pois)
11
12 print(approximation)
13
14 #The answer may slightly vary due to rounding off
    values.
```

---

#### R code Exa 2.1.5.B Horse kick fatalities

```
1 #Page 45
2
3 death = seq(0,4)
4
5 freq = c(109,65,22,3,1)
6
7 rel_freq = freq/sum(freq)
8
```



```

9 p_pois = round(dpois(death, lambda = 0.61),3)
10
11 kicks = data.frame(death, freq, rel_freq,p_pois)
12
13 print(kicks)

```

---

#### R code Exa 2.1.5.C Telephone call poisson process

```

1 #Page 46
2
3 lambda_process = 0.5
4
5 parameter = 5*lambda_process
6
7 p_no_call = round(exp(-parameter),3)
8
9 p_one_call = round(dpois(1,lambda = parameter),3)
10
11 print(c(p_no_call, p_one_call))

```

---

#### R code Exa 2.1.5.D Poisson process simulation

```

1 #Page 46
2
3 a1 = rpois(20, lambda = 25)
4 a2 = rpois(20, lambda = 25)
5 a3 = rpois(20, lambda = 25)
6 a4 = rpois(20, lambda = 25)
7
8 par(mfrow = c(2,2))
9 plot(a1/mean(a1))
10 plot(a2/mean(a2))
11 plot(a3/mean(a3))

```

```
12  plot(a4/mean(a4))
```

---

### R code Exa 2.2.C Quartile of distribution Function

```
1  #Page 48
2
3
4  F = function(n){
5    if (n < 0) return(0) else if ( n <= 1) return(n^2)
6      else return(1)
7  }
8  F_inv = function(n){
9    if (n < 0) return(0) else if ( n <= 1) return(sqrt
10      (n)) else return(1)
11  }
12  median = F_inv(0.5)
13  low_quart = F_inv(0.25)
14  up_quart = F_inv(0.75)
15
16  print(round(c(median, low_quart, up_quart),3))
```

---

### R code Exa 2.3.A Standardized IQ scores

```
1  #Page 60
2
3  mean = 100
4  sd = 15
5
6  prob = round(pnorm(130, mean = mean, sd = sd) -
7    pnorm(120, mean = mean, sd = sd),3)
```

```
8 print(prob)
9
10 #The answer may slightly vary due to rounding off
    values
```

---

**R code Exa 2.3.B** Normal probability

```
1 #Page 61
2
3
4 prob = round(pnorm(1) - pnorm(-1),2)
5
6 print(prob)
```

---

**R code Exa 2.3.D** CDF of uniform distribution

```
1 #Page 62
2
3 F = expression(1 - 1/v)
4
5 f = D(F, "v")
6
7 print(f)
```

---

# Chapter 3

## Joint Distributions

R code Exa 3.3.A Joint density plot

```
1 #Page 75
2
3 library(Ryacas)
4 bi_density = function(x,y) (x^2 + x*y)*12/7
5
6 x = yac_symbol("x")
7 y = yac_symbol("y")
8
9
10 integrand = integrate(bi_density(x,y), y, 0, "x")
11
12 prob = integrate(integrand, x, 0, 1)
13 print(prob)
14
15 x = y = seq(0,1, length = 10)
16 z = outer(x,y,bi_density)
17
18 persp(x,y,z,theta = 30, phi = 30,ticktype = "
    detailed")
```

---

### R code Exa 3.3.B Marginal Disstribution

```
1 #Page 76
2
3 library(Ryacas)
4 bi_density = function(x,y) (x^2 + x*y)*12/7
5
6 x = yac_symbol("x")
7 y = yac_symbol("y")
8
9 marginal_x = simplify(integrate(bi_density(x,y), y,
10                                0, 1))
11
12 marginal_y = simplify(integrate(bi_density(x,y), x,
13                                0, 1))
14
15 print(c(marginal_x, marginal_y))
```

---

### R code Exa 3.3.C Farlie Morgenstern Family

```
1 #Page 77
2
3 H_neg_1 = expression(x^2*y + x*y^2 - x^2*y^2)
4 H_1 = expression(2*x*y - x^2*y - x*y^2 + x^2*y^2)
5
6
7 h_neg_1 = D(D(H_neg_1, "x"), "y")
8 h_1 = D(D(H_1, "x"), "y")
9
10 print(c(h_neg_1, h_1))
11
12 x = y = seq(0,1, length = 30)
```

```

13 z_neg_1 = outer(x,y,function(x,y) eval(h_neg_1))
14 z_1 = outer(x,y,function(x,y) eval(h_1))
15
16
17 persp(x,y,z_neg_1,theta = 30, phi = 30,ticktype = "
    detailed")
18 persp(x,y,z_1,theta = 30, phi = 30,ticktype = "
    detailed")

```

---

### R code Exa 3.3.E Random point in a disk

```

1 #Page 81
2
3 library(Ryacas)
4
5 disk = function(x) (sqrt(1 - x^2))
6 area = function(x,y) 1/pi + 0*x*y
7
8 x = yac_symbol("x")
9 y = yac_symbol("y")
10
11 marginal = integrate(area(x,y), y, as.character(-
    disk(x)), as.character(disk(x)))
12
13 print(marginal)
14
15 #The answer may vary due to difference in
    representation.

```

---

### R code Exa 3.5.1.A Conditional Distribution frequency

```

1 #Page 87
2

```

```

3 library(MASS)
4
5 disc = fractions(c(1/8, 2/8, 1/8, 0, 0, 1/8, 2/8, 1/
      8))
6
7 table = fractions(matrix(disc, byrow = TRUE, nrow =
      2))
8
9 p_y_1 = sum(table[,2])
10
11 p_0_1 = table[1,2]/p_y_1
12 p_1_1 = table[2,2]/p_y_1
13
14 print(fractions(c(p_0_1, p_1_1)))

```

---

### R code Exa 3.6.2.B Jacobian finding

```

1 #Page 102
2
3 library(Ryacas)
4
5 r = function(x,y) (sqrt(x^2 + y^2))
6 theta = function(x,y) (atan(y/x))
7
8 x = yac_symbol("x")
9 y = yac_symbol("y")
10
11 drdx = deriv(r(x,y), "x")
12 drdy = deriv(r(x,y), "y")
13 dthetadx = deriv(theta(x,y), "x")
14 dthetady = deriv(theta(x,y), "y")
15
16 J = simplify(drdx*dthetady) - simplify(drdy*dthetadx
      )
17

```

```

18 print(J)
19
20 #The answer may vary due to difference in
    representation.

```

---

### R code Exa 3.7.D Distribution of Range

```

1 #Page 106
2
3 library(Ryacas)
4
5 integrand = function(n,r,v) n*(n-1)*r^(n-2) +0*v
6
7 n = yac_symbol("n")
8 r = yac_symbol("r")
9 v = yac_symbol("v")
10
11 f_r = integrate(integrand(n,r,v), v, 0, "1-r")
12
13 print(f_r)
14
15 F_r = integrate(f_r, r, 0, "r")
16
17 print(F_r)
18
19 #The answer may vary due to difference in
    representation.

```

---

### R code Exa 3.7.E Tolerance Interval

```

1 #Page 106
2
3 n = 100

```



```
4 alpha = 0.95
5
6 prob_q = round(1 - n*alpha^(n-1) + (n-1)*alpha^n,2)
7
8 print(prob_q)
```

---

# Chapter 4

## Expected Values

R code Exa 4.1.A Roulette

```
1 #Page 116
2
3 library(MASS)
4
5 freq = c(1,-1)
6 prob = c(18/38, 20/38)
7
8 expectation = fractions(sum(freq*prob))
9
10 print(expectation)
```

---

R code Exa 4.1.H Cauchy pseudorandom generator

```
1 #Page 119
2
3 set.seed(30)
4
5 n = seq(1,500)
```

```

6
7 x_n = rnorm(500)
8 x_c = rcauchy(500)
9
10 g_n = c()
11 c_n = c()
12
13 for (i in n) {
14   g_i = mean(x_n[1:i])
15   c_i = mean(x_c[1:i])
16
17   g_n = c(g_n, g_i)
18   c_n = c(c_n, c_i)
19 }
20
21 par(mfrow = c(2,1))
22 plot(n,abs(g_n), ylim = c(0,1))
23
24 plot(n,c_n)
25
26 #The answer may vary due to difference in
   representation.

```

---

#### R code Exa 4.1.2.B Coupon Collection

```

1 #Page 127
2
3 library(Ryacas)
4
5 e_xr = function(n,r) n/(n-r+1)
6
7 n = 10
8 r = yac_symbol("r")
9
10 e_x = sum(e_xr(n,r), r, 1, n)

```

```

11
12 print(round(as_r(e_x),1))
13
14 e_x_appox = function(n) n*(log(n) -digamma(1))
15
16 print(round(e_x_appox(n), 1))

```

---

#### R code Exa 4.1.2.C Group Testing

```

1 #Page 129
2
3 prop_n = function(k,p) 1 + 1/k -p^k
4
5 p = 0.99
6 k = seq(1,20)
7
8 prop = prop_n(k,p)
9
10 plot(k, prop, ylab = "Proportion")

```

---

#### R code Exa 4.2.C Uniform Distribution Variance

```

1 #Page 132
2
3 library(MASS)
4
5 e_x = 1/2
6
7 e_x2 = integrate(function(x) x^2, 0, 1)
8
9 var_x = fractions( e_x2$value - (e_x)^2 )
10
11 print(var_x)

```

---

### R code Exa 4.3.A Bivariate covariance

```
1 #Page 138
2
3 library(Ryacas)
4 library(MASS)
5
6 bi_f = function(x,y) 2*x + 2*y - 4*x*y
7
8 x = yac_symbol("x")
9 y = yac_symbol("y")
10
11 e_xy = integrate(bi_f(x,y)*x*y, x, 0, 1)
12 e_xy = integrate(e_xy, y, 0, 1)
13
14 print(e_xy)
15
16 e_x = e_y = 1/2
17
18 cov_xy = fractions(as_r(e_xy) - e_x*e_y)
19
20 print(cov_xy)
```

---

### R code Exa 4.3.D Bivariate correlation coefficient

```
1 #Page 142
2
3 library(MASS)
4
5 var_x = var_y = 1/12
6 cov_xy = -1/36
```

```

7
8 corr_coef = fractions(cov_xy/sqrt(var_x*var_y))
9
10 print(corr_coef)

```

---

#### R code Exa 4.4.1.E Random Sums

```

1 #Page 151
2
3 E_x = 1000
4 var_n = 900
5
6 E_n = 900
7 var_x = 500
8
9 var_t = E_x^2 * var_n + E_n * var_x^2
10
11 sd = sqrt(var_t)
12
13 cat(sd, var_t)

```

---

#### R code Exa 4.6.B Accuracy of approximations

```

1 #Page 163
2 library(MASS)
3
4 g_x = function(x) sqrt(x)
5 x = seq(0,2,0.001)
6 plot(x, g_x(x), type = "l")
7
8 e_y = fractions(integrate(g_x, 0,1)$value)
9 print(e_y)
10 e_y2 = 1/2

```

```

11
12 var_y = e_y2 - e_y^2
13 print(var_y)
14 sd_y = sqrt(var_y)
15 print(c("Exact results", round(e_y,3), round(var_y
      ,3), round(sd_y,3)))
16
17 g_1_x = D(expression(sqrt(p)), "p")
18 g_2_x = D(g_1_x, "p")
19
20
21 mu = 1/2
22 var = 1/12
23
24
25 app_e_y = g_x(mu) + 1/2*var*eval({p = mu; g_2_x})
26 app_var_y = var * eval({p = mu; g_1_x})^2
27 app_sd_y = sqrt(app_var_y)
28 print(c("Approximate Results", round(app_e_y,3),
      round(app_var_y,3), round(app_sd_y,3)))

```

---

# Chapter 5

## Limit Theorems

**R code Exa 5.2.A** Monte Carlo Integration

```
1 #Page 179
2
3 set.seed(1)
4 I_f = round(pnorm(1) - pnorm(0),4)
5
6 x = runif(1000)
7
8 app_I_f = 1/1000*(1/sqrt(2*pi))*sum(exp(-x^2/2))
9
10 cat("Exact", I_f, "Approximation", app_I_f)
11
12 #The answer may vary due to difference in
    representation.
```

---

**R code Exa 5.3.B** Particle emission from poisson process

```
1 #Page 183
2
```



```

3 prob_pois = 1 - ppois(950, lambda = 900)
4
5 prob_norm = 1 - pnorm(5/3)
6
7 cat("Actual", round(prob_pois,5), "Approx", round(
  prob_norm, 6))

```

---

### R code Exa 5.3.C Approximating uniform distribution as Normal density

```

1 #Page 185
2
3 set.seed(39)
4 x = c()
5
6 for(i in 1:1000){
7   x_i = runif(12, -1/2, 1/2)
8   x = append(x, sum(x_i))
9 }
10
11 miu = mean(x)
12 sd = sqrt(var(x))
13
14 freq = hist(x, xlim = c(-4,6))
15 height = max(freq$counts)/dnorm(miu,miu,sd)
16 curve(dnorm(x,miu,sd)*height, add = TRUE, col = "
  dark blue")
17
18 #The answer may vary due to difference in
  representation

```

---

### R code Exa 5.3.E Measurement Error

```

1 #Page 186

```

```

2
3 c = 0.5
4 n = 16
5 sigma = 1
6
7 prob = pnorm(c*sqrt(n)/sigma) - pnorm(-c*sqrt(n)/
      sigma)
8
9 print(prob)

```

---

#### R code Exa 5.3.F Normal Approximation to Binomial Density

```

1 #Page 187
2
3 p = 0.5
4 n = 100
5
6 miu = n*p
7 sd = sqrt(n*p*(1-p))
8
9 x = 60
10
11 prob_approx = 1 - pnorm((x - miu)/sd)
12
13 print(round(prob_approx,4))

```

---

# Chapter 7

## Survey Sampling

R code Exa 7.3.1.A Simulation of sampling distribution

```
1
2 sample = function(n) replicate(500, mean(runif(n, 0,
3     2000)))
4 par(mfrow = c(4,1))
5 hist(sample(8), xlim = c(0,2000))
6 hist(sample(16), xlim = c(0,2000))
7 hist(sample(32), xlim = c(0,2000))
8 hist(sample(64), xlim = c(0,2000))
```

---

R code Exa 7.3.1.B Sampling without replacement

```
1 #Page 209
2
3 var = 589.7
4 n = 32
5
6 N = 393
```

```

7
8 var_sample = var/sqrt(n)*sqrt(1 - (n-1)/(N-1))
9
10 print(round(var_sample,1))

```

---

**R code Exa 7.3.1.C** Sampling result applied to estimation

```

1 #Page 209
2
3 var = 589.7
4 n = 32
5 p = 0.654
6
7 N = 393
8
9 population_corr = sqrt(1 - (n-1)/(N-1))
10 std_error = sqrt(p*(1-p)/n)*population_corr
11
12 print(round(std_error,2))

```

---

**R code Exa 7.3.2.A** Standard Error of estimate

```

1 #Page 213
2
3 var = 589.7
4 n = 50
5
6 s = 614.53
7 X_bar = 938.5
8
9 N = 393
10
11 var_sample = s^2/n*(1 - n/N)

```

```
12 sd = sqrt(var_sample)
13
14 cat(var_sample, sd)
```

---

#### R code Exa 7.3.2.B Estimated standard error of true value

```
1 #Page 213
2
3 X_bar = 938.5
4
5 N = 393
6
7 s_x = 81.19
8
9 T = N*X_bar
10 s = N*s_x
11
12 cat(round(T), round(s))
```

---

#### R code Exa 7.3.2.C Standard error of Variance

```
1 #Page 213
2
3 p = 0.654
4 p_hat = 26/50
5
6 n = 50
7
8 N = 393
9
10 var_p_hat = p_hat*(1-p_hat)/(n-1)*(1 - n/N)
11
12 sd_p_hat = sqrt(var_p_hat)
```

```

13
14 error = 2*sd_p_hat
15
16 cat(round(sd_p_hat,3),round(error,3))

```

---

#### R code Exa 7.3.3.A CLT Approximation

```

1 #Page 215
2
3 var = 589.7
4 n = 64
5
6 X_bar = 938.5
7
8 N = 393
9
10 var_sample = var^2/n*(1 - n/N)
11 sd = round(sqrt(var_sample),1)
12
13 prob = round(1 - pnorm(100/sd),3)
14
15 cat(sd,prob)

```

---

#### R code Exa 7.3.3.B Standard error of sample mean

```

1 #Page 216
2
3 n = 50
4 sd_x = 78
5
6 X_bar = 938.35
7 c = 123.9
8

```

```
9 prob = round(2 - 2*pnorm(c/sd_x),2)
10
11 print(prob)
```

---

#### R code Exa 7.3.3.C Hospital discharge problem estimate error

```
1 #Page 216
2
3 p_hat = 0.52
4 p = 0.65
5
6 n = 50
7 N = 393
8
9 c = abs(p_hat - p)
10
11 sd_p = sqrt(p*(1-p)/n*(1-(n-1)/(N-1)))
12
13 prob_estimate = round(2*(1 - pnorm(2.03)),2)
14
15 print(prob_estimate)
```

---

#### R code Exa 7.3.3.D Error of condominium units

```
1 #Page 219
2
3 N = 8000
4 n = 100
5
6 s = 0.8
7 X_bar = 1.6
8
9 s_x = round(s/sqrt(n)*sqrt(1 - n/N),2)
```

```

10
11 z = abs(qnorm(0.025))
12
13 cat("CI for X_bar (", round(X_bar - z*s_x,2), round(
    X_bar + z*s_x,2), ")")
14
15 T = round(N*X_bar)
16 s_t = round(N*s_x)
17
18 cat("CI for Total (", round(T - z*s_t), round(T + z*
    s_t), ")")
19
20 p_hat = 0.12
21 s_p = round(sqrt(p_hat*(1-p_hat)/(n-1)*(1 - n/N)),2)
22
23 cat("CI for population proportion (", round(p_hat -
    z*s_p,2), round(p_hat + z*s_p,2), ")")
24
25 T_p = round(N*p_hat)
26 s_tp = round(N*s_p)
27
28 cat("CI for number population planning (", round(T_p
    - z*s_tp), round(T_p + z*s_tp), ")")

```

---

### R code Exa 7.3.3.E Error of owners selling

```

1 #Page 220
2
3 z = 1.96
4 N = 8000
5
6 p_hat = 0.12
7
8 correction = z*N*sqrt(p_hat*(1-p_hat))/200
9 n = 1 + round(correction**2)

```



```
10
11 print(n)
```

---

#### R code Exa 7.4.A Mortgage payment R standard error

```
1 #Page 223
2
3 n = 10
4 N = 100
5 X_bar = 3100
6 Y_bar = 868
7 s_y = 250
8 s_x = 1200
9 row = 0.85
10 R = 0.28
11
12 s_r = round(1/n*(1 - (n-1)/(N-1))/X_bar*
13   sqrt(R^2*s_x^2 + s_y^2 - 2*R*row*s_x*s_y),3)
14
15 print(c("s_r",s_r))
16
17 cat("CI for r (", R - z*s_r, R + z*s_r, ")")
18
19 #The answer may slightly vary due to rounding off
   values.
```

---

#### R code Exa 7.4.D Precision of ratio estimate

```
1 #Page 226
2
3 miu_x = 274.8
4 miu_y = 814.6
5 r = 2.96
```

```

6
7 sd_x = 213.2
8 sd_y = 589.7
9 row = 0.91
10
11 n = 64
12 N = 500
13
14 var_y_bar = (r^2*sd_x^2 + sd_y^2 - 2*r*row*sd_x*sd_y
15             )/n
16 sd_y_bar = sqrt(var_y_bar)
17
18 print(sd_y_bar)
19
20 sd = 589.7
21 sd_y_bar_simple = sd*sqrt((1-(n-1)/(N-1))/n)
22
23 print(sd_y_bar_simple)
24
25 ratio = (var_y_bar*n) /sd^2
26
27 print(round(ratio,4))
28
29 #The answer may slightly vary due to rounding off
   values.

```

---

### R code Exa 7.5.2.A Size stratification of Hospitals

```

1 #Page 230
2
3 N = c(98,98,98,99)
4 W = c(0.249, 0.249, 0.249, 0.251)
5 miu = c(182.9,526.5,956.3,1591.2)
6 sd = c(103.4, 204.8, 243.5, 419.2)

```

```

7
8 hospital = data.frame(N,W,miu,sd)
9
10 var = 4*sum(W^2*sd^2)
11 sd_x_s = sqrt(var)
12
13 print(sd_x_s)

```

---

### R code Exa 7.5.2.B CI for population mean of Hospital strata

```

1 #Page 231
2
3 N = c(98,98,98,99)
4 W = c(0.249, 0.249, 0.249, 0.251)
5 miu = c(182.9,526.5,956.3,1591.2)
6 sd = c(103.4, 204.8, 243.5, 419.2)
7
8 hospital = data.frame(N,W,miu,sd)
9
10 x_bar = c(240.6, 507.4, 865.1, 1716.5)
11 s_var = c(6827.6, 23790.7, 42573, 152099)
12
13 n = 10
14
15 X_s = mean(x_bar)
16 var_x = round(1/n*sum(W^2*(1 - (n-1)/(N-1))*s_var),1)
17
18 sd_x = sqrt(var_x)
19
20 cat(X_s, var_x, sd_x)
21 cat("CI for X_bar (", round(X_s - 1.96*sd_x,2),
      round(X_s + 1.96*sd_x,2), ")")
22
23 T_s = sum(N)*X_s

```

```

24 s_t = sum(N)*sd_x
25 cat("CI for T_s (", round(T_s - 1.96*s_t), round(T_s
    + 1.96*s_t), ")")
26
27 #The answer may vary due to rounding off values

```

---

### R code Exa 7.5.3.A Weight allocation of hospital strata

```

1 #Page 234
2
3 N = c(98,98,98,99)
4 W = c(0.249, 0.249, 0.249, 0.251)
5 miu = c(182.9,526.5,956.3,1591.2)
6 sd = c(103.4, 204.8, 243.5, 419.2)
7
8 hospital = data.frame(N,W,miu,sd)
9
10 weight = W*sd/sum(W*sd)
11
12 print(round(weight,3))

```

---

### R code Exa 7.5.3.B Proportional allocation of Hospital strata

```

1 #Page 236
2
3 N = c(98,98,98,99)
4 W = c(0.249, 0.249, 0.249, 0.251)
5 miu = c(182.9,526.5,956.3,1591.2)
6 sd = c(103.4, 204.8, 243.5, 419.2)
7
8 hospital = data.frame(N,W,miu,sd)
9
10 var_ratio = 1 + sum(W*(sd-mean(sd))^2)/sum(W*sd)^2

```

```
11
12 print(round(var_ratio,3))
13
14 #The answer may vary due to rounding off values
```

---

### R code Exa 7.5.3.C Optimal allocation improvement

```
1 #Page 237
2
3 N = c(98,98,98,99)
4 W = c(0.249, 0.249, 0.249, 0.251)
5 miu = c(182.9,526.5,956.3,1591.2)
6 sd = c(103.4, 204.8, 243.5, 419.2)
7
8 hospital = data.frame(N,W,miu,sd)
9
10 var_ratio = 1 + sum(W*(miu-mean(miu))^2)/sum(W*sd^2)
11
12 print(round(var_ratio,3))
13
14 #The answer may vary due to rounding off values
```

---

## Chapter 8

# Estimation of Parameters and Fitting of Probability Distributions

**R code Exa 8.4.A** Moments of Poisson Distribution

```
1 #Page 261
2
3 fibre = c(31, 29, 19, 18, 31, 28, 34, 27, 34, 30,
4           16, 18, 26, 27, 27, 18, 24, 22, 28, 24,
5           21, 17, 24)
6 lambda_hat = round(mean(fibre),1)
7
8 s_lambda = round(sqrt(lambda_hat/length(fibre)),2)
9
10 print(c(lambda_hat, s_lambda))
```

---

**R code Exa 8.4.C** Fitting of Gamma Distribution

```

1 #Page 263
2
3 X_bar = 0.224
4 sigma_hat_2 = 0.1338
5
6 lambda_hat = round(X_bar/sigma_hat_2,3)
7 alpha_hat = round(X_bar^2/sigma_hat_2,3)
8
9 print(c(lambda_hat,alpha_hat))

```

---

**R code Exa 8.4.D** Method of moments distribution of Angular Distribution

```

1 #Page 119
2
3 library(Ryacas)
4
5 f = function(x,a) x*(1 + a*x)/2
6
7 x = yac_symbol("x")
8 a = yac_symbol("a")
9
10 miu = integrate(f(x,a),"x",-1,1)
11
12 print(simplify(miu))

```

---

**R code Exa 8.5.1.A** Hardy Weinberg Equilibrium

```

1 #Page 273
2
3 x = c(342,500,187)
4
5 theta_hat = (2*x[3] + x[2])/(2*sum(x))

```

```
6
7 print(round(theta_hat,4))
```

---

### R code Exa 8.5.3.A MLE simulation of mu and sigma squared

```
1 #Page 279
2
3 library(plotrix)
4 x_bar = c()
5 sd_hat = c()
6
7 for(i in 1:20){
8   x = rnorm(11, mean = 10, sd = 9)
9   print(mean(x))
10  x_bar = c(x_bar, mean(x))
11  sd_hat = c(sd_hat, sd(x))
12 }
13
14 n = 11
15 alpha = 0.9
16 lower_sd = n*sd_hat^2/qchisq(alpha/2, df = n-1)
17 upper_sd = n*sd_hat^2/qchisq(1-alpha/2, df = n-1)
18
19 plotCI(x = 1:20, y = sd_hat, li = upper_sd, ui =
        lower_sd, y_lim = c(7,12))
```

---

### R code Exa 8.5.3.B Poisson distribution MLE

```
1 #Page 282
2
3 X_bar = 24.9
4 n = 23
5 alpha = 0.9
```



```

6
7 s_lamda = round(sqrt(X_bar/n),2)
8 print(s_lamda)
9
10 z = abs(qnorm((1-alpha)/2))
11
12 uplim = round(X_bar + z*s_lamda,2)
13 lowlim = round(X_bar - z*s_lamda,2)
14
15 cat("CI for lambda hat is (", lowlim, uplim, ")")

```

---

#### R code Exa 8.5.3.C Hardy Weinberg Equilibrium

```

1 #page 283
2
3 theta_hat = 0.4247
4 n = 1029
5
6 s_theta = sqrt(theta_hat*(1 - theta_hat)/(2*n))
7
8 cat("CI for theta (", round(theta_hat - 1.96*s_theta
   , 3), round(theta_hat + 1.96*s_theta, 3), ")")

```

---

#### R code Exa 8.5.3.D Bootstrap estimate of Hardy Weinberg equilibrium problem

```

1 #Page 284
2
3 quan_25 = 0.403
4 quan_975 = 0.446
5
6 theta_hat = 0.425
7

```

```

8 d = quan_25 - theta_hat
9 d_bar = quan_975 - theta_hat
10
11 cat("CI for theta", theta_hat - d_bar, theta_hat - d
    )

```

---

### R code Exa 8.5.3.E Bootstrap to find CI for Gamma Distribution

```

1 #Page 285
2
3 quan_50 = 0.419
4 quan_950 = 0.538
5
6 alpha_bar = 0.471
7
8 d = quan_50 - alpha_bar
9 d_bar = quan_950 - alpha_bar
10
11 cat("CI for theta", alpha_bar - d_bar, alpha_bar - d
    )

```

---

### R code Exa 8.7.A Muon decay

```

1 #Page 299
2
3 alpha = seq(0.1,0.9,0.1)
4 alpha = append(alpha,0.95)
5
6 eff = 2*alpha^3/(3-alpha^2)*(1/(log((1+alpha)/(1-
    alpha))) - 2*alpha))
7
8 print(data.frame(alpha, round(eff,3)))

```

---

### R code Exa 8.7.1.A Approximation to insect count problem

```
1 # Page 304
2 x = 0:7
3 count = c(70, 38, 17, 10, 9, 3, 2, 1)
4
5 lambda = sum(count*x)/150
6 pois_dist = round(dpois(x, lambda)*150, 1)
7
8 neg_dist_prob = function(m, k, n){
9   if(n == 0) p = (1 + (m/k))**(-k)
10  else p = (k + n - 1)/n*(m/(k+m))* neg_dist_prob(m, k
11    , (n-1))
12 }
13 m = 1.146
14 k = 1.025
15 neg_bin_dist = round(sapply(x, neg_dist_prob, m = m,
16   k = k)*150, 1)
17 data.frame(Number_per_leaf = x, Observed_Count =
18   count, Poisson_Distribution = pois_dist, Negative
19   _Binomial_Distribution = neg_bin_dist)
20
21 # The answer may slightly vary due to rounding off
22   values
```

---

## Chapter 9

# Testing Hypotheses and Assessing Goodness of Fit

R code Exa 9.5.A Hardy Weinberg Equilibrium data fitting

```
1 #Page 343
2
3 blood = matrix(c(342,500,187,340.6,502.8, 185.6),
4               nrow = 2, ncol = 3, byrow = TRUE,
5               dimnames = list(c("O", "E"), c("M", "MN",
6               , "N"))))
7
8 print(blood)
9
10 X_2 = sum((blood["O",]-blood["E",])^2/blood["E",])
11
12 print(X_2)
13
14 log_lambda = round(2*sum(blood["O",]*log(blood["O",]
15 /blood["E",])),4)
16 max_liklihood_ratio = round(exp(-log_lambda/2),2)
17
18 cat(log_lambda, max_liklihood_ratio)
```

---

### R code Exa 9.5.B Chi squared statistic of Bacterial Clumps

```
1 #Page 344
2
3 n = 400
4 no = c(0:10,19)
5 freq = c(56,104,80,62,42,27,9,9,5,3,2,1)
6
7 lambda = sum(no*freq)/n
8
9 print(lambda)
10
11 o = c(freq[1:7],sum(freq[8:length(freq)]))
12 e = round(dpois(no[1:7], lambda = lambda)*n,1)
13 e = append(e,round(400*(ppois(10,lambda)-ppois(6,
    lambda)),1))
14 x_2 = round((o-e)^2/e,2)
15
16 table = data.frame(o,e,x_2)
17 print(table)
18
19 chi_sq = sum(x_2)
20 print(chi_sq)
```

---

### R code Exa 9.5.C Fishers Reexamination of Mendels Data

```
1 #Page 345
2
3 o = c(315,108,102,31)
4 freq = c(9/16,3/16,3/16,1/16)
5 n = 556
6
```

```

7 e = freq*n
8
9 table = data.frame(o,e)
10
11 log_lambda = 2*sum(o*log(o/e))
12
13 print(round(log_lambda,3))

```

---

### R code Exa 9.6.A Poisson Dispersion test of Asbestos Fibers

```

1 #Page 348
2
3 library(lmtest)
4 fibre = c(31, 29, 19, 18, 31, 28, 34, 27, 34, 30,
5           16, 18, 26, 27, 27, 18, 24, 22, 28, 24,
6           21, 17, 24)
7
8 x_bar = round(mean(fibre),1)
9
10 pois = 1/x_bar*sum((fibre-x_bar)^2)
11 print(pois)
12
13 liklihood = 2*sum(fibre*log(fibre/x_bar))
14 print(liklihood)

```

---

### R code Exa 9.6.B Poisson Distribution fitting of Bacterial clumps

```

1 #Page 348
2
3 n = 400
4 no = c(0:10,19)
5 freq = c(56,104,80,62,42,27,9,9,5,3,2,1)
6

```

```

7 x_bar = sum(no*freq)/n
8
9 print(lambda)
10
11 var_hat = sum(no^2*freq)/n - x_bar^2
12
13 print(var_hat)
14
15 T = n*var_hat/x_bar
16 print(T)
17
18 df = n-1
19 P_val = (T - df)/sqrt(2*df)
20
21 pob = 1 - pnorm(P_val)
22 print(pob)

```

---

### R code Exa 9.8.A Michelsons determinations of the velocity of light

```

1 #Page 355
2
3 data = c(850, 960, 880, 890, 890, 740,
4          940, 880, 810, 840, 900, 960,
5          880, 810, 780, 1070, 940, 860,
6          820, 810, 930, 880, 720, 800,
7          760, 850, 800, 720, 770, 810,
8          950, 850, 620, 760, 790, 980,
9          880, 860, 740, 810, 980, 900,
10         970, 750, 820, 880, 840, 950,
11         760, 850, 1000, 830, 880, 910,
12         870, 980, 790, 910, 920, 870,
13         930, 810, 850, 890, 810, 650,
14         880, 870, 860, 740, 760, 880,
15         840, 880, 810, 810, 830, 840,
16         720, 940, 1000, 800, 850, 840,

```

```
17          950, 1000, 790, 840, 850, 800,
18          960, 760, 840, 850, 810, 960,
19          800, 840, 780, 870)
20 qqnorm(data)
```

---

**R code Exa 9.8.B** Normal probability plot of double exponential distribution

```
1 #Page 356
2
3 library(nimble)
4
5 rand = rdexp(500)
6 qqnorm(rand)
```

---

**R code Exa 9.8.C** Gamma probability plot of rainfall distribution

```
1 #Page 357
2
3 rand = rgamma(500,5)
4 qqnorm(rand)
```

---



# Chapter 10

## Summarizing Data

R code Exa 10.2.1.A Chemical properties of beeswax

```
1 #Page 378
2
3 data = c(63.78, 63.45, 63.58, 63.08, 63.40, 64.42,
4         63.27, 63.10,
5         63.34, 63.50, 63.83, 63.63, 63.27, 63.30,
6         63.83, 63.50,
7         63.36, 63.86, 63.34, 63.92, 63.88, 63.36,
8         63.36, 63.51,
9         63.51, 63.84, 64.27, 63.50, 63.56, 63.39,
10        63.78, 63.92,
11        63.92, 63.56, 63.43, 64.21, 64.24, 64.12,
12        63.92, 63.53,
13        63.50, 63.30, 63.86, 63.93, 63.43, 64.40,
14        63.61, 63.03,
15        63.68, 63.13, 63.41, 63.60, 63.13, 63.69,
16        63.05, 62.85,
17        63.31, 63.66, 63.60)
18 empirical = ecdf(data)
19 plot(empirical)
```

---

**R code Exa 10.2.2.A** Study of the lifetimes of guinea pigs infected with varying doses of tubercle bacilli

```
1 #Page 381
2
3 control_life = c(18, 36, 50, 52, 86, 87, 89, 91,
4                  102, 105, 114, 114, 115, 118, 119,
5                  120,
6                  149, 160, 165, 166, 167, 167, 173,
7                  178,
8                  189, 209, 212, 216, 273, 278, 279,
9                  292,
10                 341, 355, 367, 380, 382, 421, 421,
11                 432,
12                 446, 455, 463, 474, 506, 515, 546,
13                 559,
14                 576, 590, 603, 607, 608, 621, 634,
15                 634,
16                 637, 638, 641, 650, 663, 665, 688,
17                 725,
18                 735)
19
20 dose_1 = c(76, 93, 97, 107, 108, 113, 114, 119,
21            136, 137, 138, 139, 152, 154, 154, 160,
22            164, 164, 166, 168, 178, 179, 181, 181,
23            183, 185, 194, 198, 212, 213, 216, 220,
24            225, 225, 244, 253, 256, 259, 265, 268,
25            268, 270, 283, 289, 291, 311, 315, 326,
26            326, 361, 373, 373, 376, 397, 398, 406,
27            452, 466, 592, 598)
28
29 dose_2 = c(72, 72, 78, 83, 85, 99, 99, 110,
30            113, 113, 114, 114, 118, 119, 123, 124,
31            131, 133, 135, 137, 140, 142, 144, 145,
32            154, 156, 157, 162, 162, 164, 165, 167,
```

```

25         171, 176, 177, 181, 182, 187, 192, 196,
26         211, 214, 216, 216, 218, 228, 238, 242,
27         248, 256, 257, 262, 264, 267, 267, 270,
28         286, 303, 309, 324, 326, 334, 335, 358,
29         409, 473, 550)
30
31 dose_3 = c(10, 33, 44, 56, 59, 72, 74, 77,
32           92, 93, 96, 100, 100, 102, 105, 107,
33           107, 108, 108, 108, 109, 112, 113, 115,
34           116, 120, 121, 122, 122, 124, 130, 134,
35           136, 139, 144, 146, 153, 159, 160, 163,
36           163, 168, 171, 172, 176, 183, 195, 196,
37           197, 202, 213, 215, 216, 222, 230, 231,
38           240, 245, 251, 253, 254, 254, 278, 293,
39           327, 342, 347, 361, 402, 432, 458, 555)
40
41 dose_4 = c(43, 45, 53, 56, 56, 57, 58, 66,
42           67, 73, 74, 79, 80, 80, 81, 81,
43           81, 82, 83, 83, 84, 88, 89, 91,
44           91, 92, 92, 97, 99, 99, 100, 100,
45           101, 102, 102, 102, 103, 104, 107, 108,
46           109, 113, 114, 118, 121, 123, 126, 128,
47           137, 138, 139, 144, 145, 147, 156, 162,
48           174, 178, 179, 184, 191, 198, 211, 214,
49           243, 249, 329, 380, 403, 511, 522, 598)
50
51 dose_5 = c(12, 15, 22, 24, 24, 32, 32, 33,
52           34, 38, 38, 43, 44, 48, 52, 53,
53           54, 54, 55, 56, 57, 58, 58, 59,
54           60, 60, 60, 60, 61, 62, 63, 65,
55           65, 67, 68, 70, 70, 72, 73, 75,
56           76, 76, 81, 83, 84, 85, 87, 91,
57           95, 96, 98, 99, 109, 110, 121, 127,
58           129, 131, 143, 146, 146, 175, 175, 211,
59           233, 258, 258, 263, 297, 341, 341, 376)
60
61 emp_fn_c1 = ecdf(control_life)
62 emp_fn_d1 = ecdf(dose_1)

```

```

63 emp_fn_d2 = ecdf(dose_2)
64 emp_fn_d3 = ecdf(dose_3)
65 emp_fn_d4 = ecdf(dose_4)
66 emp_fn_d5 = ecdf(dose_5)
67
68 emp_val_c1 = (emp_fn_c1(control_life))
69 emp_val_d1 = emp_fn_d1(dose_1)
70 emp_val_d2 = emp_fn_d2(dose_2)
71 emp_val_d3 = emp_fn_d3(dose_3)
72 emp_val_d4 = emp_fn_d4(dose_4)
73 emp_val_d5 = emp_fn_d5(dose_5)
74
75 surv_val_c1 = 1 - emp_val_c1
76 surv_val_d1 = 1 - emp_val_d1
77 surv_val_d2 = 1 - emp_val_d2
78 surv_val_d3 = 1 - emp_val_d3
79 surv_val_d4 = 1 - emp_val_d4
80 surv_val_d5 = 1 - emp_val_d5
81
82
83 plot(x = control_life, y =surv_val_c1, type = "l",
      xlim = c(0,800))
84 lines(x = dose_1, y =surv_val_d1, type = "l", xlim =
      c(0,800), lty = 2, add = TRUE)
85 lines(x = dose_2, y =surv_val_d2, type = "l", xlim =
      c(0,800), lty = 3, add = TRUE)
86 lines(x = dose_3, y =surv_val_d3, type = "l", xlim =
      c(0,800), lty = 4, add = TRUE)
87 lines(x = dose_4, y =surv_val_d4, type = "l", xlim =
      c(0,800), lty = 5, add = TRUE)
88 lines(x = dose_5, y =surv_val_d5, type = "l", xlim =
      c(0,800), lty = 6, add = TRUE)

```

---

**R code Exa 10.2.2.B** empirical survival functions of Guinea pig test

```

1 #Page 384
2
3 control_life = c(18, 36, 50, 52, 86, 87, 89, 91,
4                 102, 105, 114, 114, 115, 118, 119,
5                 120,
6                 149, 160, 165, 166, 167, 167, 173,
7                 178,
8                 189, 209, 212, 216, 273, 278, 279,
9                 292,
10                341, 355, 367, 380, 382, 421, 421,
11                432,
12                446, 455, 463, 474, 506, 515, 546,
13                559,
14                576, 590, 603, 607, 608, 621, 634,
15                634,
16                637, 638, 641, 650, 663, 665, 688,
17                725,
18                735)
19
20 dose_1 = c(76, 93, 97, 107, 108, 113, 114, 119,
21           136, 137, 138, 139, 152, 154, 154, 160,
22           164, 164, 166, 168, 178, 179, 181, 181,
23           183, 185, 194, 198, 212, 213, 216, 220,
24           225, 225, 244, 253, 256, 259, 265, 268,
25           268, 270, 283, 289, 291, 311, 315, 326,
26           326, 361, 373, 373, 376, 397, 398, 406,
27           452, 466, 592, 598)
28
29 dose_2 = c(72, 72, 78, 83, 85, 99, 99, 110,
30           113, 113, 114, 114, 118, 119, 123, 124,
31           131, 133, 135, 137, 140, 142, 144, 145,
32           154, 156, 157, 162, 162, 164, 165, 167,
33           171, 176, 177, 181, 182, 187, 192, 196,
34           211, 214, 216, 216, 218, 228, 238, 242,
35           248, 256, 257, 262, 264, 267, 267, 270,
36           286, 303, 309, 324, 326, 334, 335, 358,
37           409, 473, 550)
38
39 dose_3 = c(10, 33, 44, 56, 59, 72, 74, 77,

```

```

32          92, 93, 96, 100, 100, 102, 105, 107,
33          107, 108, 108, 108, 109, 112, 113, 115,
34          116, 120, 121, 122, 122, 124, 130, 134,
35          136, 139, 144, 146, 153, 159, 160, 163,
36          163, 168, 171, 172, 176, 183, 195, 196,
37          197, 202, 213, 215, 216, 222, 230, 231,
38          240, 245, 251, 253, 254, 254, 278, 293,
39          327, 342, 347, 361, 402, 432, 458, 555)
40
41 dose_4 = c(43, 45, 53, 56, 56, 57, 58, 66,
42           67, 73, 74, 79, 80, 80, 81, 81,
43           81, 82, 83, 83, 84, 88, 89, 91,
44           91, 92, 92, 97, 99, 99, 100, 100,
45           101, 102, 102, 102, 103, 104, 107, 108,
46           109, 113, 114, 118, 121, 123, 126, 128,
47           137, 138, 139, 144, 145, 147, 156, 162,
48           174, 178, 179, 184, 191, 198, 211, 214,
49           243, 249, 329, 380, 403, 511, 522, 598)
50
51 dose_5 = c(12, 15, 22, 24, 24, 32, 32, 33,
52           34, 38, 38, 43, 44, 48, 52, 53,
53           54, 54, 55, 56, 57, 58, 58, 59,
54           60, 60, 60, 60, 61, 62, 63, 65,
55           65, 67, 68, 70, 70, 72, 73, 75,
56           76, 76, 81, 83, 84, 85, 87, 91,
57           95, 96, 98, 99, 109, 110, 121, 127,
58           129, 131, 143, 146, 146, 175, 175, 211,
59           233, 258, 258, 263, 297, 341, 341, 376)
60
61 emp_fn_c1 = ecdf(control_life)
62 emp_fn_d1 = ecdf(dose_1)
63 emp_fn_d2 = ecdf(dose_2)
64 emp_fn_d3 = ecdf(dose_3)
65 emp_fn_d4 = ecdf(dose_4)
66 emp_fn_d5 = ecdf(dose_5)
67
68 emp_val_c1 = emp_fn_c1(control_life)
69 emp_val_d1 = emp_fn_d1(dose_1)

```

```

70 emp_val_d2 = emp_fn_d2(dose_2)
71 emp_val_d3 = emp_fn_d3(dose_3)
72 emp_val_d4 = emp_fn_d4(dose_4)
73 emp_val_d5 = emp_fn_d5(dose_5)
74
75 surv_val_c1 = log10(1 - emp_val_c1)
76 surv_val_d1 = log10(1 - emp_val_d1)
77 surv_val_d2 = log10(1 - emp_val_d2)
78 surv_val_d3 = log10(1 - emp_val_d3)
79 surv_val_d4 = log10(1 - emp_val_d4)
80 surv_val_d5 = log10(1 - emp_val_d5)
81
82
83 plot(x = control_life, y =surv_val_c1, type = "l",
      xlim = c(0,800))
84 lines(x = dose_1, y =surv_val_d1, type = "l", xlim =
      c(0,800), lty = 2, add = TRUE)
85 lines(x = dose_2, y =surv_val_d2, type = "l", xlim =
      c(0,800), lty = 3, add = TRUE)
86 lines(x = dose_3, y =surv_val_d3, type = "l", xlim =
      c(0,800), lty = 4, add = TRUE)
87 lines(x = dose_4, y =surv_val_d4, type = "l", xlim =
      c(0,800), lty = 5, add = TRUE)
88 lines(x = dose_5, y =surv_val_d5, type = "l", xlim =
      c(0,800), lty = 6, add = TRUE)

```

---

#### R code Exa 10.4.2.A Cumulative binomial probabilities of Platinum data

```

1 #Page 396
2
3 k = 5:9
4 n = 26
5
6 p_binom = round(pbinom(k,26,0.5),4)
7 data.frame(k,p_binom)

```

```
8
9 r = 8
10
11 P_lessk = round(pbinom(r,26,0.5),4) - round(dbinom(r
    ,26,0.5),4)
12 print(P_lessk)
13
14 i = 19
15 P_great = 1 - round(pbinom(i-1,26,0.5),4)
16 print(P_great)
```

---



# Chapter 11

## Comparing two Samples

R code Exa 11.2.1.A Difference in Latent Heat of Fusion

```
1 #Page 423
2
3 A = c(79.98, 80.04, 80.02, 80.04, 80.03,80.03,
        80.04, 79.97, 80.05, 80.03, 80.02, 80, 80.02)
4 B = c(80.02, 79.94, 79.98, 79.97, 79.97, 80.03,
        79.95, 79.97)
5
6 heat = data.frame(A,B = c(B,rep(NA, length(A)-length
        (B))))
7
8 X_bar_A = round(mean(A),3)
9 X_bar_B = round(mean(B),3)
10
11 sd_A = round(sd(A),3)
12 sd_B = round(sd(B),3)
13
14 cat(X_bar_A, X_bar_B, sd_A, sd_B)
15
16 var_p = ((length(A)-1)*sd_A^2 + (length(B)-1)*sd_B
        ^2)/(length(A) + length(B) - 2)
17 sd_p = round(sqrt(var_p),3)
```

```

18
19 print(sd_p)
20
21 diff = round(X_bar_A - X_bar_B,2)
22 s_diff = round(sd_p*sqrt(1/length(A) + 1/length(B))
    ,3)
23
24 cat(diff, s_diff)
25
26 boxplot(heat, ylim = c(79.94, 80.06))
27
28 t_val = round(abs(qt(0.025, df = length(A) + length(
    B) -2)),3)
29
30 print(t_val)
31
32 cat("CI for mean diff is (", round(diff - t_val*s_
    diff,3), round(diff + t_val*s_diff,3), ")")

```

---

#### R code Exa 11.2.1.B Two sided alternative of mean test of two methods

```

1 #Page 425
2
3 A = c(79.98, 80.04, 80.02, 80.04, 80.03,80.03,
    80.04, 79.97, 80.05, 80.03, 80.02, 80, 80.02)
4 B = c(80.02, 79.94, 79.98, 79.97, 79.97, 80.03,
    79.95, 79.97)
5
6 X_bar_A = round(mean(A),2)
7 X_bar_B = round(mean(B),2)
8 print(X_bar_A)
9
10 sd_A = round(sd(A),3)
11 sd_B = round(sd(B),3)
12

```

```

13 var_p = ((length(A)-1)*sd_A^2 + (length(B)-1)*sd_B
           ^2)/(length(A) + length(B) - 2)
14 sd_p = round(sqrt(var_p),3)
15
16 diff = round(X_bar_A - X_bar_B,2)
17 s_diff = round(sd_p*sqrt(1/length(A) + 1/length(B)),
                 ,3)
18
19 t_stat = round(diff/s_diff,3)
20
21 print(t_stat)
22
23 t_val = abs(qt(0.005, df = length(A) + length(B) -
                2))
24
25 print(t_val)

```

---

#### R code Exa 11.2.1.C Mean test without assumption of equal variance

```

1 #Page 428
2
3 A = c(79.98, 80.04, 80.02, 80.04, 80.03,80.03,
        80.04, 79.97, 80.05, 80.03, 80.02, 80, 80.02)
4 B = c(80.02, 79.94, 79.98, 79.97, 79.97, 80.03,
        79.95, 79.97)
5
6 X_bar_A = round(mean(A),3)
7 X_bar_B = round(mean(B),3)
8
9 n = length(A)
10 m = length(B)
11
12 var_A = round(var(A),5)
13 var_B = round(var(B),5)
14

```

```

15 diff = round(X_bar_A - X_bar_B,2)
16 s_diff = round(sqrt(var_A/n + var_B/m),4)
17
18 t_stat = abs(diff)/sqrt(var_A/n + var_B/m)
19 print(t_stat)
20
21 df = round(((var_A/n) + (var_B/m))^2/(((var_A/n)^2/(
      n-1)) + ((var_B/m)^2/(m-1))),1)
22
23 print(df)
24
25 t_val = qt(0.995, df = df)
26
27 print(t_val)
28
29 # The answer may slightly vary due to rounding off
    values.

```

---

#### R code Exa 11.2.2.A Power vs del plot for iron retention experiment

```

1 #Page 434
2
3 del = 1
4 sd = 5
5
6 z = qnorm(0.1)
7
8 n = round(((1.96 - z)*sd/del)^2 * 2)
9
10 print(n)

```

---

#### R code Exa 11.2.3.A Mann Whitney test of latent heat of fusion

```

1 #Page 437
2
3 A = c(79.98, 80.04, 80.02, 80.04, 80.03,80.03,
        80.04, 79.97, 80.05, 80.03, 80.02, 80, 80.02)
4 B = c(80.02, 79.94, 79.98, 79.97, 79.97, 80.03,
        79.95, 79.97)
5
6 n = length(A)
7 m = length(B)
8
9 rn_A = rank(append(A,B), ties.method = "average")
10 A_rank = rn_A[1:n]
11 B_rank = rn_A[14:21]
12
13 print(list(A_rank, B_rank))
14
15 R = sum(B_rank)
16 R_dash = min(m,n)*(m+n+1) - R
17
18 print(c(R,R_dash))
19
20 R_star = min(R,R_dash)
21
22 print(R_star)

```

---

#### R code Exa 11.2.3.B Normal Distribution of Rank sum method

```

1 #Page 441
2
3 n = 13
4 m = 8
5
6 T = 51
7
8 E_T = min(m,n)*(m+n+1)/2

```

```

9 sigma_T = sqrt(m*n*(m+n+1)/12)
10
11 print(c(E_T, sigma_T))
12
13 t_test = round((T-E_T)/sigma_T,2)
14
15 p_val = round(2*pnorm(t_test),3)
16
17 print(c(t_test,p_val))

```

---

**R code Exa 11.3.1.A** Study of effect of cigarette smoking on platelet aggregation

```

1 #Page 446
2
3 before = c(25,25,27,44,30,67,53,53,52,60,28)
4 after = c(27,29,37,56,46,82,57,80,61,59,43)
5 n = length(before)
6
7 diff = after - before
8
9 print(data.frame(before,after,difference = diff))
10
11 D_bar = mean(diff)
12 sd_D_bar = sqrt(var(diff)/n)
13
14 print(c(D_bar,sd_D))
15
16 t = round(abs(qt(0.05, df = 10)),3)
17
18 cat("CI for D_bar (", round(D_bar - t*sd_D,3), round(
    (D_bar + t*sd_D,3), ")")
19
20 plot(before,after)

```

---

# Chapter 12

## The Analysis of Variance

R code Exa 12.2.1.A F statistic applied to the tablet data

```
1 #Page 483
2
3 I = 7
4 J = 10
5 lab = matrix(c(4.13, 3.86, 4.00, 3.88, 4.02, 4.02,
6               4.00,
7               4.07, 3.85, 4.02, 3.88, 3.95, 3.86,
8               4.02,
9               4.04, 4.08, 4.01, 3.91, 4.02, 3.96,
10              4.03,
11              4.07, 4.11, 4.01, 3.95, 3.89, 3.97,
12              4.04,
13              4.05, 4.08, 4.04, 3.92, 3.91, 4.00,
14              4.10,
15              4.04, 4.01, 3.99, 3.97, 4.01, 3.82,
16              3.81,
17              4.02, 4.02, 4.03, 3.92, 3.89, 3.98,
18              3.91,
19              4.06, 4.04, 3.97, 3.90, 3.89, 3.99,
20              3.96,
21              4.10, 3.97, 3.98, 3.97, 3.99, 4.02,
```

```

14         4.05,
           4.04, 3.95, 3.98, 3.90, 4.00, 3.93,
           4.06), byrow = TRUE, nrow = J, ncol
           = I)

15
16 mean = mean(lab)
17 mean_i = c()
18 ss_w = 0
19 residue = c()
20
21 for(i in 1:7){
22   y_i = mean(lab[,i])
23   mean_i = c(mean_i, y_i)
24   residue = c(residue, lab[,i]-mean_i[i])
25   ss_w = ss_w + sum((lab[,i]-mean_i[i])^2)
26 }
27
28 ss_b = round(10*sum((mean_i - mean)^2),3)
29
30 ss_total = round(sum((lab-mean)^2),3)
31
32 df = c(I-1, I*(J-1), I*J-1)
33 ss = c(ss_b, ss_w, ss_total)
34 ms = round(ss/df,4)
35 f = ss_b/(I-1)/(ss_w/(I*(J-1)))
36
37 var_tab = data.frame(df, ss, ms, f)
38
39 print(var_tab)
40
41 qqnorm(residue,
42         ylab="Ordered Residuals", xlab="Normal
           Quantiles")

```

---

**R code Exa 12.2.2.1.A** Turkey method application to Tablet data



```

1 #Page 486
2
3 library(dplyr)
4 I = 7
5 J = 10
6 lab = matrix(c(4.13, 3.86, 4.00, 3.88, 4.02, 4.02,
7               4.00,
8               4.07, 3.85, 4.02, 3.88, 3.95, 3.86,
9               4.02,
10              4.04, 4.08, 4.01, 3.91, 4.02, 3.96,
11              4.03,
12              4.07, 4.11, 4.01, 3.95, 3.89, 3.97,
13              4.04,
14              4.05, 4.08, 4.04, 3.92, 3.91, 4.00,
15              4.10,
16              4.04, 4.01, 3.99, 3.97, 4.01, 3.82,
17              3.81,
18              4.02, 4.02, 4.03, 3.92, 3.89, 3.98,
19              3.91,
20              4.06, 4.04, 3.97, 3.90, 3.89, 3.99,
21              3.96,
22              4.10, 3.97, 3.98, 3.97, 3.99, 4.02,
23              4.05,
24              4.04, 3.95, 3.98, 3.90, 4.00, 3.93,
25              4.06), byrow = TRUE, nrow = J,
26              ncol = I)
27
28 mean_i = c()
29
30 for(i in 1:7){
31   y_i = mean(lab[,i])
32   mean_i = c(mean_i,y_i)
33 }
34
35 i = 1:7
36 labs_df = data.frame(labs =i, means = mean_i)
37 labs_df = arrange(labs_df, desc(means))
38 print(labs_df)
39

```

```

28 s_err = 0.0037
29 sp = round(sqrt(s_err),3)
30
31 q_val = qtkey(0.95,7,63)
32
33 differ = round(q_val*sp/sqrt(J),3)
34
35 t_val = qt(1-0.025,63)
36 differ_t = round(t_val*sp*sqrt(2/J),3)
37
38 print(c(differ, differ_t))
39
40 #The answer may vary due to rounding off values

```

---

### R code Exa 12.3.3.A An experimental study of drugs

```

1 #Page 501
2
3 I = 7
4 J = 10
5 itch_data = matrix(c(174, 263, 105, 199, 141, 108,
6                       141,
7                       224, 213, 103, 143, 168, 341, 184,
8                       260, 231, 145, 113, 78,159, 125,
9                       255, 291, 103, 225, 164, 135, 227,
10                      165, 168, 144, 176, 127, 239, 194,
11                      237, 121, 94, 144, 114, 136, 155,
12                      191, 137, 35, 87, 96, 140, 121,
13                      100, 102, 133, 120, 222, 134, 129,
14                      115, 89, 83, 100, 165, 185, 79,
15                      189, 433, 237, 173, 168, 188, 317),
16                      byrow = TRUE,ncol = 7)
17
18 itch = data.frame(no_drug = itch_data[,1], placebo =
19                   itch_data[,2], papaverine = itch_data[,3],

```

```

17         nmorphine = itch_data[,4], amino =
           itch_data[,5], pentobarbital =
           itch_data[,6],
18         tripeleennamine = itch_data[,7],
           row.names = c("BG", "JF", "BS", "
                        SI", "BW", "TS", "GM", "SS", "MU", "
                        OS"))
19 boxplot(itch)
20
21 stack_data = stack(itch)
22 stack_data <- cbind(stack_data, subject = rep(
           rownames(itch), ncol(itch)))
23 one.way <- aov(values~ind+subject, data = stack_data
           )
24
25 summary(one.way)
26
27 y = unname(sort(residuals(one.way)))
28 qqnorm(y, pch = 20, xlim = c(-3,3), ylim = c
           (-100,150),
29         xlab = "Normal quantiles", ylab = "Ordered
           Quantiles",
30         main = "")
31
32 df = 54
33 nrange = 7
34 s = 3095
35 qt = qtkey(0.95, nrange, df)
36 error_var = qt*sqrt(s/J)
37 print(error_var)
38
39 # The answer may slightly vary due to rounding off
   values.

```

---

**R code Exa 12.3.4.A** Friedman test on itching data

```

1 #Page 504
2
3 I = 7
4 J = 10
5 itch_data = matrix(c(174, 263, 105, 199, 141, 108,
6                       141,
7                       224, 213, 103, 143, 168, 341, 184,
8                       260, 231, 145, 113, 78,159, 125,
9                       255, 291, 103, 225, 164, 135, 227,
10                      165, 168, 144, 176, 127, 239, 194,
11                      237, 121, 94, 144, 114, 136, 155,
12                      191, 137, 35, 87, 96, 140, 121,
13                      100, 102, 133, 120, 222, 134, 129,
14                      115, 89, 83, 100, 165, 185, 79,
15                      189, 433, 237, 173, 168, 188, 317),
16                      byrow = TRUE,ncol = 7)
17
18 itch_data = data.frame(no_drug = itch_data[,1],
19                        placebo = itch_data[,2], papaverine = itch_data
20                        [,3],
21                        nmorphine = itch_data[,4],
22                        amino = itch_data[,5],
23                        pentobarbital = itch_data
24                        [,6],
25                        tripelennamine = itch_data
26                        [,7], row.names = c("BG", "
27                        JF", "BS", "SI", "BW", "TS", "
28                        GM", "SS", "MU", "OS"))
29
30 rank_df = lapply(as.data.frame(t(itch_data)), rank,
31                  ties.method = "average")
32 rank_df = as.data.frame(rank_df, row.names = names(
33                  itch_data))
34 itch_rank = as.data.frame(t(rank_df))
35 itch_rank = rbind(itch_rank, Average = as.data.
36                  frame(lapply(itch_rank, mean)))
37 print(itch_rank)
38
39

```

```
26 R_bar = mean(unlist(itch_rank[-1,]))
27 R_sum = sum((itch_rank[11,]-R_bar)**2)
28 Q = 12*J*R_sum/(I*(I+1))
29
30 cat(R_bar, R_sum, Q)
```

---

# Chapter 13

## The Analysis of categorical data

R code Exa 13.5.B Cell Phones and Driving

```
1 # Page 526
2
3 table = matrix(data = c(13,24,157,505),nrow = 2,
  dimnames = list(c("On Phone", "Not on Phone"),c("
    On Phone", "Not on Phone")))
4 table = rbind(table, Total = colSums(table))
5 table = cbind(table, Total = rowSums(table))
6
7 table
8
9 X_2 = (table[1,2] - table[2,1])^2/(table[1,2] +
  table[2,1])
10
11 print(X_2)
```

---

# Chapter 14

## Linear Least squares

R code Exa 14.2.2.B Environmental impact study

```
1 # Page 551
2
3 env_table = data.frame(Depth = c(0.34, 0.29, 0.28,
4     0.42, 0.29, 0.41, 0.76, 0.73, 0.46, 0.4),
5     Rate = c(0.636, 0.319, 0.734,
6     1.327, 0.487, 0.924,
7     7.35, 5.89, 1.979, 1.124))
8
9 plot(env_table)
10
11 env_reg = lm(Rate ~ Depth , data = env_table)
12 residue = resid(env_reg)
13
14 plot(env_table$Depth, residue, xlab = "Depth", ylab
15     = "Residuals")
16
17 log_table = log(env_table, base = 10)
18 plot(log_table)
19
20 env_log_reg = lm(Rate ~ Depth, data = log_table)
21 log_residue = resid(env_log_reg)
22 plot(log_table$Depth, log_residue, xlab = "Depth",
```

```
ylab = "Residuals")
```

---

#### R code Exa 14.4.5.B A quadratic model for stream flow data

```
1 # Page 579
2
3 env_table = data.frame(Depth = c(0.34, 0.29, 0.28,
4                                0.42, 0.29, 0.41, 0.76, 0.73, 0.46, 0.4),
5                                Rate = c(0.636, 0.319, 0.734,
6                                         1.327, 0.487, 0.924,
7                                         7.35, 5.89, 1.979, 1.124))
8 env_table$Depth_2 = env_table$Depth**2
9
10 quadratic_model = lm(Rate ~ Depth + Depth_2, data =
11                      env_table)
12 summary(quadratic_model)
13
14 residuals = resid(quadratic_model)
15 plot(env_table$Depth, residuals, xlim = c(0.2,0.8),
16       ylim = c(-0.6,0.4), xlab = "Depth")
17
18 x = matrix(c(rep(1,nrow(env_table))), env_table$Depth
19            , env_table$Depth_2), ncol = 3)
20 y = matrix(env_table$Rate, ncol = 1)
21
22 sum_bb = solve(t(x)%*%x)
23
24 corr_matrix = diag(3)
25
26 for (i in 1:3){
27   for(j in 1:3) if (i != j) corr_matrix[i,j] = sum_
28     bb[i,j]/sqrt(sum_bb[i,i]*sum_bb[j,j])
29 }
30
31 print(round(corr_matrix,2))
```



