

R Textbook Companion for  
Probability and Statistics for Engineering and  
the Sciences  
by Jay L Devore<sup>1</sup>

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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

## Overview and descriptive statistics

**R code Exa 1.1** Branches of statistics

```
1 #Ex1.1 , Page 4
2
3 library(lattice)
4
5 data<-c
6   (6.1,12.6,34.7,1.6,18.8,2.2,3.0,2.2,5.6,3.8,2.2,3.1,1.3,1.1,14.1,
7
8
9 hist(data,main=" Histogram for charity fundraising
  percentage data",xlab="FundRaising",col="grey",
  xlim=c(0,100),ylim=c(0,40))
```

---

**R code Exa 1.5** Collecting data

```

1 #Ex1.5 , Page 11
2
3 Adhesive_Type<-c(1,1,2,2)
4 Conductor_material<-c(1,2,1,2)
5 Observed_bond_strength<-c(82,75,84,78,77,87,80,90)
6 mat1<-matrix(Observed_bond_strength,nrow=4,ncol=2)
7 Average<-c(sum(mat1[1,])/2,sum(mat1[2,])/2,sum(mat1
     [3,])/2,sum(mat1[4,])/2)
8 mat1<-cbind(Adhesive_Type,Conductor_material,mat1,
   Average)
9 colnames(mat1)[3]<-"Observed bond strength"
10 print(mat1)
11
12 n<-length(Adhesive_Type)/2
13 plot(Conductor_material,Average,main="Average bond
      strengths",xlab="Conducting material",ylab="
      Average strength")
14 segments(Conductor_material[1],Average[1],Conductor_
      material[2],Average[2])
15 segments(Conductor_material[3],Average[3],Conductor_
      material[4],Average[4])

```

---

### R code Exa 1.8 Dotplots

```

1 #Ex1.8 , Page 15
2
3 library(graphics)
4
5 data<-c
   (10.8,6.9,8.0,8.8,7.3,3.6,4.1,6.0,4.4,8.3,8.1,8.0,5.9,5.9,7.6,8.9
6
7 #To create a stacked dotplot
8 stripchart(data,method="stack",offset=0.5,pch=20,at
   =0,main="Dotplot of given data")

```

---

### R code Exa 1.9 Histograms

```
1 #Ex1.9 , Page 17
2
3 Hits_per_game<-0:27
4 No_of_games<-c
5   (20,72,209,527,1048,1457,1988,2256,2403,2256,1967,1509,1230,834,56
6
5 sum1<-sum(No_of_games)
6 Relative_frequency<-round(No_of_games/sum1,digits=4)
7 df1<-data.frame(Hits_per_game,No_of_games,Relative_
8   frequency)
8 print(df1)
9
10 #Proportion of games with atmost 2 hits
11 f1<-0
12 for(i in Hits_per_game){
13   if(i<=2){
14     f1<-f1+df1[i+1,3]
15   }
16 }
17 print(paste("Proportion of games with atmost two
18   hits:",f1))
19 #Proportion of games with between 5 and 10 hits
20 f2<-0
21 for(j in Hits_per_game){
22   if(j>=5 && j<=10){
23     f2<-f2+df1[j+1,3]
24   }
25 }
26 print(paste("Proportion of games with between 5 and
27   10 hits:",f2))
```

```
28 par(mfrow=c(1,2))
29 plot(Hits_per_game, Relative_frequency, type="h", xlim=
      c(0,20), main="Histogram of hits/game")
30 barplot(Relative_frequency, width=1, space=0, xlim=c
      (0,25), main="Histogram of hits/game", xlab="Hits/
      game", ylab="Relative frequency")
```

---

### R code Exa 1.10 Histograms

```
1 #Ex1.10, Page 18
2 #Answers may vary since different class intervals
   have been taken
3
4 #Please install and load the following packages: 1)
   HistogramTools 2) ash
5 library(HistogramTools)
6 library(ash)
7
8 data<-c
   (2.97,4.00,5.20,5.56,5.94,5.98,6.35,6.62,6.72,6.78,6.80,6.85,6.94
9
10 #Class intervals can also be created using
    classIntervals() from ClassInt library:
11 #classIntervals(data, style="pretty", intervalClosure
    ="left") which creates different intervals as
    compared to those of textbook
12
13 #To create class intervals
14 ci<-seq(1,19,2)
15
16 freq<-table(cut(data,ci,right=FALSE))
17 rel_freq<-freq/length(data)
18 print(cbind(freq,rel_freq))
19
```

```
20 #To display histogram
21 PlotRelativeFrequency(hist(data, breaks = ci, right=
    FALSE, plot=FALSE), xlab="BTUIN", main=" Histogram of
    energy consumption data", ylim=c(0,0.30))
```

---

### R code Exa 1.11 Histograms

```
1 #Ex1.11 , Page 20
2
3 data<-c
    (11.5,12.1,9.9,9.3,7.8,6.2,6.6,7.0,13.4,17.1,9.3,5.6,5.7,5.4,5.2,
4 #Unequal class widths
5 ci<-c(2,4,6,8,12,20,30)
6
7 #To find frequency , relative frequency and density
    of data manually
8 freq<-table(cut(data,ci,right=FALSE))
9 rel_freq<-freq/length(data)
10 density<-rel_freq/diff(ci)
11
12 print(cbind(freq,rel_freq,density))
13
14 #To create histogram of the bond strength data
15 hist(data,breaks=ci,freq=FALSE,right=FALSE,main="
    Histogram for bond strength data",xlab="Bond
    Strength")
```

---

### R code Exa 1.13 Qualitative data

```
1 #Ex1.13 , Page 23
2 #Answers may vary slightly due to rounding off of
    values
```

```

3
4 Rating<-c("A","B","C","D","F","Don't know")
5 Frequency<-c(478,893,680,178,100,172)
6 Relative_frequency<-Frequency/sum(Frequency)
7 df1<-data.frame(Rating,Frequency,Relative_frequency)
8 print(df1)
9
10 print(paste("Total frequency:",sum(Frequency)))
11 print(paste("Total relative frequency:",sum(Relative
    _frequency)))
12
13 barplot(df1$Relative_frequency,space=1,names.arg=df1
    $Rating,ylim=c(0,0.4),xlab="Rating",ylab="
        Relative Frequency",main="Chart of relative
        frequency vs. rating")

```

---

### R code Exa 1.14 Mean

```

1 #Ex1.14, Page 29
2 #Steam and leaf plot differs since number of stem
    parts=1
3
4 library(aplpack)
5
6 x<-c
    (16.1,9.6,24.9,20.4,12.7,21.2,30.2,25.8,18.5,10.3,25.3,14.0,27.1,
    7
    8 sl<-stem.leaf(x,unit=0.1,m=1,style="bare")
    9
    10 s<-sum(x)
    11 mean<-s/length(x)
    12 print(paste("Mean value:",mean))
    13 print(paste("The value",sl$upper,"is an outlier"))
    14 print(paste("Mean value when",sl$upper,"is excluded="))

```

```
” ,(s-45)/(length(x)-1)))
```

---

### R code Exa 1.15 Median

```
1 #Ex1.15 , Page 30
2 #Answers may vary slightly due to rounding off of
   values
3
4 data<-c
   (62.3,62.8,63.6,65.2,65.7,66.4,67.4,68.4,68.8,70.8,75.7,79.0)

5
6 dotplot(data,xlab="Duration")
7
8 n<-length(data)
9 n1<-data[n/2]
10 n2<-data[(n/2)+1]
11 med<-(n1+n2)/2
12 print(paste("Median:",med))
13
14 max<-max(data)
15 #If maximum value is omitted
16 data1<-data[1:length(data)-1]
17 mean1<-mean(data1)
18 print(paste("Mean when maximum value ,",max,"is
   omitted:",mean1))
```

---

### R code Exa 1.17 Measures of variability for sample data

```
1 #Ex1.17 , Page 36
2
3 Car<-1:11
```

```
4 xi<-c  
  (27.3,27.9,32.9,35.2,44.9,39.9,30.0,29.7,28.5,32.0,37.6)  
  
5  
6 xibar<-mean(xi)  
7 s<-sd(xi)  
8  
9 print(paste("The size of the representative  
  deviation from the mean," ,round(xibar,digits=2) ,"  
  is roughly" ,round(s,digits=2) , "mpg"))
```

---

### R code Exa 1.18 Measures of variability

```
1 #Ex1.18 , Page 38  
2 #Answers may vary slightly due to rounding off of  
  values  
3  
4 data<-c  
  (154,142,137,133,122,126,135,135,108,120,127,134,122)  
  
5  
6 print(paste(" s :" ,sd(data)))
```

---

### R code Exa 1.19 Boxplots

```
1 #Ex1.19 , Page 40  
2  
3 obs<-c  
  (40,52,55,60,70,75,85,85,90,90,92,94,94,95,98,100,115,125,  
125)  
4  
5 #To find five-number summary  
6 print(summary(fivenum(obs)))
```

```
7  
8 boxplot(obs, horizontal=TRUE, xlab="Depth", main="  
Boxplot of the corrosion data")
```

---

**R code Exa 1.20** Box plots that show outliers

```
1 #Ex1.20 , Page 41  
2  
3 data<-c  
      (9.69,13.16,17.09,18.12,23.70,24.07,24.29,26.43,30.75,31.54,35.07  
6  
7  
8 c<-seq(0,1600,by=200)  
9  
10 boxplot(data, horizontal=TRUE, xlab="Daily nitrogen  
load", main="Boxplot of daily nitrogen load data  
showing mild and extreme outliers")
```

---

# Chapter 2

## Probability

**R code Exa 2.8** Relations from set theory

```
1 #Ex2.8 , Page 53
2
3 A<-c(0,1,2,3,4)
4 B<-c(3,4,5,6)
5 C<-c(1,3,5)
6 U<-union(A,B)
7
8 cat("A' =", setdiff(U,A), "\n")
9 cat("A ∪ B =", union(A,B), "\n")
10 cat("A ∪ C =", union(A,C), "\n")
11 cat("A ∩ B =", intersect(A,B), "\n")
12 cat("A ∩ C =", intersect(A,C), "\n")
13 cat("(A ∩ C)' =", setdiff(U, intersect(A,C)))
```

---

**R code Exa 2.11** Properties of probability

```
1 #Ex2.11 , Page 56
2
```

```
3 #S={U,D}
4
5 p<-seq(0,1,by=0.25)
6
7 for(i in p){
8   pu<-i
9   pd<-1-i
10  cat("P(U) : ",pu,"\\n")
11  cat("P(D) : ",pd,"\\n\\n")
12 }
13 cat("p value can represent any fixed value between 0
and 1")
```

---

### R code Exa 2.13 Properties of probability

```
1 #Ex2.13 , Page 59
2 #Answers may vary slightly due to rounding off of
values
3
4 #For A to occur , at least one of the individual
components must fail
5 #To find P(A')=SSSSS
6 p<-90/100
7 pa_dash<-p^5
8 cat("P(A') : ",pa_dash,"\\n")
9
10 pa<-1-pa_dash
11 cat("P(A) : ",1-pa_dash,"\\n\\n")
12 cat("Roughly",round(pa*100,digits=0),"% of the
systems will fail")
```

---

### R code Exa 2.14 Properties of probability

```

1 #Ex2.14 , Page 60
2
3 #P(A)=>probability that a household gets internet
   service
4 pa<-60/100
5
6 #P(B)=>probability that a household gets TV service
7 pb<-80/100
8
9 #P(A n B)=>probability that a household gets both
   services
10 pab<-50/100
11
12 #To find probability that a household gets at least
   one of the services
13 p1<-pa+pb-pab
14 cat("P(at least one service)=P(A U B) =",p1,"\\n")
15
16 pa_b<-p1-pa
17 pb_a<-p1-pb
18 #To find probability that a household gets exactly
   one service
19 p2<-pa_b+pb_a
20 cat("P(exactly one service)=",p2)

```

---

### R code Exa 2.19 Product rule

```

1 #Ex2.19 , Page 67
2
3 #No of appliance dealers
4 n1<-5
5
6 #No of plumbing contractors
7 n2<-12
8

```

```
9 #No of electrical contractors
10 n3<-9
11
12 cat("There are",n1*n2*n3,"ways to first choose an
      appliance dealer , then a plumbing contractor and
      finally an electrical contractor")
```

---

### R code Exa 2.21 Permutations and combinations

```
1 #Ex2.21 , Page 68
2
3 #No of teaching assistants
4 n<-10
5 #No of questions in the first exam
6 k<-4
7
8 #To find number of permutations
9 p<-factorial(n)/factorial(n-k)
10 cat("The professor could give",p,"different four-
      question exam papers without using the same
      graders")
```

---

### R code Exa 2.22 Permutations and combinations

```
1 #Ex2.22 , Page 69
2 #Answers may vary slightly due to rounding off of
   values
3
4 #Total no of songs
5 n<-100
6
7 #No of songs by the Beatles
8 m<-10
```

```

9
10 #Probability that the 1st Beatles song heard is the
11   5th song played
12 t<-5
13 p1<-(factorial(n-m)/factorial(n-m-(t-1))*m/(
14   factorial(n)/factorial(n-t)))
15 cat("P(1st B is 5th song played):",p1,"\\n")
16
17 #Probability that the 1st Beatles song heard is the
18   1st ,2nd ,3rd ,4th or 5th song played
19 p2<-0
20 for(i in 1:5){
21   p2<-p2+choose(n-i,m-1)/(choose(n,m))
22 }
23 cat("P(1st B is 1st ,2nd ,3rd ,4th or 5th song played):
24   ",p2,"\\n")

```

---

### R code Exa 2.23 Permutations and combinations

```

1 #Ex2.23 , Page 70
2 #Answers may vary slightly due to rounding off of
3   values
4
5 #Total no of printers
6 n<-25
7 l<-10
8 i<-15
9
10 #Probability that 6 random printers selected will
11   have 3 laser printers
12 r1<-6
13 r<-3
14 ND3<-choose(l,r)*choose(i,r)/choose(n,r1)
15 cat("P(3 laser printers are selected among the 6
16   selected):",ND3,"\\n")

```

```

14
15
16 #To find the probability that at least 3 inkjet
   printers are selected
17 prob<-0
18 for(j in 3:6){
19   num<-choose(i,j)*choose(l,r1-j)
20   denom<-choose(n,r1)
21   prob<-prob+(num/denom)
22 }
23 cat("P(at least 3 inkjet printers are selected):",
      prob,"\\n")

```

---

### R code Exa 2.25 Conditional probability

```

1 #Ex2.25 , Page 74
2
3 #Probability that memory card is purchased
4 pa<-0.6
5
6 #Probability that battery is purchased
7 pb<-0.4
8
9 #Probability that both memory card and battery is
   purchased
10 pab<-0.3
11
12 #Probability that an optional card was purchased
   given that individuals purchased extra battery
13 pa_b<-pab/pb
14 cat("P(A|B)=",pa_b,"\\n")
15 cat("Of all individuals who purchased an extra
   battery ,",pa_b*100,"% purchased an optional
   memory card\\n")
16

```

```

17 #Probability that an additional battery was
    purchased given that individuals purchased an
    optional memory card
18 pb_a<-pab/pa
19 cat("P(B|A)=",pb_a,"\\n")
20
21 if(pa_b!=pb_a)  print(paste("P(A|B) is not equal to
    P(B|A)"))

```

---

### R code Exa 2.26 Conditional probability

```

1 #Ex2.26 , Page 75
2 #Answers may vary slightly due to rounding off of
    values
3
4 #Package to be installed: VennDiagram
5 library(VennDiagram)
6
7 #A=>Arts , B=>Books , C=>Cinema
8 pa<-0.14
9 pb<-0.23
10 pc<-0.37
11 pab<-0.08
12 pbc<-0.13
13 pac<-0.09
14 pabc<-0.05
15
16 #To illustrate the Venn diagram using the given
    probabilities
17 draw.triple.venn(area1=pa,area2=pb,area3=pc,n12=pab,
    n23=pbc,n13=pac,n123=pabc,category=c("Arts",""
    "Books","Cinema"))
18
19 cat("With the help of Venn diagram:\\n")
20 #P(A|B)

```

```

21 pa_b<-pab/pb
22 print(paste("P(A|B)=",pa_b))
23
24 #P(A|B U C)
25 pa_bUc<-(pab+pac-pabc)/(pb+pc-pbc)
26 print(paste("P(A|B U C)=",pa_bUc))
27
28 #P(A| reads at least once)=P(A|A U B U C)
29 pa_aUbUc<-pa/(pa+pb+pc-pab-pac-pbc+pabc)
30 print(paste("P(A| reads at least once)=",pa_aUbUc))
31
32 #P(A U B|C)
33 paUb_c<-(pac+pbc-pabc)/pc
34 print(paste("P(A U B|C)=",paUb_c))

```

---

### R code Exa 2.30 Bayes Theorem

```

1 #Ex2.30 , Page 78
2
3 # % of messages which come into account 1
4 pa1<-70/100
5
6 # % of messages which come into account 2
7 pa2<-20/100
8
9 # % of messages which come into account 3
10 pa3<-10/100
11
12 # % of messages which are spam in account 1
13 pb_a1<-1/100
14
15 # % of messages which are spam in account 2
16 pb_a2<-2/100
17
18 # % of messages which are spam in account 3

```

```
19 pb_a3<-5/100
20
21 #To find the probability that a randomly selected
   message is spam
22 #Using law of total probability
23 pb<-pa1*pb_a1+pa2*pb_a2+pa3*pb_a3
24 print(paste("P(Randomly selected message is spam):",
   pb,"and thus,",pb*100,"% messages will be spam"))
```

---

### R code Exa 2.36 Independence of more than two events

```
1 #Ex2.36 , Page 85
2 #Answers may vary slightly due to rounding off of
   values
3
4 pai<-rep(0.9,times=6)
5
6 #To find probability that system lifetime exceeds t0
7 prob1<-pai[1]*pai[2]*pai[3]+pai[4]*pai[5]*pai[6]-
   prod(pai))
8 print(paste("P(system lifetime exceeds t0):",prob1))
9
10 #To find probability that system lifetime is at
    least t0
11 prob2<-(1-(1-pai[1])*(1-pai[2]))^3
12 print(paste("P(system lifetime is at least t0):",
   prob2))
```

---

# Chapter 3

## Discrete random variables and probability distributions

**R code Exa 3.7** Probability distributions for discrete random variables

```
1 #Example 3.7, Page 97
2 #Storing all probabilities in an array
3 prob<-c(0.05,0.1,0.15,0.25,0.20,0.15,0.10)
4 P<-array(c(prob),dim=c(1,7,1))
5
6 #P(X<=2)=P(X=0)+P(X=1)+P(X=2)
7 p1<-P[1,1,1]+P[1,2,1]+P[1,3,1]
8 print(paste("P(X<=2) =",p1))
9
10 #P(X>=3)=1-P(X<=2)
11 p2<-1-(P[1,1,1]+P[1,2,1]+P[1,3,1])
12 print(paste("P(X>=3) =",p2))
13
14 #P(2<=X<=5)=P(X=2,3,4 or 5)
15 p3<-P[1,3,1]+P[1,4,1]+P[1,5,1]+P[1,6,1]
16 print(paste("P(2<=X<=5) =",p3))
17
18 #P(2<X<5)=P(X=3,4)
19 p4<-P[1,4,1]+P[1,5,1]
```

```
20 print(paste("P(2<X<5) =", p4))
```

---

### R code Exa 3.8 Probability distributions for discrete random variables

```
1 #Example 3.8, Page 97
2 #The answers may slightly vary due to rounding off
   of values
3 p1<-c(1,0,2,2,3,0,4,1,5,2,6,0)
4 row.names<-c("Lot","Number of defectives")
5 column.names<-c("", "", "", "", "", "", "")
6 matrix.names<-c("Number of defectives in each lot")
7 p<-array(c(p1),dim=c(2,6,1),dimnames=list(row.names,
   column.names,matrix.names))
8 print(p)
9 #p(0)=P(X=0)
10 c<-0
11 for(i in 1:6) {
12   d<-p[2,i,1]
13   if(d==0){
14     c<-c+1
15   }
16 }
17 d<-c/6
18 print(paste("p(0)=",d))
19
20 #p(1)=P(X=1)
21 c<-0
22 for(i in 1:6){
23   d<-p[2,i,1]
24   if(d==1){
25     c<-c+1
26   }
27 }
28 d<-c/6
29 print(paste("p(1)=",d))
```

```

30
31 #p(2)=P(X=2)
32 c<-0
33 for(i in 1:6){
34   d<-p[2,i,1]
35   if(d==2){
36     c<-c+1
37   }
38 }
39 d<-c/6
40 print(paste("p(2)=",d))

```

---

### R code Exa 3.9 Probability distributions for discrete random variables

```

1 #Ex3.9, Page 98
2 #X=0 if customer purchases laptop computer
3 #X=1 if customer purchases desktop computer
4 #p(0)
5 p0<-80/100
6 print(paste("Probability that next customer
    purchases laptop model:",p0))
7 p1<-20/100
8 print(paste("Probability that next customer
    purchases desktop model:",p1))
9 p1<-c(0.8,0.2,0)
10 row.names<-c("if x=0","if x=1","if (x!=0 or 1)")
11 column.names<-c("")
12 matrix.names<-c("p(x)")
13 p<-array(c(p1),dim=c(3,1,1),dimnames=list(row.names,
    column.names,matrix.names))
14 print(p)
15 a<- 1
16 p<- dbinom(a, size = 1, prob = 0.2)
17 plot(1, p, type = 'h', xlab = 'x', ylab = 'p(x)')

```

---

## R code Exa 3.10 Probability distributions for discrete random variables

```
1 #Ex3.10 , Page 98
2 #Let Y=>O+ blood type and N=>Other blood types
3 p1<-c('a', 'Y', 'b', 'Y', 'c', 'N', 'd', 'N', 'e', 'N')
4 row.names<-c("Blood donors", "O+ blood donors")
5 column.names<-c("", "", "", "", "")
6 matrix.names<-c("Blood donation table")
7 p<-array(c(p1), dim=c(2,5,1), dimnames=list(row.names,
     column.names, matrix.names))
8 print(p)
9 #p(1)=P(X=1)
10 c<-0
11 for(i in 1:5) {
12   d<-p[2,i,1]
13   if(d=="Y"){
14     c<-c+1
15   }
16 }
17 d1<-c/5
18 print(paste("p(1)=", d1))
19
20 #p(2)=P(X=2)
21 g<-0
22 e<-0
23 for(i in 1:5) {
24   h<-p[2,i,1]
25   if(h=="Y"){
26     g<-g+1
27   }
28   else{
29     e<-e+1
30   }
31 }
```

```

32 h<-g/5
33 f<-e/4
34 d2<-h*f
35 print(paste("p(2)=",d2))
36
37 #p(3)=P(X=3)
38 d3<-(e/5)*((e-1)/4)*(c/3)
39 print(paste("p(3)=",d3))
40
41 #p(4)=P(X=4)
42 d4<-(e/5)*((e-1)/4)*((e-2)/3)
43 print(paste("p(4)=",d4))
44
45 p2<-c(1,d1,2,d2,3,d3,4,d4)
46 row.names<-c("y","p(y)")
47 column.names<-c("","","","","","")
48 matrix.names<-c("PMF")
49 q<-array(c(p2),dim=c(2,4,1),dimnames=list(row.names,
      column.names,matrix.names))
50 print(q)
51
52 py<- 1:4
53 y<- c(0.4,0.3,0.2,0.1)
54 plot(py,y,type="h",main="Line graph for pmf",xlab="y",
      ylab="p(y)")
```

---

### R code Exa 3.13 Cumulative distribution function

```

1 #Ex3.13 , Page 101
2
3 y<-c(1,2,4,8,16)
4 p<-c(0.05,0.1,0.35,0.4,0.1)
5
6 #F(1)=P(Y<=1)=p(1)
7 print(paste("F(1)=",cumsum(p[1])))
```

```

8
9 #F(2)=P(Y<=2)=p(2)
10 print(paste("F(2)=", max(cumsum(p[1:2]))))
11
12 #F(4)=P(Y<=4)=p(4)
13 print(paste("F(4)=", max(cumsum(p[1:3]))))
14
15 #F(8)=P(Y<=8)=p(8)
16 print(paste("F(8)=", max(cumsum(p[1:4]))))
17
18 #F(16)=P(X<=16)=p(16)
19 print(paste("F(16)=", max(cumsum(p[1:5]))))

```

---

**R code Exa 3.15** Cumulative distribution function of discrete random variable

```

1 #Ex3.15 , Page 104
2 a<-c(0,0.58,1,0.72,2,0.76,3,0.81,4,0.88,5,0.94)
3 row.names<-c("X","F(X)")
4 column.names<-c("","","","","","","","","")
5 matrix.names<-c("Number of days of sick leave taken
by a randomly selected employee")
6 b<-array(c(a),dim=c(2,6,1),dimnames=list(row.names,
column.names,matrix.names))
7 print(b)
8
9 #P(2<=X<=5)=P(X=2,3,4,5)
10 p<-b[2,6,1]-b[2,2,1]
11 print(paste("P(2<=X<=5)=",p))
12
13 #P(X=3)
14 q<-b[2,4,1]-b[2,3,1]
15 print(paste("P(X=3)=",q))

```

---

**R code Exa 3.16** Expected value of X

```
1 #Ex3.16 , Page 107
2
3 x<-1:7
4 w<-c(0.01,0.03,0.13,0.25,0.39,0.17,0.02)
5
6 #Mean , m=sum of(xp(x))
7 m<-weighted.mean(x,w)
8 print(paste("Population mean =",m))
```

---

**R code Exa 3.17** Expected value of X

```
1 #Ex3.17 , Page 107
2
3 x<-0:10
4 w<-c
      (0.002,0.001,0.002,0.005,0.02,0.04,0.18,0.37,0.25,0.12,0.01)

5
6 #Mean , m= sum of(xp(x))
7 m<-weighted.mean(x,w)
8 print(paste("Population mean , E(X) =",m))
```

---

**R code Exa 3.23** Expected value of a function

```
1 #Ex3.23 , Page 110
2
3 comp<-c(0,0.1,1,0.2,2,0.3,3,0.4)
```

```

4 row.names<-c("X","p(X)")
5 column.names<-c("", "", "", "")
6 matrix.names<-c("X->Number of computers sold")
7 p<-array(c(comp),dim=c(2,4,1),dimnames=list(row.
      names,column.names,matrix.names))
8 print(p)
9
10 x<-0:3
11 w<-c(0.1,0.2,0.3,0.4)
12 #h(x)<- profit associated with selling x units<-
    revenue-cost<-800x-900
13 print(paste("Expected profit :$",weighted.mean(800*x
    -900,w)))

```

---

### R code Exa 3.24 The variance of X

```

1 #Ex3.24 , Page 111
2 #Answers may slightly vary due to rounding off of
  values
3
4 w<-c(0.3,0.25,0.15,0.05,0.1,0.15)
5 x<-c(1,2,3,4,5,6)
6
7 #Mean, m= sum of xp(x)
8 m<-weighted.mean(x,w)
9 print(paste("Mean =",m))
10
11 #Variance, v= sum of (x-m)p(x)
12 v<-weighted.mean((x-m)^2,w)
13 print(paste("Variance =",v))
14
15 #Standard deviation, sd= square root(variance)
16 print(paste("Standard deviation=", sqrt(v)))

```

---

**R code Exa 3.25** The variance of X

```
1 #Ex3.25 , Page 112
2
3 #Alternative formula for variance , v= E(X^2) - (m^2)
4 x<-1:6
5 w<-c(0.3,0.25,0.15,0.05,0.1,0.15)
6
7 #E(X^2)= sum of (X^2)p(X)
8 e<-weighted.mean(x^2,w)
9 print(paste("E(X^2)=" ,e))
10
11 #Variance
12 mean<-weighted.mean(x,w)
13 print(paste("Variance through alternative formula =" ,
,e-(mean^2)))
```

---

**R code Exa 3.26** Rules of variance

```
1 #Ex3.26 , Page 113
2
3 x<-0:3
4 w<-c(0.1,0.2,0.3,0.4)
5
6 #Mean , m = sum of (xp(x))
7 m<-weighted.mean(x,w)
8 print(paste("Mean , E(X)=" ,m))
9
10 #To find E(X^2)
11 e<-weighted.mean(x^2,w)
12 print(paste("E(X^2)=" ,e))
13
```

```

14 #To find V(X)
15 v<-e-(m^2)
16 print(paste("V(X)=",v))
17
18 #Profit function , h(X)=800X-900
19 #Variance
20 print(paste("Variance=", (800^2)*v))
21
22 #Standard deviation
23 print(paste("Standard deviation =",sqrt((800^2)*v)))

```

---

### R code Exa 3.29 Binomial experiment

```

1 #Ex3.29 , Page 115
2 #Number of licensed restaurants
3 n<-50
4 #Number of restaurants having at least one serious
   health code violation
5 f<-15
6 #Number of restaurants having no serious health code
   violations
7 s<-35
8 #P(s on first trial)
9 p1<-s/n;
10 print(paste("P(s on first trial)=",p1))
11
12 #P(s on second trial)=P(ss)+P(fs)
13 p2<-(s/n)*((s-1)/(n-1))+(f/n)*(s/(n-1))
14 print(paste("P(s on second trial)=",p2))
15 print(paste("Similarly , P(s on ith trial) = 0.7
   for i=3,4,5"))
16
17 #P(s on fifth trial | ssss)
18 p3<-(s-4)/(n-4)
19 print(paste("P(s on fifth trial | ssss)=",p3))

```

```
20
21 #P(s on fifth trial | ffff)
22 p4<-s/(n-4)
23 print(paste("P(s on fifth trial | ffff)=",p4))
```

---

### R code Exa 3.30 Binomial experiment

```
1 #Ex3.30 , Page 116
2 #Number of licensed drivers
3 n<-500000
4 #Number of licensed drivers who are insured
5 s<-400000
6 #P(s on second trial after s on first trial)
7 p1<-(s-1)/(n-1)
8 print(paste("P(s on 2|s on 1)=",p1))
9
10 #P(s on tenth trial after s on ninth trial)
11 p2<-(s-9)/(n-9)
12 print(paste("P(s on 10|s on 9)=",p2))
13
14 print(paste("The experiment is binomial with n=10
   and p=0.8"))
```

---

### R code Exa 3.31 Binomial random variable and distribution

```
1 #Ex3.31 , Page 118
2 #Answers may slightly vary due to rounding off of
   values
3
4 #n=6, p=0.5
5
6 #P(X=3)
7 print(paste("P(X=3)=",dbinom(3,size=6,prob=0.5)))
```

```
8
9 #Probability that at least 3 three prefer S is
10 print(paste("P(X>=3)=", pbinom(3, size=6, prob=0.5)))
11
12 #Probability that at most one prefers S is
13 print(paste("P(X<=1)=", pbinom(1, size=6, prob=0.5)))
```

---

### R code Exa 3.32.1 Cumulative distribution function

```
1 #Example 3.32.1, Page 118
2 #Binomial distribution: n=15, p=2
3 #The answers may slightly vary due to rounding off
   of values
4
5 #Probability that at most 8 copies fail the test
6 #P(X<=8)
7 a=pbinom(8, size=15, prob=0.2)
8 print(paste("The probability that at most 8 copies
   fail the test is", a))
```

---

### R code Exa 3.32.2 Using binomial tables

```
1 #Example 3.32.2, Page 118
2 #Binomial distribution: n=15, p=0.2
3 #The answers may slightly vary due to rounding off
   of values
4
5 #Probability that exactly 8 copies fail
6 #P(X=8)=P(X<=8)-P(X<=7)
7 a<-0.999
8 b=pbinom(7, size=15, prob=0.2)
9 print(paste("The probability that exactly 8 copies
   fail the test", a-b))
```

---

### R code Exa 3.32.3 Using binomial tables

```
1 #Example 3.32.3 , Page 119
2 #Binomial distribution: n=15, p=0.2
3 #The answers may slightly vary due to rounding off
   of values
4
5 #Probability that at least 8 copies fail
6 #P(X>=8)=1-P(X<=7)
7 b<-0.996
8 c=1-b
9 print(paste("The probability that at least 8 copies
   fail", c))
```

---

### R code Exa 3.32.4 Using binomial tables

```
1 #Example 3.32.4 , Page 119
2 #Binomial distribution: n=15, p=0.2
3 #The answers may slightly vary due to rounding off
   of values
4
5 #Probability that between 4 to 7 copies fail
6 #P(4<=X<=7)=P(X=4)+P(X=5)+P(X=6)+P(X=7)
7 d=pbinom(7,15,0.2)-pbinom(3,15,0.2)
8 print(paste("The probability that between 4 to 7
   copies fail is", d))
```

---

### R code Exa 3.33 Using binomial tables

```

1 #Ex3.33 , Page 119
2 #Answers may vary slightly due to rounding off of
   values
3
4 #n=20
5 #P(X>=5) when p=0.10
6 p1<-1-pbinom(4,size=20,prob=0.1)
7 print(paste("P(X>=5 when p=.1)=" ,p1))
8
9 #P(X<=4) when p=0.2
10 p2<-pbinom(4,size=20,prob=0.2)
11 print(paste("P(X<=4 when p=.2)=" ,p2))

```

---

### R code Exa 3.34 Mean and variance of X

```

1 #Ex3.34 , Page 120
2 n<-10
3 p<-0.75
4
5 #Mean , E(x)=np
6 e<-n*p
7 print(paste("Mean=" ,e))
8
9 #Variance , V(X)=npq
10 v<-n*p*(1-p)
11 print(paste("Variance=" ,v))
12
13 #Standard deviation=sqrt(V(X))
14 s<-sqrt(v)
15 print(paste("Standard deviation=" ,s))
16
17 #P(X= 7 or 8 )=P(X=7)+P(X=8)
18 prob1=dbinom(0:7,size=10,prob=0.75)
19 prob2=dbinom(0:8,size=10,prob=0.75)
20 c<-max(prob1)+max(prob2)

```

```
21 print(paste("P(X= 7 or 8)=", c))
```

---

### R code Exa 3.35 Hypergeometric distribution

```
1 #Ex3.35 , Page 123
2 #Answers may slightly vary due to rounding off of
  values
3
4 N<-20
5 n<-5
6 M<-12
7
8 #P(X=2)=h(2,5,12,20)
9 x<-2
10 h<-(choose(M,x)*choose(N-M,n-x))/choose(N,n)
11 print(paste("h(2;5,12,20)=" ,h))
```

---

### R code Exa 3.36 Hypergeometric distribution

```
1 #Ex3.36 , Page 124
2 #Answers may slightly vary due to rounding off of
  values
3
4 N<-25
5 n<-10
6 M<-5
7
8 #P(X=2)=h(2,10,5,25)
9 x<-2
10 h1<-(choose(M,X)*choose(N-M,n-x))/choose(N,n)
11 print(paste("P(X=2)=" ,h1))
12
13 #P(X<=2)=P(X=0)+P(X=1)+P(X=2)
```

```

14 s<-0
15 for(i in 0:2){
16   h2<-(choose(M,i)*choose(N-M,n-i))/choose(N,n)
17   s<-s+h2
18 }
19 print(paste("P(X<=2)=",s))

```

---

**R code Exa 3.37** Mean and variance of hypergeometric distribution

```

1 #Ex3.37 , Page 125
2
3 n<-10
4 M<-5
5 N<-25
6 p<-M/N
7
8 #E(X)=np
9 e<-n*p
10 print(paste("Mean=",e))
11
12 #V(X)=npq
13 v<-n*p*(1-p)
14 print(paste("Variance without replacement=",v))
15
16 #Estimate of N when M=5, n=10 and x=16
17 M<-100
18 n<-40
19 x<-16
20 ne<-(M*n)/x
21 print(paste("Estimate is", ne))

```

---

**R code Exa 3.38** Negative binomial distribution

```
1 #Ex3.38 , Page 126
2 #Answers may slightly vary due to rounding off of
   values
3
4 #P(X=10)=nb(10;5,0.2)
5 prob1=dnbinom(0:10,size=5,prob=0.2)
6 print(paste("P(X=10)=",max(prob1)))
7
8 #P(X<=10)
9 s<-pnbinom(0:10,size=5,prob=0.2)
10 print(paste("P(X<=10)=",max(s)))
```

---

### R code Exa 3.39 Poisson probability distribution

```
1 #Ex3.39 , Page 129
2 #Answers may slightly vary due to rounding off of
   values
3
4 u<-4.5
5 #Poisson distribution
6 #P(X=5)
7 p1<-dpois(5,lambda=u)
8 print(paste("P(X=5)=",p1))
9
10 #P(X<=5)
11 p2<-ppois(5,lambda=u)
12 print(paste("P(X<=5)=",p2))
```

---

### R code Exa 3.40 Poisson distribution as a limit

```
1 #Ex3.40 , Page 129
2 #Answers may vary slightly due to rounding off of
   values
```

```
3
4 n<-400
5 p<-0.005
6
7 #P(X=1): b(x;n,p)->p(x;u)
8 u<-n*p
9 p1<-dpois(1,lambda=u)
10 print(paste("P(X=1)=",p1))
11
12 #P(X<=3)
13 p2<-ppois(3,lambda=u)
14 print(paste("P(X<=3)=",p2))
```

---

#### R code Exa 3.41 Mean and variance in Poisson distribution

```
1 #Ex3.41 , Page 130
2 #Answer may slightly vary due to rounding off of
  value
3
4 u<-4.5
5 #Standard deviation
6 sd<-sqrt(u)
7 print(paste("Standard deviation=",sd))
```

---

#### R code Exa 3.42 Poisson process

```
1 #Ex3.42 , Page 131
2 #Answer may slightly vary due to rounding off of
  value
3
4 alpha<-6
5 t<-0.5
6 l<-alpha*t
```

```
7  
8 #P(X>=1)=1-P(X=0)  
9 p<-1-dpois(0,lambda=1)  
10 print(paste("P(X>=1)=", p))
```

---

# Chapter 4

## Continuous random variables and probability distributions

**R code Exa 4.4** Probability density function

```
1 #Example 4.4 , Page 139*
2 #n=10,M=5,N=25
3
4 #f(x)>=0
5 #Area under density curve
6 a<- (1/360)*360
7
8 #P(90<=X<=180)
9 f1<-function(x) {(x^0)/360}
10 p1<-integrate(f1,lower=90,upper=180)
11 print(paste("Probability that angle is between 90
   and 180 is",p1$value))
12
13 #P(0<=X<=90)+P(270<=X<360)
14 f2<-function(x) {(x^0)/360}
15 p2<-integrate(f2,lower=0,upper=90)
16 f3<-function(x) {(x^0)/360}
17 p3<-integrate(f3,lower=270,upper=360)
18 p4<-p2$value+p3$value
```

```
19 print(paste("P(angle of occurrence is within 90  
degrees of reference line)=",p4))
```

---

### R code Exa 4.5 Uniform distribution

```
1 #Example 4.5, Page 141  
2 #The answers may slightly vary due to rounding off  
of values  
3  
4 #Taking upper limit as 1000 instead of infinity  
5 integrand<-function(x) {.15*exp(-.15*(x-.5))}  
6 #f(x)>=0  
7 #To show that integral from negative infinity to  
infinity is 1  
8 c<-integrate(integrand,lower=0.5,upper=Inf)  
9 #To access the list of values of integrate by name  
10 print(paste("Value of integral is",c$value))  
11  
12 #To find P(X<5)  
13 d<-integrate(integrand,lower=0.5,upper=5)  
14 print(paste("Thus, probability that headway time is  
atmost 5 sec:",d$value))
```

---

### R code Exa 4.7 Computing probabilities

```
1 #Ex4.7, Page 145*  
2  
3 #if x<0, F(X)=0  
4 #if 0<=x<=2, F(X)=(x/8)+(3/16)(x^2)  
5 #if x>2, F(X)=1  
6  
7 load<-function(x){  
8   f<-(x/8)+(3/16)*(x^2)
```

```

9     return(f)
10 }
11
12 #P(1<=X<=1.5)=P(X=1.5)-P(X=1)
13 p1<-load(1.5)-load(1)
14 print(paste("P(1<=X<=1.5)=", p1))
15
16 #P(X>1)=1-P(X<=1)
17 p2<-1-load(1)
18 print(paste("P(load exceeds 1)=", p2))

```

---

### R code Exa 4.10 Expected values

```

1 #Ex4.10 , Page 148
2
3 #if 0<=x<=1      f(x)=(3/2)(1-x^2)
4 #otherwise        f(x)=0
5
6 f1<-function(x) {(3/2)*x*(1-x^2)}
7 p1<-integrate(f1, lower=0, upper=1)
8 print(paste("E(X)=", p1$value))

```

---

### R code Exa 4.11 Expected value of a function

```

1 #Ex4.11 , Page 149
2 #if 0<=x<=1      f(x)=1
3 #otherwise        f(x)=0
4
5 #h(X)=max(1-X,X)
6 #if 0<=X<1/2    h(X)=1-X
7 #if 1/2<=X<=1   h(X)=X
8
9 #f<-function(x) {max(x,1-x)*f(x)}

```

```

10 #integrate(f ,lower=0,upper=1)
11
12 f1<-function(x) {(1-x)*1}
13 p1<-integrate(f1 ,lower=0 ,upper=1/2)
14
15 f2<-function(x) {x*1}
16 p2<-integrate(f2 ,lower=0.5 ,upper=1)
17
18 p3<-p1$value+p2$value
19 print(paste("E[h(X)]=",p3))

```

---

**R code Exa 4.12** Variance and standard deviation

```

1 #Ex4.12 , Page 150
2
3 #E(X)
4 e<-3/8
5
6 #E(X^2)
7 e2<-function(x) {(3/2)*(x^2)*(1-(x^2))}
8 p1<-integrate(e2 ,lower=0 ,upper=1)
9 print(paste("E(X^2)=" ,p1$value))
10
11 #V(X)
12 v<-(p1$value)-(e^2)
13 print(paste("V(X)=" ,v))
14
15 #Standard deviation
16 sd<-sqrt(v)
17 print(paste("Standard deviation =" ,sd))

```

---

**R code Exa 4.13.a** Standard normal distribution

```

1 #Example 4.13.a, Page 154
2 #The answers may slightly vary due to rounding off
   of values
3
4 #P(Z<=1.25)
5 a<-pnorm(1.25,0,1)
6 print(paste("The standard normal probability is",a))
7
8 #To plot the standard normal distribution bell curve
9 curve(dnorm, xlim = c(-3, 3), ylim = c(0, 0.4), xlab
   = "z", ylab="f(z)", lwd=2, col="black")
10 z = 1.25
11 pnorm(z)
12 x = c(-3, seq(-3, z, by=.001), z)
13 #plot(x)
14 y = c(0, dnorm(seq(-3, z, by=.001)), 0)
15 #plot(y)
16 polygon(x, y, col="red")

```

---

### R code Exa 4.13.b Standard normal distribution

```

1 #Example 4.13.b, Page 154
2 #The answers may slightly vary due to rounding off
   of values
3
4 #P(Z>1.25)
5 #Variable to store result(1-P(Z<=1.25))
6 a=1-pnorm(1.25,0,1)
7 print(paste("The standard normal probability is", a))
8
9
10 #To plot the standard normal distribution bell curve
11 curve(dnorm, xlim = c(-3, 3), ylim = c(0, 0.4), xlab
   = "z", ylab="f(z)", lwd=2, col="black")

```

```

12 z = 1.25
13 pnorm(z)
14 x = c(z, seq(z, 3, by=.001), 3)
15 #plot(x)
16 y = c(0, dnorm(seq(z, 3, by=.001)), 0)
17 #plot(y)
18 polygon(x, y, col="red")

```

---

### R code Exa 4.13.c Standard normal distribution

```

1 #Example 4.13.C, Page 154
2 #The answers may slightly vary due to rounding off
   of values
3
4 #P(Z<=-1.25)=P(Z>=1.25)
5 #Variable to store result(1-P(Z<=1.25))
6 a=1-pnorm(1.25,0,1)
7 print(paste("The standard normal probability is", a))
8
9 #To plot the standard normal distribution bell curve
10 x=seq(-3,3,length=200)
11 y=dnorm(x)
12 plot(x,y,type="l", lwd=2, col="black")
13 x=seq(-3,-1.25,length=200)
14 y=dnorm(x)
15 polygon(c(-3,x,-1.25),c(0,y,0),col="red")
16
17 #To plot the standard normal distribution bell curve
18 curve(dnorm, xlim = c(-3, 3), ylim = c(0, 0.4), xlab
      = "z", ylab="f(z)", lwd=2, col="black")
19 z = -1.25
20 pnorm(z)
21 x = c(-3, seq(-3, z, by=.001), z)
22 #plot(x)

```

```
23 y = c(0, dnorm(seq(-3, z, by=.001)), 0)
24 #plot(y)
25 polygon(x, y, col="red")
```

---

### R code Exa 4.13.d Standard normal distribution

```
1 #Example 4.13.d, Page 154
2 #The answers may slightly vary due to rounding off
   of values
3
4 #P(-0.38<=Z<=1.25)
5 #Variable to store result(1-P(Z<=1.25))
6 a<-pnorm(1.25,0,1)-pnorm(-0.38,0,1)
7 print(paste("The standard normal probability is", a)
      )
8
9 #To plot the standard normal distribution bell curve
10 curve(dnorm, xlim = c(-3, 3), ylim = c(0, 0.4), xlab
        = "z", ylab="f(z)", lwd=2, col="black")
11 z1 = 1.25
12 z2 = -0.38
13 pnorm(z)
14 x = c(z2, seq(z2, z1, by=.001), z1)
15 #plot(x)
16 y = c(0, dnorm(seq(z2, z1, by=.001)), 0)
17 #plot(y)
18 polygon(x, y, col="red")
```

---

### R code Exa 4.14 Percentiles of standard normal distribution

```
1 #Ex4.14, Page 155
2 #Answers may slightly vary due to rounding off of
   values
```

```

3
4 print(paste("99th percentile:", qnorm(0.99)))
5 print(paste("1st percentile:", qnorm(0.01)))
6
7 #Blue=> 99th percentile
8 #Red=> 1st percentile
9 plot.new()
10 title(main="Blue: 99th percentile
11 Red: 1st percentile")
12 curve(dnorm, xlim = c(-3, 3), ylim = c(0, 0.5), xlab
13 = "z", ylab="f(z)")
14 prob1 = 0.99
15 x1= c(-3, seq(-3, qnorm(prob1), by=.001), qnorm(
16 prob1))
15 y1= c(0, dnorm(seq(-3, qnorm(prob1), by=.001)), 0)
16 polygon(x1, y1, col="blue")
17
18 par(new=TRUE)
19
20 prob2 = 0.01
21 x2= c(-3, seq(-3, qnorm(prob2), by=.0001), qnorm(
22 prob2))
22 y2= c(0, dnorm(seq(-3, qnorm(prob2), by=.0001)), 0)
23 polygon(x2, y2, col="red")

```

---

### R code Exa 4.15 z critical values

```

1 #Ex4.15 , Page 156
2 #Answers may slightly vary due to rounding off of
values
3
4 #z (.05)
5 x<-0.05
6 z<-100*(1-x)
7

```

```

8 plot.new()
9 title(main="Red: z(0.05)
10 Blue: -z(0.05)")
11
12 #z(.05)
13 print(paste(z,"th percentile:",qnorm(z/100)))
14 curve(dnorm, xlim = c(-3, 3), ylim = c(0, 0.5), xlab
15      = "z", ylab="f(z)")
16 prob = z/100
17 x = c(-3, seq(-3, qnorm(prob), by=.001), qnorm(prob)
18      )
19 y = c(0, dnorm(seq(-3, qnorm(prob), by=.001)), 0)
20 polygon(x, y, col="red")
21 # -z(.05)
22 print(paste("-z(.05)",-qnorm(z/100)))
23 x = c(-3, seq(-3, -qnorm(prob), by=.001), -qnorm(
24      prob))
25 y = c(0, dnorm(seq(-3, -qnorm(prob), by=.001)), 0)
26 polygon(x, y, col="blue")

```

---

### R code Exa 4.16 Nonstandard normal distributions

```

1 #Ex4.16, Page 158
2 #Answers may slightly vary due to rounding off of
3 #values
4 #P(1.00<=X<=1.75)
5 #Mean=>1.25, Standard deviation=>0.46
6
7 title(main="P(1.00<=X<=1.75)")
8 a<-pnorm(1.00,mean=1.25,sd=0.46)
9 b<-pnorm(1.75,mean=1.25,sd=0.46)
10 c<-b-a
11 print(paste("P(1.00<=X<=1.75)=",c))

```

```

12
13 #To plot the standard normal distribution bell curve
14 curve(dnorm, xlim = c(-3, 3), ylim = c(0, 0.4), xlab
15     = "z", ylab="f(z)", lwd=2, col="black")
16 # Cumulative density function of the standard normal
17 # distribution
18 pnorm(z)
19 x<-c(1.00, seq(1.00, z, by=.001), z)
20 #plot(x)
21 y<-c(0, dnorm(seq(1.00, z, by=.001)), 0)
22 #plot(y)
23 polygon(x, y, col="red")
24 #P(X>2)
25 d<-1-pnorm(2, mean=1.25, sd=0.46)
26 print(paste("P(X>2)=", d))

```

---

### R code Exa 4.17 Nonstandard normal distributions

```

1 #Ex4.17, Page 158
2 #Answers may slightly vary due to rounding off of
2 values
3
4 #P(-1.00<=Z<=1.00)
5 a<-pnorm(1.00,0,1)-pnorm(-1.00,0,1)
6 print(paste("P(X is within 1 standard deviation of
6 its mean):",a))
7
8 #P(-2.00<=Z<=2.00)
9 b<-pnorm(2.00,0,1)-pnorm(-2.00,0,1)
10 print(paste("P(X is within 2 standard deviation of
10 its mean):",b))
11
12 #P(-3.00<=Z<=3.00)

```

```
13 c<-pnorm(3.00,0,1)-pnorm(-3.00,0,1)
14 print(paste("P(X is within 3 standard deviation of
its mean):",c))
```

---

### R code Exa 4.18 Percentiles of arbitrary normal distribution

```
1 #Ex4.18 , Page 159
2 #Answers may slightly vary due to rounding off of
values
3
4 m<-64
5 sd<-0.78
6 #P(X>c)=0.05
7 p<-0.005
8 #P(X<=c)=1-P(X>c)
9 s<-(1-p)*100
10 print(paste("c is the",s,"th percentile of the
normal distribution with mean=64 and sd=0.78"))
11 q<-qnorm(s/100)
12 print(paste("Therefore",s,"th percentile:",q))
13
14 c<-m+q*sd
15 print(paste(" c=",c," oz"))
16
17 #Plotting 99.5th percentile
18 plot.new()
19 title(main="99.5th percentile",sub="Shaded area
=>0.995")
20 curve(dnorm, xlim = c(-3, 3), ylim = c(0, 0.5), xlab
= "z", ylab="f(z)")
21 prob = 0.995
22 x1= c(-3, seq(-3, qnorm(prob), by=.001), qnorm(prob)
)
23 y1= c(0, dnorm(seq(-3, qnorm(prob), by=.001)), 0)
24 polygon(x1, y1, col="blue")
```

---

**R code Exa 4.20** Approximating binomial distribution

```
1 #Ex4.20 , Page 161
2 #Answers may vary slightly due to rounding off of
  values
3
4 n<-50
5 p<-25/100
6 q<-1-p
7 m<-12.5
8 sd<-3.06
9 x<-n*p
10 y<-sqrt(n*p*q)
11 z<-n*q
12 if(x>=10 && z>=10) {
13   #P(X<=10)
14   a<-pnorm(10+0.5, mean=x, sd=y)
15   print(paste("P(X<=10)=" ,a))
16
17   #P(5<=X<=15)
18   b<-pnorm(15+0.5, mean=x, sd=y)-pnorm(5-0.5, mean=x, sd
     =y)
19   print(paste("P(5<=X<=15)=" ,b))
20 }
```

---

**R code Exa 4.21** Exponential distribution

```
1 #Ex4.21 , Page 166
2 #Answers may slightly vary due to rounding off of
  values
3
```

```
4 #E(X)=6MPa=1/lambda
5 e<-6
6 lambda<-1/e
7 #Probability that stress range is at most 10MPa
8 p<-pexp(10,lambda)
9 print(paste("P(stress range is at most 10MPa)=",p))
10
11 #Probability that stress range is between 5 and 10
12 q<-pexp(10,lambda)-pexp(5,lambda)
13 print(paste("P(stress range is between 5 and 10MPa)="
,"q))
```

---

### R code Exa 4.22 Exponential distribution

```
1 #Ex4.22 , Page 167
2 #Answer may slightly vary due to rounding off of
value
3
4 alpha<-0.5
5
6 #P(X>2)=1-P(X<=2)
7 x<-2
8 p<-1-pexp(x,alpha)
9 print(paste("P(X>2)=",p))
10
11 t<-1/alpha
12 print(paste("The expected time between successive
calls is ",t,"days"))
```

---

### R code Exa 4.23 Gamma distribution

```
1 #Ex4.23 , Page 169
```

```

2 #Answers may slightly vary due to rounding off of
  values
3
4 alpha<-2
5
6 #P(3<=X<=5)
7 a<-pgamma(5, shape=alpha)-pgamma(3, shape=alpha)
8 print(paste("P(3<=X<=5)=" ,a))
9
10 #P(X>4)=1-P(X<=4)
11 b<-1-pgamma(4, shape=alpha)
12 print(paste("P(reaction time is more than 4 sec)=" ,b
  ))

```

---

### R code Exa 4.24 Gamma distribution

```

1 #Ex4.24 , Page 169
2 #Answers may slightly vary due to rounding off of
  values
3
4 #alpha
5 a<-8
6 #beta
7 b<-15
8
9 #E(X)
10 e<-a*b
11 print(paste("E(X)=" ,e))
12
13 #V(X)
14 v<-a*(b^2)
15 print(paste("V(X)=" ,v))
16
17 #SD
18 sd<-sqrt(v)

```

```

19 print(paste("Standard deviation =", sd))
20
21 #P(60<=X<=120)=P(X<=120)-P(X<=60)
22 p1<-pgamma(120/b, shape=a)-pgamma(60/b, a)
23 print(paste("P(mouse survives between 60 and 120
weeks)=", p1))
24
25 #P(X>=30)=1-P(X<30)
26 p2<-1-pgamma(30/b, a)
27 print(paste("P(mouse survives at least 30 weeks)=", p2))

```

---

### R code Exa 4.25 Weibull distribution

```

1 #Ex4.25 , Page 173
2 #Answers may slightly vary due to rounding off of
values
3
4 alpha<-2
5 beta<-10
6
7 #P(X<=10)
8 p1<-pweibull(10, alpha, beta)
9 print(paste("P(X<=10)=", p1))
10
11 #P(X<=25)
12 p2<-pweibull(25, alpha, beta)
13 print(paste("P(X<=25)=", p2))
14
15 #To find c value which separates 5% of all engines
having largest NOx emissions from remaining 95%
16 per<-5/100
17 c<-sqrt((-1)*(10^2)*log(per))
18 print(paste(c,"is the 95th percentile of the
emission distribution"))

```

---

### R code Exa 4.26 Weibull distribution

```
1 #Ex4.26 , Page 173
2 #Answers may slightly vary due to rounding off of
  values
3
4 #alpha
5 a<-1.3
6 #beta
7 b<-0.8
8 #gamma
9 g<-4
10
11 #P(5<=X<=6)
12 p1<-pweibull(6-g,a,b)-pweibull(5-g,a,b)
13 print(paste("P( air void volume of a specimen is
  between 5% and 6%)=",p1))
```

---

### R code Exa 4.27 Lognormal distribution

```
1 #Ex4.27 , Page 175
2 #Answers may slightly vary due to rounding off of
  values
3
4 m<-0.353
5 s<-0.754
6
7 e<-exp(m+(s^2)/2)
8 print(paste("E(X)=",e))
9
10 v<-exp(2*m+(s^2))*(exp(s^2)-1)
```

```

11 print(paste("V(X)=", v))
12
13 #P(1<=X<=2)
14 l1<-log(1, base=exp(1))
15 l2<-log(2, base=exp(1))
16 p<-pnorm(l2, m, s)-pnorm(l1, m, s)
17 print(paste("P(maximum pit depth is between 1 and 2
mm)=" , p))
18
19 #To find c such that only 1% of all specimens have a
maximum pit depth exceeding c
20 per<-1/100
21 c<-exp(1)^(qnorm(1-per)*s+m)
22 print(paste(c, "is the 99th percentile of the maximum
pit depth distribution"))

```

---

### R code Exa 4.28 Beta distribution

```

1 #Ex4.28 , Page 177
2
3 #Optimistic time
4 A<-2
5
6 #Pessimistic time
7 B<-5
8
9 #alpha
10 a<-2
11 #beta
12 b<-3
13
14 #E(X)
15 e<-A+(B-A)*(a/(a+b))
16 print(paste("Mean=", e))
17

```

```

18 c<- (1/(B-A))*((gamma(a+b))/(gamma(a)*gamma(b)))
19 f1<-function(x) {c*((x-A)/(B-A))^(a-1))*(((B-x)/(B-
A))^(b-1))}
20 p<-integrate(f1,lower=2,upper=3)
21 print(paste("P(it take atmost 3 days to lay the
foundation)=",p$value))

```

---

### R code Exa 4.29 Probability plots

```

1 #Ex4.29 , Page 181
2
3 old.par<-par(mfrow=c(1,2))
4
5 #To plot first sample
6 Percentage1<-c(5, 15, 25, 35, 45)
7 z_percentile1<-c(qnorm(5/100), qnorm(15/100), qnorm
(25/100), qnorm(35/100), qnorm(45/100))
8 Sample_observation1<-c(-1.91, -1.25, -0.75, -0.53,
0.2)
9 df1<-data.frame(Percentage1, z_percentile1, Sample_
observation1)
10 print(df1)
11 plot(z_percentile1,Sample_observation1)
12
13 #To plot second sample
14 Percentage2<-c(55, 65, 75, 85, 95)
15 z_percentile2<-c(qnorm(55/100), qnorm(65/100), qnorm
(75/100), qnorm(85/100), qnorm(95/100))
16 Sample_observation2<-c(0.35, 0.72, 0.87, 1.40, 1.56)
17 df2<-data.frame(Percentage2, z_percentile2, Sample_
observation2)
18 print(df2)
19 plot(z_percentile2,Sample_observation2)
20
21 par(old.par)

```

---

**R code Exa 4.30** Probability plots

```
1 #Ex4.30 , Page 182
2
3 old.par<-par(mfrow=c(1,1))
4 n<-20
5 z_percentile<-c(qnorm((1-0.5)/n), qnorm((2-0.5)/n),
6                   qnorm((3-0.5)/n), qnorm((4-0.5)/n), qnorm((5-0.5)
/n),
7                   qnorm((6-0.5)/n), qnorm((7-0.5)/n),
8                   qnorm((8-0.5)/n), qnorm((9-0.5)/n),
9                   qnorm((10-0.5)/n),
10                  qnorm((11-0.5)/n), qnorm((12-0.5)/n),
11                  , qnorm((13-0.5)/n), qnorm
12                  ((14-0.5)/n), qnorm((15-0.5)/n),
13                  qnorm((16-0.5)/n), qnorm((17-0.5)/n),
14                  , qnorm((18-0.5)/n), qnorm
15                  ((19-0.5)/n), qnorm((20-0.5)/n))
16 Sample_observation<-c(24.46, 25.61, 26.25, 26.42,
17                      26.66, 27.15, 27.31, 27.54, 27.74, 27.94, 27.98,
18                      28.04, 28.28, 28.49, 28.50, 28.87, 29.11, 29.13,
19                      29.50, 30.88)
20 df<-data.frame(z_percentile, Sample_observation)
21 print(df)
22 plot(z_percentile,Sample_observation)
23
24 par(old.par)
```

---

**R code Exa 4.31** Beyond normality

```
1 #Ex4.31 , Page 186
```

```
2
3 old.par<-par(mfrow=c(1,1))
4
5 Percentile<-c(-2.97, -1.82, -1.25, -0.84, -0.51,
   -0.23, 0.05, 0.33, 0.64, 1.10)
6 x<-c(282, 501, 741, 851, 1072, 1122, 1202, 1585,
   1905, 2138)
7 lnx<-c(log(282,base=exp(1)),log(501,base=exp(1)),
   log(741,base=exp(1)), log(851,base=exp(1)), log
   (1072,base=exp(1)),
8      log(1122,base=exp(1)), log(1202,base=exp(1)
   ), log(1585,base=exp(1)), log(1905,base=
   exp(1)), log(2138,base=exp(1)))
9 df<-data.frame(Percentile,x,lnx)
10 print(df)
11 plot(Percentile,lnx)
12
13 par(old.par)
```

---

# Chapter 5

## Joint probability distributions and random samples

**R code Exa 5.1** Joint probability mass function

```
1 #Ex5.1 , Page 194
2
3 m<-matrix(c(0.20,0.05,0.10,0.15,0.20,0.30),nrow=2,
4 ncol=3)
5 rownames(m)<-c("100","250")
6 colnames(m)<-c("0","100","200")
7 print(m)
8 #To find P(Y>=100)
9 prob<-m[1,2]+m[1,3]+m[2,2]+m[2,3]
10 print(paste("P(Y>=100)=",prob))
```

---

**R code Exa 5.2** Marginal probability mass function

```
1 #Ex5.2 , Page 195
2
```

```

3 m<-matrix(c(0.20,0.05,0.10,0.15,0.20,0.30),nrow=2,
4 ncol=3)
5 rownames(m)<-c("100","250")
6 colnames(m)<-c("0","100","200")
7 print(m)
8 cat("\n")
9 px_100<-apply(m,1,sum)[1]
10 px_250<-apply(m,1,sum)[2]
11 cat("px(100)=",px_100,"\n")
12 cat("px(250)=",px_250,"\n\n")
13
14 cat("Marginal pmf of X:\n")
15 cat("p(x)=",px_100," when x=100,250\n")
16 cat("p(x)=0 otherwise\n\n")
17
18 py_0<-apply(m,2,sum)[1]
19 py_100<-apply(m,2,sum)[2]
20 py_200<-apply(m,2,sum)[3]
21 cat("py(0)=",py_0,"\n")
22 cat("py(100)=",py_100,"\n")
23 cat("py(200)=",py_200,"\n\n")
24
25 cat("Marginal pmf of Y:\n")
26 cat("p(y)=",py_0," when y=0,100\n")
27 cat("p(y)=",py_200," when y=200\n")
28 cat("p(y)=0 otherwise\n\n")
29
30 #To find P(Y>=100)
31 prob<-py_100+py_200
32 cat("P(Y>=100)=",prob)

```

---

### R code Exa 5.3 Joint probability density function

1 #Ex5.3 , Page 196

```

2 #Answers may ary slightly due to rounding off of
  values
3
4 f<-function(x,y) {(6/5)*(x+y^2)}
5
6 #To check whether pdf is legitimate
7 check_val<-integrate(function(y) {sapply(y,function(
      y) {integrate(function(x) f(x,y),0,1)$value})
    },0,1)
8 if(check_val$value==1) cat("PDF is legitimate\n\n")
9
10 #P(0<=X<=1/4,0<=Y<=1/4)
11 low1<-0
12 high1<-1/4
13 low2<-0
14 high2<-1/4
15 integral<-integrate(function(y) {sapply(y,function(y)
      ) {integrate(function(x) f(x,y),low1,high1)$value
    }}),low2,high2)
16 print(paste("P(0<=X<=1/4,0<=Y<=1/4)=" ,integral$value
  ))

```

---

**R code Exa 5.4** Marginal probability density function

```

1 #Ex5.4 , Page 197
2
3 f<-function(x,y) {(6/5)*(x+y^2)}
4
5 #Finding P(1/4<=Y<=3/4) using marginal pdf of Y
6 xlow<-0
7 xhigh<-1
8 ylow<-1/4
9 yhigh<-3/4
10 prob<-integrate(function(y) {sapply(y,function(y) {
      integrate(function(x) f(x,y),xlow,xhigh)$value})}
```

```
    },ylow,yhigh)
11 print(paste("P(1/4<=Y<=3/4)=",prob$value))
```

---

**R code Exa 5.5** Marginal probability density function

```
1 #Ex5.5, Page 198
2
3 #Joint pdf
4 f<-function(x,y) {24*x*y}
5
6 val<-Vectorize(function(x) {sapply(x,function(z) {
7   integrate(function(y) f(x,y),0,1-z)$value)})})
8 check_val<-integrate(val,0,1)$value
9 if(check_val==1) print(paste("PDF is legitimate"))
10 #Probability that two types of nuts together make up
11 # 50% of the can
12 #Taking A={(x,y):0<=x<=1,0<=y<=1,x+y<=0.5}
13 xlow<-0
14 xhigh<-0.5
15 integral<-Vectorize(function(x) {sapply(x,function(z)
16   ) {integrate(function(y) f(x,y),0,0.5-z)$value}
17   })
18 prob<-integrate(integral,xlow,xhigh)
19 print(paste("P((X,Y)EA) =",prob$value))
```

---

**R code Exa 5.8** Independent random variables

```
1 #Ex5.8, Page 200
2 #Answers may vary slightly due to rounding off of
#  values
3
4 #Expected lifetimes are 1000 and 1200 hours
```

```
5 lambda1<-(1/1000)
6 lambda2<-(1/1200)
7
8 #P(X1>=1500)
9 p1<-exp(-(lambda1)*1500)
10
11 #P(X2>=1500)
12 p2<-exp(-(lambda2)*1500)
13
14 #Joint PDF
15 #P(X1>=1500,X2>=1500)
16 p<-p1*p2
17 print(paste("P( both component lifetimes are at least
1500 hours)=",p))
```

---

### R code Exa 5.9 Multinomial distribution

```
1 #Ex5.9 , Page 201
2 #Answer may slightly vary due to rounding off of
  value
3
4 #Respective number and probabilities
5 n<-c(2,5,3)
6 p<-c(0.25,0.5,0.25)
7
8 #Multinomial PMF
9 m<-dmultinom(n,prob=p)
10 print(paste(" Multinomial PMF:",m))
```

---

### R code Exa 5.12 Conditional distributions

```
1 #Ex5.12 , Page 203
```

```

2 #Answers may slightly vary due to rounding off of
  values
3
4 #Function when X=0.8: (1/34)(24+30(y^2))
5
6 #P(Y<=0.5) given X=0.8
7 f1<-function(y) {(1/34)*(24+30*(y^2))}
8 f<-integrate(f1,lower=0,upper=0.5)
9 print(paste("P(walk-up facility is busy atmost half
  the time)=",f$value))
10
11 #E(Y) given that X=0.8
12 f2<-function(y) {y*(1/34)*(24+30*(y^2))}
13 p<-integrate(f2,lower=0,upper=1)
14 print(paste("Expected proportion of time that walk-
  up facility is busy:",p$value))

```

---

### R code Exa 5.14 Expected values

```

1 #Ex5.14 , Page 207
2
3 #Joint pdf
4 f<-function(x,y) {24*x*y}
5
6 almonds<-1
7 cashews<-1.5
8 peanuts<-0.5
9
10 #Total cost of the contents of a can
11 h<-function(x,y) {almonds*x+cashews*y+(1-x-y)*
  peanuts}
12
13 #Expected total cost
14 integral<-Vectorize(function(x) {sapply(x,function(z
  ) {integrate(function(y) h(x,y)*f(x,y),0,1-z)$

```

```

        value}))})
15 prob<-integrate(integral,0,1)
16 print(paste("Expected total cost:$",prob$value))

```

---

### R code Exa 5.15 Covariance

```

1 #Ex5.15 , Page 208
2
3 x<-c(100,250)
4 y<-c(0,100,200)
5
6 m1<-matrix(c(0.20,0.05,0.10,0.15,0.20,0.30),nrow=2,
      ncol=3)
7 rownames(m1)<-c("100","250")
8 colnames(m1)<-c("0","100","200")
9 print(m1)
10 cat("\n")
11
12 m2<-matrix(c(0.5,0.5),nrow=1,ncol=2)
13 rownames(m2)<-c("p(x)")
14 colnames(m2)<-c("100","250")
15 print(m2)
16 cat("\n")
17
18 m3<-matrix(c(0.25,0.25,0.5),nrow=1,ncol=3)
19 rownames(m3)<-c("p(y)")
20 colnames(m3)<-c("0","100","200")
21 print(m3)
22 cat("\n")
23
24 x1<-c(0.5,0.5)
25 j<-1
26 mu_x<-0
27
28 for(i in x){

```

```

29     if(j<=length(x1)){
30         mu_x<-mu_x+i*x1[j]
31         j=j+1
32     }
33 }
34 cat("mu_X=",mu_x,"\\n\\n")
35
36 y1<-c(0.25,0.25,0.5)
37 k<-1
38 mu_y<-0
39
40 for(i in y){
41     if(k<=length(y1)){
42         mu_y<-mu_y+i*y1[k]
43         k=k+1
44     }
45 }
46 cat("mu_Y=",mu_y,"\\n\\n")
47
48 p<-c(0.2,0.1,0.20,0.05,0.15,0.30)
49 sum<-0
50 k<-1
51 for(i in x){
52     for(j in y){
53         if(k<=length(p)){
54             sum=sum+(i-175)*(j-125)*p[k]
55             k=k+1
56         }
57     }
58 }
59 print(paste("Cov(X,Y):",sum))

```

---

### R code Exa 5.18 Correlation

1 #Ex5.18 , Page 210

```

2
3 x<-c(-4,4,2,-2)
4 y<-c(1,-1,2,-2)
5 xy<-x*y
6 w<-c(1/4,1/4,1/4,1/4)
7 m<-weighted.mean(xy,w)
8 print(paste("E(XY)=",m))
9
10 #Cov(XY)=E(XY)-ux . uy
11 ux<-0
12 uy<-0
13 cov<-m-(ux*uy)
14 print(paste("Cov(XY)=",cov))
15
16 print(paste("Complete absence of any linear
relationship"))
17
18 #To scatterplot
19 df<-data.frame(x,y)
20 plot(x,y)

```

---

### R code Exa 5.19 Statistics and their distributions

```

1 #Ex5.19, Page 212
2 #Answers may vary slightly due to rounding off of
values
3
4 #alpha
5 a<-2
6
7 #beta
8 b<-5
9
10 #Mean
11 u<-b*gamma(1+(1/a))

```

```

12 print(paste("Mean , E(X)=",u))
13
14 #Variance
15 v<-b^2*{gamma(1+(2/a))-(gamma(1+(1/a)))^2}
16 print(paste("Variance=",v))
17
18 #Standard deviation
19 s<-sqrt(v)
20 print(paste("Standard deviation=",s))
21
22 #Median
23 med<-b*(log(2,base=exp(1)))^(1/a)
24 print(paste("Median=",med))
25
26 q<-qweibull(0.99,shape=a,scale=b)
27 curve(dweibull(x,a,b),from=0,to=q,ylab='density')
28
29 if(u>med){
30   print(paste("Mean exceeds median because of the
            distribution's positive skew"))
31 }

```

---

### R code Exa 5.24 Standard error of the mean

```

1 #Ex5.24 , Page 223
2
3 n<-25
4 u<-28000
5 s<-5000
6
7 #E(Mean)
8 print(paste("E(Mean)=",u))
9
10 #E(T0)
11 t<-n*u

```

```

12 print(paste("E(T0)=", t))
13
14 #Standard deviation of mean
15 sm<-s/sqrt(n)
16 print(paste("SD of mean:", sm))
17
18 #Standard deviation of T0
19 st<-s*sqrt(n)
20 print(paste("SD of T0:", st))
21
22 #When sample size increases to n=100
23 print(paste("When n=100:"))
24 n<-100
25 #E(Mean)
26 print(paste("E(Mean)=", u))
27
28 #E(T0)
29 t<-n*u
30 print(paste("E(T0)=", t))
31
32 #Standard deviation of mean
33 sm<-s/sqrt(n)
34 print(paste("SD of mean:", sm))
35
36 #Standard deviation of T0
37 st<-s*sqrt(n)
38 print(paste("SD of T0:", st))

```

---

### R code Exa 5.25 Normal population distribution

```

1 #Ex5.25 , Page 224
2 #Answers may slightly vary due to rounding off of
   values
3
4 n<-5

```

```

5
6 #Mean( min )
7 m<-1.5
8
9 #Standard deviation( min )
10 sd<-0.35
11
12 ut<-n*m
13 print(paste("uT0:",ut))
14
15 vt<-n*(sd^2)
16 print(paste("vT0:",vt))
17
18 st<-sqrt(vt)
19 print(paste("sT0:",st))
20
21 #P(6<=T0<=8)
22 p1<-pnorm(8,mean=ut,sd=st)-pnorm(6,mean=ut,sd=st)
23 print(paste("P(6<=T0<=8)=",p1))
24
25 #Probability that the sample average time is atmost
26 2 min
27 u<-1.5
28 s<-sd/sqrt(n)
29
30 #P( Mean<=2.0)
31 p2<-pnorm(2,mean=u,sd=s)
32 print(paste("P( Mean<=2)=",p2))

```

---

### R code Exa 5.26 Central limit theorem

```

1 #Ex5.26 , Page 225
2 #Answer may slightly vary due to rounding off of
   value
3

```

```
4 n<-50
5 m<-4
6 sd<-1.5
7
8 ux<-m
9 sx<-sd/sqrt(n)
10
11 #P(3.5<=Mean<=3.8)
12 p<-pnorm(3.8, mean=ux, sd=sx)-pnorm(3.5, mean=ux, sd=sx)
13 print(paste("P(3.5<=Mean<=3.8)=", p))
```

---

### R code Exa 5.27 Central limit theorem

```
1 #Ex5.27, Page 226
2 #Answer may slightly vary due to rounding off of
   value
3
4 n<-100
5 m<-3.2
6 sd<-2.4
7
8 ux<-m
9 sx<-sd/sqrt(n)
10
11 #P(Mean>4)=1-P(Mean<=4)
12 p<-1-pnorm(4, mean=ux, sd=sx)
13 print(paste("P(Mean>4)=", p))
```

---

### R code Exa 5.29 Linear combination

```
1 #Ex5.29, Page 231
2 #Answers may vary slightly due to rounding off of
   values
```

```

3
4 a1<-3.00
5 a2<-3.20
6 a3<-3.40
7
8 #Mean
9 u1<-1000
10 u2<-500
11 u3<-300
12
13 #Standard deviation
14 s1<-100
15 s2<-80
16 s3<-50
17
18 # $Y=3.0X_1+3.20X_2+3.40X_3$ 
19 EY<-a1*u1+a2*u2+a3*u3
20 VY<-(a1^2)*(s1^2)+(a2^2)*(s2^2)+(a3^2)*(s3^2)
21 sY<-sqrt(VY)
22 print(paste("E(Y)=$",EY))
23 print(paste("V(Y)=$",VY))
24 print(paste("sY=$",sY))

```

---

**R code Exa 5.30** Difference between two random variables

```

1 #Ex5.30 , Page 232
2 #Answers may slightly vary due to rounding off of
   values
3
4 u1<-22
5 u2<-26
6 s1<-1.2
7 s2<-1.5
8
9 #Mean

```

```
10 e<-u1-u2
11 print(paste("E(X1-X2)=",e))
12
13 #Variance
14 v<-(s1^2)+(s2^2)
15 print(paste("V(X1-X2)=",v))
16
17 #Standard deviation
18 sd<-sqrt(v)
19 print(paste("SD=",sd))
```

---

### R code Exa 5.31 Normal random variables

```
1 #Ex5.31 , Page 232
2
3 #Y=3.0X1+3.2X2+3.4X3
4 u<-5620
5 s<-429.46
6
7 #P(Y>4500)
8 p<-1-pnorm(4500,mean=u,sd=s)
9 print(paste("P(revenue exceeds 4500)=",p))
```

---

# Chapter 6

## Point estimation

**R code Exa 6.1** Some general concepts of point estimation

```
1 #Ex6.1, Page 241
2
3 x<-15
4 n<-25
5 p<-x/n
6 print(paste("Most reasonable estimate is",p))
```

---

**R code Exa 6.2** Some general concepts of point estimation

```
1 #Ex6.2, Page 241
2 #Answers may vary slightly due to rounding off of
  values
3
4 volt<-c
  (24.46,25.61,26.25,26.42,26.66,27.15,27.31,27.54,27.74,27.94,27.98)
5
6 #Estimator1
```

```

7 x1<-mean(volt)
8 print(paste("Estimator (1) :" ,x1))
9
10 #Estimator2
11 x2<-median(volt)
12 print(paste("Estimator (2) :" ,x2))
13
14 #Estimator3
15 x3<-(min(volt)+max(volt))/2
16 print(paste("Estimator (3) :" ,x3))
17
18 #Estimator4
19 volt<-setdiff(volt,c(volt[1],volt[2],volt[19],volt
20 [20]))
21 x4<-mean(volt)
22 print(paste("Estimator (4) :" ,x4))

```

---

**R code Exa 6.3** Some general concepts of point estimation

```

1 #Ex6.3, Page 242
2 #Answers may vary slightly due to rounding off of
   values
3
4 obs<-c
   (74.33,71.07,73.82,77.42,79.35,82.27,77.75,78.65,77.19,74.69,
5
   77.25,74.84,60.90,60.75,74.09,65.36,67.84,69.97,68.83,75.09,
6
   62.54,67.47,72.00,66.51,68.21,64.46,64.34,64.93,67.33,66.08,
7
   67.31,74.87,69.40,70.83,81.73,82.50,79.87,81.96,79.51,84.12,
8
   80.61,79.89,79.70,78.74,77.28,79.97,75.09,74.38,77.67,83.73,
9
   80.39,76.90)

```

```

10
11 #Mean
12 print(paste("Mean=", mean(obs)))
13
14 #Variance
15 print(paste("Point estimate of the population
16 variance:", var(obs)))
17 #Alternative formula
18 #To find numerator of s^2
19 s1<-sum(obs)
20 s2<-sum(obs^2)
21 Sxx<-s2-(s1^2)/length(obs)
22
23 #Standard deviation
24 print(paste("Point estimate of the population
25 standard deviation:", sd(obs)))
26 #Alterative estimator
27 print(paste("Alternative estimator of population
variance:", Sxx/length(obs)))

```

---

### R code Exa 6.9 Standard error of an estimator

```

1 #Ex6.9 , Page 251
2 #Answers may slightly vary due to rounding off of
values
3
4 n<-20
5 sigma<-1.5
6
7 #Standard error of mean
8 sigx<-sigma/sqrt(n)
9 print(paste("Standard error of mean:", sigx))
10

```

```
11 #Estimate of standard deviation
12 s<-1.462
13
14 sx<-s/sqrt(n)
15 print(paste("Estimated standard error:",sx))
```

---

### R code Exa 6.10 Standard error of an estimator

```
1 #Ex6.10 , Page 251
2 #Answers may vary slightly due to rounding off of
   values
3
4 n<-25
5 p<-0.6
6 q<-1-p
7
8 #To find estimated standard error
9 sp1<-sqrt((p*q)/n)
10 print(paste("Estimated standard error:",sp1))
11
12 #pq is largest when
13 p<-q<-0.5
14 sp2<-sqrt((p*q)/n)
15 print(paste("Estimated standard error when pq is
   largest:",sp2))
```

---

### R code Exa 6.11 Standard error of an estimator

```
1 #Ex6.11 , Page 252
2 #Answers may slightly vary due to rounding off of
   values
3
```

```

4 t<-c
(41.53,18.73,2.99,30.34,12.33,117.52,73.02,223.63,4.00,26.78)

5
6 #Mean
7 m<-mean(t)
8 print(paste("Mean:",m))
9
10 #lambda(1)
11 l<-1/m
12 print(paste("Reasonable estimate of lambda:",l))

```

---

### R code Exa 6.13 Method of moments

```

1 #Ex6.13, Page 257
2 #Answers may vary slightly due to rounding off of
  values
3
4 data<-c
(152,115,109,94,88,137,152,77,160,165,125,40,128,123,136,101,62,19
5 n<-length(data)
6
7 #Mean
8 m<-mean(data)
9 print(paste("Mean:",m))
10
11 #Sum of x^2
12 s<-sum(data^2)/n
13
14 #alpha
15 alpha<-(m^2)/(s-(m^2))
16 print(paste("Alpha:",alpha))
17
18 #beta

```

```
19 beta<-(s-(m^2))/m  
20 print(paste(" Beta:",beta))
```

---

### R code Exa 6.14 Method of moments

```
1 #Ex6.14 , Page 257  
2 #Answers may vary slightly due to rounding off of  
  values  
3  
4 goals<-c(0,1,2,3,4,5,6,7,8,9,10)  
5 freq<-c(29,71,82,89,65,45,24,7,4,1,3)  
6  
7 #Mean  
8 m<-weighted.mean(goals,freq)  
9 print(paste("Mean=",m))  
10  
11 #To find sum of x^2  
12 ms<-weighted.mean(goals^2,freq)  
13 print(paste("Sum of x^2/frequency=",ms))  
14  
15 #To find alpha  
16 p_cap<-m/(ms-(m^2))  
17 print(paste(" Alpha:",p_cap))  
18  
19 #To find beta  
20 r_cap<-(m^2)/(ms-(m^2)-m)  
21 print(paste(" Beta:",r_cap))
```

---

### R code Exa 6.21 The invariance principle

```
1 #Ex6.21 , Page 262  
2 #Answers may slightly vary due to rounding off of  
  values
```

```
3
4 alpha<-11.9731
5 beta<-77.0153
6 m<-beta*gamma(1+(1/alpha))
7 print(paste("Mean estimate:",m))
```

---

# Chapter 7

## Statistical intervals based on a single sample

**R code Exa 7.2** Basic properties of confidence intervals

```
1 #Ex7.2 , Page 270
2 #Answers may slightly vary due to rounding off of
  values
3
4 mean<-80
5 n<-31
6 sd<-2
7 error<-qt(0.95,df=n-1)*sd/sqrt(n)
8
9 #Left endpoint
10 l<-mean-error
11 print(paste("Left endpoint of interval:",l))
12
13 #Right endpoint
14 r<-mean+error
15 print(paste("Right endpoint of interval:",r))
```

---

### R code Exa 7.3 Other levels of confidence

```
1 #Ex7.3 , Page 272
2 #Answers may slightly vary due to rounding off of
  values
3
4 mean<-5.426
5 n<-40
6 sd<-0.1
7
8 #To find alpha for (100(1-alpha)=90)
9 alpha<-solve(100,10)
10
11 error<-qnorm(1-(alpha/2))*(sd/sqrt(n))
12
13 #Left endpoint
14 l<-mean-error
15 print(paste("Left endpoint of interval:",l))
16
17 #Right endpoint
18 r<-mean+error
19 print(paste("Right endpoint of interval:",r))
```

---

### R code Exa 7.4 Confidence level and precision and sample size

```
1 #Ex7.4 , Page 273
2 #Answers may slightly vary due to rounding off of
  values
3
4 #For 95% CI
5 z<-qnorm(1-(0.05/2))
6
7 sd<-25
8 w<-10
9
```

```
10 n<-(2*z*sd/w)^2
11 print(paste("Sample size necessary for CI to have
width 10 is ",n,"and thus approx. 97"))
```

---

### R code Exa 7.6 Large sample CI for mean

```
1 #Ex7.6, Page 277–278
2 #Answers may slightly vary due to rounding off of
values
3
4 data<-c
  (2948,2996,7197,8338,8500,8759,12710,12925,15767,20000,23247,24863,
5 26210,30552,30600,35700,36466,40316,40596,41021,41234,43000,44607,45
6 45027,45442,46963,47978,49518,52000,53334,54208,56062,57000,57365,60
7 60265,60803,62851,64404,72140,74594,79308,79500,80000,80000,84000,11
8 boxplot(data)
9 print(data)
10
11 n<-50
12
13 #To find mean
14 mean<-mean(data)
15 print(paste("Mean:",mean))
16
17 #To find median
18 med<-median(data)
19 print(paste("Median:",med))
20
21 #To find standard deviation
22 s<-sd(data)
23 print(paste("Standard deviation:",s))
```

```
24
25 #To find confidence intervals
26 z<-qnorm(1-(0.05/2))
27 error<-z*(s/sqrt(n))
28
29 #Left endpoint
30 l<-mean-error
31 print(paste("Left endpoint of interval:",l))
32
33 #Right endpoint
34 r<-mean+error
35 print(paste("Right endpoint of interval:",r))
```

---

**R code Exa 7.7** Large sample CI for mean

```
1 #Ex7.7, Page 279
2
3 t1<-320
4 t2<-440
5
6 #To find value of s
7 s<-(t2-t1)/4
8
9 w<-5
10
11 z<-qnorm(1-(0.05/2))
12
13 n<-(z*s/w)^2
14 print(paste("Sample size:",n))
15 print(paste("Integer value of sample size:",ceiling(n)))
```

---

**R code Exa 7.8** CI for population proportion

```
1 #Ex7.8 , Page 282
2 #Answer may vary slightly compared to textbook value
3
4 n<-48
5 n1<-16
6 p<-n1/n
7
8 alpha<-0.05
9 b<-binom.test(16,48,p,conf.level=0.95)
10 print(b)
```

---

### R code Exa 7.10 Confidence bounds

```
1 #Ex7.10 , Page 283
2 #Answer may slightly vary due to rounding off of
  value
3
4 mean<-17.17
5 z<-qnorm(0.95)
6 n<-48
7 sd<-3.28
8
9 #To find lower bound
10 c<-mean-(z*sd/sqrt(n))
11 print(paste("Lower confidence bound for mean:",c))
```

---

### R code Exa 7.11 One sample t confidence interval

```
1 #Ex7.11 , Page 288
2 #Answers may slightly vary due to rounding off of
  values
```

```

3 data<-c
(6807.99 ,7637.06 ,6663.28 ,6165.03 ,6991.41 ,6992.23 ,6981.46 ,7569.75 ,
4 7437.88 ,6872.39 ,7663.18 ,6032.28 ,6906.04 ,6617.17 ,6984.12 ,7093
5 7659.50 ,7378.61 ,7295.54 ,6702.76 ,7440.17 ,8053.26 ,8284.75 ,7347
6 7422.69 ,7886.87 ,6316.67 ,7713.65 ,7503.33 ,7674.99)

7
8 n<-30
9
10 #To find mean
11 mean<-mean(data)
12 print(paste("Mean:",mean))
13
14 #To find standard deviation
15 s<-sd(data)
16 print(paste("Standard deviation:",s))
17
18 #To find confidence intervals
19 t<-qt(1-(0.05/2),df=n-1)
20 print(paste("Critical value ,t:",t))
21 error<-t*(s/sqrt(n))
22
23 #Left endpoint
24 l<-mean-error
25 print(paste("Left endpoint of interval:",l))
26
27 #Right endpoint
28 r<-mean+error
29 print(paste("Right endpoint of interval:",r))
30
31 #To plot the normal probability plot
32 qqnorm(data,main="Normal Probability of MOR")

```

---

**R code Exa 7.12** A prediction interval for a single future value

```
1 #Ex7.12 , Page 288
2 #Answers may slightly vary due to rounding off of
   values
3
4 data<-c
   (25.2,21.3,22.8,17.0,29.8,21.0,25.5,16.0,20.9,19.5)

5 print(data)
6
7 n<-10
8
9 #To find mean
10 mean<-mean(data)
11 print(paste("Mean:",mean))
12
13 #To find standard deviation
14 s<-sd(data)
15 print(paste("Standard deviation:",s))
16
17 #To find confidence intervals
18 t<-qt(1-(0.05/2),df=n-1)
19 print(paste("Critical value ,t : ",t))
20 error<-t*(s/sqrt(n))
21
22 #Left endpoint
23 l<-mean-error
24 print(paste("Left endpoint of interval : ",l))
25
26 #Right endpoint
27 r<-mean+error
28 print(paste("Right endpoint of interval : ",r))
```

---

### R code Exa 7.13 Prediction interval

```
1 #Ex7.13 , Page 290
2 #Answers may slightly vary due to rounding off of
   values
3
4 mean<-21.9
5 s<-4.134
6 n<-10
7
8 #To find critical value
9 t<-qt(1-(0.05/2),df=n-1)
10 print(paste("Critical value ,t :" ,t))
11
12 error<-t*s*sqrt(1+(1/n))
13
14 #Left endpoint
15 l<-mean-error
16 print(paste("Left endpoint of prediction interval :" ,
   1))
17
18 #Right endpoint
19 r<-mean+error
20 print(paste("Right endpoint of prediction interval :" ,
   r))
```

---

### R code Exa 7.14 Tolerance intervals

```
1 #Ex7.14 , Page 291
2 #Answers may vary slightly due to rounding off of
   values
3
```

```

4  data<-c
      (10490 ,16620 ,17300 ,15480 ,12970 ,17260 ,13400 ,13900 ,
5      13630 ,13260 ,14370 ,11700 ,15470 ,17840 ,14070 ,14760)

6  print(data)
7
8 n<-16
9
10 #To find mean
11 mean<-mean(data)
12 print(paste("Mean:",mean))
13
14 #To find standard deviation
15 s<-sd(data)
16 print(paste("Standard deviation:",s))
17
18 #To find tolerance intervals
19 t1<-2.903
20 error1<-t1*s
21 #Left endpoint
22 l1<-mean-error1
23 print(paste("Left endpoint of tolerance interval:",l1))
24 #Right endpoint
25 r1<-mean+error1
26 print(paste("Right endpoint of tolerance interval:",r1))
27
28 #To find confidence intervals
29 t2<-qt(1-(0.05/2),df=n-1)
30 error2<-t2*(s/sqrt(n))
31 #Left endpoint
32 l2<-mean-error2
33 print(paste("Left endpoint of confidence interval:",l2))
34 #Right endpoint
35 r2<-mean+error2
36 print(paste("Right endpoint of confidence interval:",r2))

```

```

            ,r2))
37
38 #To find prediction intervals
39 t3<-qt(1-(0.05/2),df=n-1)
40 error3<-t3*s*sqrt(1+(1/n))
41 #Left endpoint
42 l3<-mean-error3
43 print(paste("Left endpoint of prediction interval:",
44           l3))
44 #Right endpoint
45 r3<-mean+error3
46 print(paste("Right endpoint of prediction interval:"
47           ,r3))

```

---

**R code Exa 7.15** CI for variance and sd of normal population

```

1 #Ex7.15 , Page 296
2 #Answers may slightly vary due to rounding off of
   values
3
4 data<-c
   (1470,1510,1690,1740,1900,2000,2030,2100,2190,
5           2200,2290,2380,2390,2480,2500,2580,2700)
6
7 interval<- function(data,conf.level=0.95){
8   df<-length(data)-1
9   l<-qchisq((1 - conf.level)/2, df)
10  r<-qchisq((1 - conf.level)/2, df, lower.tail =
   FALSE)
11  v<-var(data)
12  c(df*v/r,df*v/l)
13 }
14 print(paste("Confidence interval for variance of
   normal population:"))
15 print(interval(data))

```



# Chapter 8

## Test of hypotheses based on a single sample

**R code Exa 8.1** Hypotheses and test procedures

```
1 #Ex8.1, Page 304
2 #Answers may vary slightly due to rounding off of
  values
3
4 #X<-number of crashes with no visible damage
5 #Reject H0 if x>=8 (x<-observed value of test
  statistic)
6
7 #When H0 is true
8 n<-20
9 p1<-0.25
10
11 #alpha=P(type I error)
12 alpha<-1-pbinom(7,n,p1)
13 print(paste("Alpha value:",alpha))
14
15 print(paste("When H0 is true, roughly",trunc(100*
  alpha,digits=2),"% of all experiments consisting
  of 20 crashes would result into a Type I error"))
```

```

16
17 #beta=P(type II error)
18 #Different beta for each different p that exceeds
19 # 0.25, thus taking p=0.3
20 p2<-0.3
21 beta<-pbinom(7,n,p2)
22 print(paste("Beta value:",beta))
23 print(paste("When H0 is false, roughly",trunc(100*
24   beta,digits=2),"% of all experiments would result
25   into a Type II error"))
26
27 #Table showing variation of beta values with
28 # increase in value of p
29 for(i in 3:8){
30   p<-0.1*i
31   a<-pbisnom(7,n,p)
32   print(paste("p-value:",p))
33   print(paste("Beta value:",a))
34 }

```

---

### R code Exa 8.2 Hypotheses and test procedures

```

1 #Ex8.2, Page 305
2 #Answers may vary slightly due to rounding off of
2 # values
3
4 m<-75
5 sd<-9
6 #Hypotheses H0: mean=75, H1: mean<75
7
8 #Experimental data
9 n<-25
10 sd<-9
11 #Standard deviation of normal distribution
12 sdx<-sd/sqrt(n)

```

```

13 print(paste("SD of normal distribution:", sdx))
14
15 #When H0 is true
16 mx<-75
17
18 #Consider rejection region x<=70.8
19 #To find alpha and beta
20
21 #P(type I error)
22 alpha<-pnorm(70.8, mx, sdx)
23 print(paste("Alpha value:", alpha))
24
25 #P(type II error)
26 mx<-c(72, 70, 67)                      #H0 is not rejected
                                               when it is false because mean= eg:72
27 for(i in mx){
28   beta<-1-pnorm(70.8, i, sdx)
29   print(paste("Beta value:", beta, "when mean is", i))
30 }
31
32 print(paste("Only", round(alpha, digits=3)*100, "% of
               all experiments will result into Type I error"))
33 print(paste("Possibility of Type II error decreases
               as mean value increases"))

```

---

### R code Exa 8.3 Hypotheses and test procedures

```

1 #Ex8.3, Page 306
2 #Answers may vary slightly due to rounding off of
  values
3
4 #R9={9,10,.....,20}
5 n<-20
6
7 #To find alpha=P(H0 rejected when p=.25)=P(X>=9 when

```

```

    X follows binomial dist.)
8 p<-0.25
9 alpha<-1-pbinom(8,n,p)
10 print(paste("Alpha value:",alpha))
11 print(paste("Type I error probability has reduced
considerably when using R9 rather than R8
rejection region"))
12
13 #To find beta value=P(H0 not rejected)=P(X<=8 when X
follows binomial dist.)
14 p1<-0.3      #1st case
15 beta1<-pbinom(8,n,p1)
16 print(paste("Beta (0.3)=" ,beta1))
17
18 p2<-0.5      #2nd case
19 beta2<-pbinom(8,n,p2)
20 print(paste("Beta (0.5)=" ,beta2))
21 print(paste("P(Type II error in R9)>P(Type II error
in R8)"))

```

---

#### R code Exa 8.4 Hypotheses and test procedures

```

1 #Ex8.4, Page 307
2 #Answers may vary slightly due to rounding off of
values
3
4 #New rejection region x<=72
5 sdx<-1.8
6
7 #To find alpha=P(H0 rejected when true)=P(X<=72 when
X follows normal dist)
8 mx<-75
9 alpha<-pnorm(72,mx,sdx)
10 print(paste("Alpha value:",alpha))
11 print(paste("Type I error probability is greater in

```

```

          the new rejection region"))
12
13 #To find beta=P(H0 not rejected)
14 mx<-c(72,70,67)                      #H0 is not rejected
   when it is false because mean= eg:72
15 for(i in mx){
16   beta<-1-pnorm(72,i,sdx)
17   print(paste("Beta(",i,"):",beta))
18 }
19 print(paste("Type II error probability is lower in
   the new rejection region"))

```

---

### R code Exa 8.5 Hypotheses and test procedures

```

1 #Ex8.5, Page 308
2
3 #H0: mu=1.5
4 #Ha: mu>1.5
5
6 mu0<-1.5
7 n<-32
8 sd<-0.2
9 sdx<-sd/sqrt(n)
10 print(paste("Rejection region: Z>=c"))
11
12 alpha<-0.05
13 #where alpha=P(type I error)=P(Z>=c when Z follows N
   (0,1))
14 c<-qnorm(1-alpha)
15 print(paste("C value:",c))
16
17 #Z>=c
18 x<-round(mu0+sdx*c,digits=2)
19 print(paste("xbar>=",x))
20 print(paste("Beta refers to the prob. that xbar<",x,

```

” and can be calculated for any mu>1.5”))

---

### R code Exa 8.6 Tests about a population mean

```
1 #Ex8.6, Page 312
2 #Answers may vary slightly due to rounding off of
   values
3
4 mu0<-130
5 n<-9
6 sd<-1.5
7 xbar<-131.08
8
9 z<-(xbar-mu0)/(sd/sqrt(n))           #Test statistic
   value
10 print(paste("Test statistic value:",z))
11
12 #To determine rejection region
13 alpha<-0.01
14 a<-qnorm(1-alpha/2)
15 l<-(-a)
16 r<-a
17 print(paste("Rejection region: z<=",l," ,z>=",r))
18 if(z<=l || z>=r)print(paste(z," falls in the
   rejection region and H0 is rejected"))else print(
   paste(z,"does not fall in the rejection region so
   H0 cannot be rejected at significance level",
   alpha))
```

---

### R code Exa 8.7 Tests about a population mean

```
1 #Ex8.7, Page 314
```

```

2 #Answers may vary slightly due to rounding off of
   values
3
4 n<-16
5 sd<-1500
6 alpha1<-0.01
7 xbar<-30000
8 mu0<-31000
9
10 zalpha1<-qnorm(1-alpha1)
11
12 z<-(xbar-mu0)/(sd/sqrt(n))
13
14 #To find beta(31000) when alpha=0.01
15 beta1<-pnorm(zalpha1+z)
16 print(paste("Beta(31000):",beta1,"when alpha=",
   alpha1))
17
18 alpha2<-0.1
19 zalpha2<-qnorm(1-alpha2)
20
21 #To find beta(31000) when alpha=0.1
22 beta2<-pnorm(zalpha2+z)
23 print(paste("Beta(31000):",round(beta2,digits=1),""
   when alpha=",alpha2))
24
25 #To find n
26 n<-(sd*(zalpha1+zalpha2)/(xbar-mu0))^2
27 print(paste("n value:",n))
28 print(paste("Sample size=",ceiling(n)))

```

---

**R code Exa 8.8** Tests about a population mean

```

1 #Ex8.8, Page 315
2 #Answers may vary slightly due to rounding off of

```

```

      values
3
4 n<-52
5 mu0<-30
6 data<-c
    (14.1,14.5,15.5,16.0,16.0,16.7,16.9,17.1,17.5,17.8,17.8,18.1,18.2
7           19.0,19.2,19.4,20.0,20.0,20.8,20.8,21.0,21.5,23.5,27.5,27.5,
8           30.0,31.6,31.7,31.7,32.5,33.5,33.9,35.0,35.0,35.0,35.0,36.7,40.0,
9           47.5,50.0,51.0,51.8,54.4,55.0,57.0)
10 xbar<-mean(data)
11 sd<-sd(data)
12 print(paste("Mean:",xbar))
13 print(paste("Standard deviation:",sd))
14
15 alpha<-0.05
16 #To find zalpha
17 z1<-qnorm(alpha)
18
19 #To find z
20 z<-(xbar-mu0)/(sd/sqrt(n))
21 print(paste("z value:",z))
22
23 if(z>z1) print(paste("H0 cannot be rejected since",z
,">",z1)) else print(paste("H0 is rejected since"
,z,"<",z1))

```

---

### R code Exa 8.9 Tests about a population mean

```

1 #Ex8.9, Page 317
2 #Answers may vary slightly due to rounding off of
  values
3

```

```

4 data<-c(2.67,4.62,4.14,3.81,3.83)
5 n<-length(data)
6
7 alpha<-0.05
8 mu0<-4
9
10 #To determine rejection region
11 t1<-qt(1-alpha/2,df=n-1)
12 l<-(-t1)
13 r<-t1
14 print(paste("Rejection region: t<=" ,l," ,t>=" ,r))
15
16 #To find mean
17 print(paste("Sum of sample:" ,sum(data)))
18 print(paste("Mean:" ,mean(data)))
19
20 #To find standard deviation
21 print(paste("Standard deviation:" ,sd(data)))
22 print(paste("Estimated standard error of the mean:" ,
sd(data)/sqrt(n)))
23
24 #Test statistic value
25 t1<-t.test(data,alternative="two.sided",mu=mu0)
26 print(t1)

```

---

**R code Exa 8.11** Tests concerning a population proportion

```

1 #Ex8.11, Page 324
2 #Answers may vary slightly due to rounding off of
  values
3
4 #H0:p=0.15
5 #Ha:p>0.15
6
7 p0<-0.15

```

```

8 q0<-1-p0
9 n<-91
10 n1<-16
11
12 #Check validity of test procedures
13 if(n*p0>10 && n*q0>10) print(paste("Large sample z
    test can be used")) else print(paste("z test
    cannot be used"))
14
15 alpha<-0.1
16 zalpha<-qnorm(1-alpha)
17 print(paste("Rejection region: z>=",zalpha))
18
19 p<-n1/n
20 print(paste("p-cap:",p))
21
22 #To find z
23 z<-(p-p0)/(sqrt(p0*q0/n))
24 print(paste("Test statistic value:",z))
25
26 if(z<zalpha)print(paste("z=",z," is not in the
    rejection region and hence, H0 cannot be rejected
    ")) else print(paste("z is in the rejection
    region"))

```

---

**R code Exa 8.12** Tests concerning a population proportion

```

1 #Ex8.12 , Page 326
2 #Answers may vary slightly due to rounding off of
   values
3
4 #H0: p=0.9
5 #Ha: p<0.9
6
7 n<-225

```

```

8 p0<-0.9
9 pdash<-0.8
10 alpha<-0.01
11
12 zalpha<-qnorm(1-alpha)
13
14 #To find beta(0.8)
15 num<-p0-pdash-(zalpha*sqrt((p0*(1-p0))/n))
16 denom<-sqrt(pdash*(1-pdash)/n)
17 beta<-1-pnorm(num/denom)
18 print(paste("Beta(0.8) : ",beta))
19
20 #P(H0 rejected)
21 prob<-1-beta
22 print(paste("P(H0 rejected) = ",prob," and thus ,",
23   ceiling(prob*100)," % of samples will result in
24   correct H0 rejection"))
25
26 #To find n
27 n<-((zalpha*sqrt(p0*(1-p0))+zalpha*sqrt(pdash*(1-
28   pdash)))/(pdash-p0))^2
29 print(paste("Sample size : ",ceiling(n)))

```

---

**R code Exa 8.13** Tests concerning a population proportion

```

1 #Ex8.13 , Page 327
2
3 #H0: p=0.9
4 #Ha: p<0.9
5 #Rejection region: x<=15
6
7 n<-20
8 pdash<-0.8
9 alpha<-0.05
10

```

```

11 #To find beta=P(H0 not rejected when X follows
   binomial dist)
12 beta<-1-pbinom(15,n,pdash)
13 print(paste("Beta(",pdash,")=",round(beta,digits=2)))
14
15 print(paste(ceiling(beta*100),"% of all samples
   causes H0 to be rejected incorrectly when p=",pdash))

```

---

### R code Exa 8.14 P values

```

1 #Ex8.14 , Page 329
2 #Answers may vary slightly due to rounding off of
   values
3
4 #H0: mu=2.0
5 #Ha: mu>2.0
6
7 mu0<-2
8 xbar<-2.06
9 sd<-0.141
10 n<-51
11
12 #To find z value
13 z<-(xbar-mu0)/(sd/sqrt(n))
14 print(paste("Test statistic value:",z))
15
16 #To find P-value=P(Z>=z when mu=2.0)
17 p<-1-pnorm(z)
18 print(paste("P-value:",p))
19
20 alpha<-c(0.01,0.001)
21 for(i in alpha){
22   if(p<=i)

```

```

23     print(paste("H0 rejected when significance
24         level is at",i))
25     else
26         print(paste("H0 not rejected when
27             significance level is at",i))
28 }
```

---

### R code Exa 8.15 P values

```

1 #Ex8.15 , Page 330
2 #Answers may vary slightly due to rounding off of
   values
3
4 #H0: mu=15
5 #Ha: mu>1.5
6
7 z<-2.10
8
9 #To determine p-value
10 p<-1-pnorm(z)
11 print(paste("P-value:",p))
12
13 alpha<-c(0.1,0.05,0.01)
14 for(i in alpha){
15     z1<-qnorm(1-i)
16     if(z>=z1)
17         print(paste("Reject H0 at significance level",i))
18     else
19         print(paste("Do not reject H0 at significance
           level",i))
20 }
21
22 #Using p-value approach
23 print(paste("Using p-value approach:"))
```

```

24 for(j in alpha){
25   if(j>=p)
26     print(paste(" Reject H0 at significance level ",j,
27               " since ",j,">=",p))
28   else
29     print(paste("Do not reject H0 at significance
level ",j," since ",j,"<",p))

```

---

### R code Exa 8.17 P values for z tests

```

1 #Ex8.17 , Page 333
2 #Answers may vary slightly due to rounding off of
values
3
4 #H0: mu=245
5 #Ha: mu!=245
6
7 xbar<-246.18
8 mu0<-245
9 n<-50
10 sd<-3.6
11 alpha<-0.01
12
13 #To find z value
14 z<-(xbar-mu0)/(sd/sqrt(n))
15 print(paste("Test statistic value:",z))
16
17 #To find p value in two tailed experiment
18 p<-2*(1-pnorm(z))
19 print(paste("P-value:",p))
20
21 if(p>alpha) print(paste("H0 not rejected at
significance level ",alpha)) else print(paste("H0
rejected at significance level ",alpha))

```

---

### R code Exa 8.18 P values for t tests

```
1 #Ex8.18 , Page 335
2
3 #H0: mu=4
4 #Ha: mu!=4
5
6 n<-5
7 t<-round(-0.594,digits=1)
8 df<-n-1
9
10 alpha<-0.05
11
12 #To find critical values
13 a<-qt(1-alpha/2,df=n-1)
14
15 #Since test is two tailed
16 p<-2*pt(t,df=n-1)
17 print(paste("P-value:",round(p,digits=2)))
18
19 b<-c(0.01,0.05,0.1)
20 for(i in b){
21   if(p>i)
22     print(paste("H0 is not rejected at significance
23       level",i))
24   else
25     print(paste("H0 rejected at significance level",
26       i))}
```

---

### R code Exa 8.19 Interpreting P values

```

1 #Ex8.19 , Page 335
2 #Answers may vary slightly due to rounding off of
   values
3 #Tests for mean=20 have only been done....
4
5 #H0: mu=20
6 #Ha: mu>20
7
8 n<-4
9 df<-n-1
10 mu0<-20
11 sd<-2
12 x<-c(20.83,22.232,20.276,17.718)
13
14 xbar<-mean(x)
15 print(paste("Mean:",xbar))
16 s<-sd(x)
17 print(paste("Standard deviation:",s))
18
19 #To find t
20 t<-(xbar-mu0)/(s/sqrt(n))
21 print(paste("Test statistic value:",t))
22
23 #To find p value
24 p<-pt(t,df=n-1,lower.tail = FALSE)
25
26 alpha<-0.05
27 if(p>alpha) print(paste("H0 is not rejected at
   significance level",alpha)) else print(paste("H0
   is rejected at significance level",alpha))

```

---

# Chapter 9

## Inferences based on two samples

**R code Exa 9.1** Test procedures for normal population with known variances

```
1 #Ex9.1 , Page 348
2 #Answers may slightly vary due to rounding off of
   values
3
4 #H0: mu1-mu2=0
5 #Ha: mu1-mu2 !=0
6
7 xbar<-29.8
8 ybar<-34.7
9 s1<-4
10 s2<-5
11 m<-20
12 n<-25
13
14 #To find percentile
15 alpha<-0.01
16 H0<-qnorm(1-alpha/2)
17
```

```

18 #To find test statistic value
19 z<-(xbar-ybar)/sqrt((s1^2)/m+(s2^2)/n)
20 print(paste("Test statistic value:",z))
21
22 if(z>=H0 || z<=H0) print(paste("H0 is rejected at level
      ",alpha)) else print(paste("H0 is accepted at
      level",alpha))

```

---

**R code Exa 9.2** Using a comparison to identify causality

```

1 #Ex9.2, Page 349
2 #Answers may slightly vary due to rounding off of
   values
3
4 #H0: mu1-mu2=0
5 #Ha: mu1-mu2>0
6
7 xbar<-48.9
8 ybar<-43.2
9 s1<-14.6
10 s2<-14.4
11 m<-125
12 n<-90
13 alpha<-0.01
14
15 #To find test statistic value
16 z<-(xbar-ybar)/sqrt((s1^2)/m+(s2^2)/n)
17 print(paste("Test statistic value:",z))
18
19 #To find p-value
20 p<-pnorm(-abs(z))
21 print(paste("p-value:",p))
22
23 if(alpha>p) print(paste("H0 is rejected at level",
      alpha)) else print(paste("H0 is accepted at
      level",alpha))

```

```
level",alpha))
```

---

### R code Exa 9.3 Beta and the choice of sample size

```
1 #Ex9.3, Page 350
2 #Answers may slightly vary due to rounding off of
  values
3
4 t<-5
5 t1<-0
6 s<-1.34
7 n<-qnorm(1-0.01/2)
8 beta<-pnorm(n-((t-t1)/s))-pnorm(-n-((t-t1)/s))
9 print(paste("Beta(5):",beta))
```

---

### R code Exa 9.4 Large sample tests

```
1 #Ex9.4, Page 352
2 #Answers may vary slightly due to rounding off of
  values
3
4 mu1<-2258
5 mu2<-2637
6 s1<-1519
7 s2<-1138
8 m<-663
9 n<-413
10 l<-0.05
11 H0<-(-200)
12
13 #To find z0.05
14 z1<-qnorm(1-l)
15
```

```

16 #To find test statistic value
17 z<- (mu1-mu2-H0)/sqrt(((s1^2)/m+(s2^2)/n))
18 print(paste("Test statistic value:",z))
19
20 if(z<=-z1) print(paste("H0 is rejected since",z,"<=",-z1))
21
22 #To find p-value
23 p<-pnorm(-abs(z))
24 print(paste("P-value:",p))
25 if(p<=1) print(paste("H0 is rejected since",p,"<=",1))

```

---

### R code Exa 9.5 Confidence intervals for difference of means

```

1 #Ex9.5, Page 354
2 #Answers may vary slightly due to rounding off
  values
3
4 c1<-c('Variable_diam','N','Mean','Median','
      TrMean','StDev','SEMean','Min','Max','Q1','
      Q3')
5 c2<-c('3/8',
      ,78,4.250,4.230,4.238,1.300,0.147,1.634,7.327,3.389,5.075)
6 c3<-c('1/2',
      ,88,7.140,7.113,7.150,1.680,0.179,2.450,11.343,5.965,8.447)
7 df<-data.frame(c1,c2,c3)
8 print(df)
9
10 mu1<-4.25
11 mu2<-7.14
12 z<-qnorm(1-(0.05/2))
13 s1<-1.3

```

```

14 s2<-1.68
15 m<-78
16 n<-88
17
18 #To find confidence intervals
19 l<-(mu1-mu2)-z*sqrt((s1^2)/m+(s2^2)/n)
20 r<-(mu1-mu2)+z*sqrt((s1^2)/m+(s2^2)/n)
21 print(paste("Left endpoint of interval:",l))
22 print(paste("Right endpoint of interval:",r))

```

---

### R code Exa 9.6 Two sample t test and confidence interval

```

1 #Ex9.6, Page 358
2 #Answers may vary slightly due to rounding off of
  values
3
4 Fabric_type<-c('Cotton','Triacetate')
5 Sample_size<-c(10,10)
6 Sample_mean<-c(51.71,136.14)
7 Sample_standard_deviation<-c(.79,3.59)
8 data<-data.frame(Sample_size,Sample_mean,Sample_
  standard_deviation,row.names=Fabric_type)
9 print(data)
10
11 #Assigning values to variables
12 s1<-Sample_standard_deviation[1]
13 s2<-Sample_standard_deviation[2]
14
15 xbar<-Sample_mean[1]
16 ybar<-Sample_mean[2]
17
18 m<-Sample_size[1]
19 n<-Sample_size[2]
20
21 #To find df

```

```

22 num<-((s1^2/m)+(s2^2/n))^2
23 denom<-((s1^2/m)^2/(m-1)+((s2^2/n)^2)/(n-1))
24 df<-num/denom
25 print(paste(" df:",df))
26
27 #To find t value
28 alpha<-0.05
29 t<-qt(1-alpha/2,df=m-1)
30 print(paste(" t:",t))
31
32 #To find intervals
33 l<-xbar-ybar-t*sqrt((s1^2/m)+(s2^2/n))
34 r<-xbar-ybar+t*sqrt((s1^2/m)+(s2^2/n))
35 print(paste(" Left endpoint of interval:",l))
36 print(paste(" Right endpoint of interval:",r))
37
38 print(paste("The true average porosity of the
triacetate fabric is greater than that of the
cotton fabric by between",round(-r,digits=2)," and
",round(-l,digits=2),"cm^3/cm^2/sec"))

```

---

### R code Exa 9.7 Two sample t test and confidence interval

```

1 #Ex9.7, Page 359
2 #Answers may vary slightly due to rounding off of
  values
3
4 No_fusion<-c
  (2748,2700,2655,2822,2511,3149,3257,3213,3220,2753)

5 Fused<-c(3027,3356,3359,3297,3125,2910,2889,2902)
6
7 #H0: mu1-mu2=0
8 #Ha: mu1-mu2<0
9

```

```

10 #To find test staistic value
11 t<-t.test(No_fusion,Fused)
12 print(t)
13 print(paste("t statistic value:",t$statistic))
14 print(paste("df:",t$parameter))
15
16 #To plot normal probability plots
17 par(mfrow=c(2,1))
18 qqnorm(No_fusion,datax=TRUE,ylab="Not fused",xlab="Probability",main="Normal probability plot for not fused data")
19 qqline(No_fusion,datax=TRUE)
20 qqnorm(Fused,datax=TRUE,ylab="Fused",xlab="Probability",main="Normal probability plot for fused data")
21 qqline(Fused,datax=TRUE)

```

---

### R code Exa 9.9 Paired t test

```

1 #Ex9.9, Page 367
2 #Answers may vary slightly due to rounding off of values
3
4 Subject<-c(1,2,3,4,5,6,7,8,9,10,11,12,13,14,15,16)
5 Before<-c
6   (81,87,86,82,90,86,96,73,74,75,72,80,66,72,56,82)
6 After<-c
7   (78,91,78,78,84,67,92,70,58,62,70,58,66,60,65,73)
7 Difference<-Before-After
8 data<-data.frame(Before,After,Difference, row.names=Subject)
9 print(data)
10
11 #Normal probability plot
12 par(mfrow=c(1,2))

```

```

13 qqnorm(data$Difference, main="Normal probability plot
          of the differences", xlab=" diff", ylab="
          Probability")
14 qqline(data$Difference)
15 boxplot(Difference, horizontal=TRUE, xlab=" Difference"
           )
16
17 #H0: mu=0
18 #Ha: mu!=0
19 t1<-t.test(Difference, mu=0)
20 print(paste("t statistic value:", t1$statistic))
21 print(paste("p value:", t1$p.value))
22
23 alpha<-0.01
24 if(t1$p.value<alpha) print(paste("H0 rejected"))
   else print(paste("H0 not rejected"))

```

---

### R code Exa 9.10 Paired t confidence interval

```

1 #Ex9.10 , Page 369
2 #Answers may vary slightly due to rounding off of
   values
3
4 Subject<-c(1,2,3,4,5,6,7,8,9,10,11,12,13)
5 Slide<-c(30,35,40,25,20,30,35,62,40,51,25,42,33)
6 Digital<-c(25,16,15,15,10,20,7,16,15,13,11,19,19)
7 Difference<-Slide-Digital
8 data<-data.frame(Slide,Digital,Difference, row.names=
   Subject)
9 print(data)
10
11 #Normal probability plot
12 qqnorm(data$Difference, main="Normal probability plot
          of the differences", ylab=" diff", xlab="
          Probability")

```

```

13 qqline(data$Difference)
14
15 #To find t critical value
16 alpha<-0.05
17 t<-qt(1-alpha/2,df=12)
18 print(paste("t statistic value:",t))
19
20 #To find confidence intervals
21 t1<-t.test(Slide,Digital,paired=TRUE)
22 print(t1)

```

---

**R code Exa 9.11** Inferences concerning difference between population proportions

```

1 #Ex9.11 , Page 376
2 #Answers may slightly vary due to rounding off of
   values
3
4 alpha<-0.05
5
6 #H0: p1-p2=0
7 #Ha: p1-p2<0
8
9 a<-81
10 tot1<-549
11 p1cap<-a/tot1
12 q1cap<-1-p1cap
13
14 b<-141
15 tot2<-730
16 p2cap<-b/tot2
17 q2cap<-1-p2cap
18
19 pcap<-(a+b)/(tot1+tot2)
20 qcap<-1-pcap

```

```

21
22 #To find test statistic value
23 if((tot1*p1cap)>=10 && (tot1*q1cap)>=10 && (tot2*
24     p2cap)>=10 && (tot2*q2cap)>=10)
25 z<-(p1cap-p2cap)/sqrt(pcap*qcap*(1/tot1+1/tot2))
26 print(paste("Test statistic value:",z))
27
28 #To find P-value
29 p<-pnorm(z)
30 print(paste("P-value:",p))
31 if(p<=alpha) print(paste("H0 can be rejected at
            significance level",alpha)) else print(paste("H0
            cannot be rejected"))

```

---

### R code Exa 9.12 Type II error probabilities and sample sizes

```

1 #Ex9.12 , Page 378
2 #Answers may vary slightly due to rounding off of
   values
3
4 #H0: p1-p2=0
5 #Ha: p1-p2>0
6
7 a<-30
8 tot1<-100000
9 p1<-a/tot1
10 print(paste("p1:",p1))
11 q1<-1-p1
12
13 b<-a/2
14 p2<-b/tot1
15 print(paste("p2:",p2))
16 q2<-1-p2
17

```

```

18 alpha<-0.05
19 beta<-0.1
20
21 zalpha<-qnorm(1-alpha)
22 zbeta<-qnorm(1-beta)
23 d<-p1-p2
24
25 #To find n value
26 n<-(zalpha*sqrt((p1+p2)*(q1+q2)/2)+zbeta*sqrt(p1*q1+
    p2*q2))^2/d^2
27 print(paste("Value of n:",n))

```

---

**R code Exa 9.13** A large sample confidence interval

```

1 #Ex9.13 , Page 380
2 #Answers may vary slightly due to rounding off of
   values
3
4 alpha<-0.01
5 a<-76      #number of people who survived through
   chemotherapy treatment
6 m<-154     #number of people who received
   chemotherapy treatment
7 p1cap<-a/m
8 q1cap<-1-p1cap
9 print(paste("p1cap:",p1cap))
10
11 b<-98      #number of people who survived through
   hybrid treatment
12 n<-164     #number of people who received hybrid
   treatment
13 p2cap<-b/n
14 q2cap<-1-p2cap
15 print(paste("p2cap:",p2cap))
16

```

```

17 #To find z
18 zalpha<-qnorm(1-alpha/2)
19
20 if(m*p1cap>=10 && m*q1cap>=10 && n*p2cap>=10 && n*
   q2cap>=10)
21 l<-p1cap-p2cap-zalpha*sqrt((p1cap*q1cap/m)+(p2cap*
   q2cap/n))
22 r<-p1cap-p2cap+zalpha*sqrt((p1cap*q1cap/m)+(p2cap*
   q2cap/n))
23
24 print(paste("Left endpoint of confidence interval:", 
   l))
25 print(paste("Right endpoint of confidence interval:" 
   ,r))
26 print(paste("Hence",round(l,digits=3),"<p1-p2<",
   round(r,digits=3)))

```

---

### R code Exa 9.14 F test for equality of variances

```

1 #Ex9.14 , Page 385
2 #Answers may vary slightly due to rounding off of
   values
3
4 s1<-52.6
5 s2<-84.2
6 m<-28
7 n<-26
8
9 #H0: s1^2=s2^2
10 #Ha: s1^2<s2^2
11
12 alpha<-0.01
13 #To find F value
14 Falph<-qf(alpha,df1=m-1,df2=n-1)
15 print(paste("F value:",Falph))

```

```
16
17 f<- (s1^2)/(s2^2)
18 print(paste("f value:",f))
19
20 if(f<=Falpha) print(paste("H0 is rejected at
significance level",alpha)) else print(paste("H0
is not rejected"))
```

---

# Chapter 10

## The analysis of variance

R code Exa 10.1 Single factor ANOVA

```
1 #Ex10.1 , Page 392
2 #Answers may vary slightly due to rounding off of
  values
3
4 Type_of_box<-c(1,2,3,4)
5 CS1<-c(655.5,789.2,737.1,535.1)
6 CS2<-c(788.3,772.5,639.0,628.7)
7 CS3<-c(734.3,786.9,696.3,542.4)
8 CS4<-c(721.4,686.1,671.7,559.0)
9 CS5<-c(679.1,732.1,717.2,586.9)
10 CS6<-c(699.4,774.8,727.1,520.0)
11 Mean<-c(NULL)
12 SD<-c(NULL)
13
14 #To find mean of observations
15 for(i in 1:4){
16   sum<-CS1[i]+CS2[i]+CS3[i]+CS4[i]+CS5[i]+CS6[i]
17   mean<-sum/6
18   Mean[i]<-mean
19 }
20 #To find standard deviation of values
```

```

21 for(i in 1:4){
22   s<- (CS1[i]-Mean[i])^2+(CS2[i]-Mean[i])^2+(CS3[i]-
      Mean[i])^2+(CS4[i]-Mean[i])^2+(CS5[i]-Mean[i])
      ^2+(CS6[i]-Mean[i])^2
23   sd<-sqrt(s/5)
24   SD[i]<-sd
25 }
26
27 data<-data.frame(Type_of_box,CS1,CS2,CS3,CS4,CS5,CS6
,Mean,SD)
28 print(data)
29
30 #To find grand mean of mean values
31 tot_mean<-0
32 for(i in 1:4){
33   tot_mean<-tot_mean+Mean[i]
34 }
35 tot_mean<-tot_mean/4
36 print(paste("Grand mean:",tot_mean))
37
38 par(mfrow=c(1,2))
39 #To create boxplots of the data
40 #First element of each CS column gives us the
   compression strength of one box
41 a<-c(CS1[1],CS2[1],CS3[1],CS4[1],CS5[1],CS6[1])
42 b<-c(CS1[2],CS2[2],CS3[2],CS4[2],CS5[2],CS6[2])
43 c<-c(CS1[3],CS2[3],CS3[3],CS4[3],CS5[3],CS6[3])
44 d<-c(CS1[4],CS2[4],CS3[4],CS4[4],CS5[4],CS6[4])
45 boxplot(a,b,c,d)
46 title(main="Boxplots for original data")
47
48 #Altering data in sample 2 by adding 120 to every
   value in Sample 4
49 e<-c(NULL)
50 for(i in 1:6){
51   e[i]<-d[i]+120
52 }
53 boxplot(a,b,c,e)

```

```
54 title(main="Boxplots for altered data")
```

---

### R code Exa 10.2 F distribution and the F test

```
1 #Ex10.2 , Page 397
2 #Answers may vary slightly due to rounding off of
   values
3
4 #From Ex10.1
5 Mean<-c(713.00,756.93,698.07,562.02)
6 SD<-c(46.55,40.34,37.20,39.87)
7 tot_mean<-682.50
8
9 I<-4
10 J<-6
11
12 #Numerator
13 v1<-I-1
14
15 #Denominator
16 v2<-I*(J-1)
17
18 alpha<-0.05
19
20 #H0: mu1=mu2=mu3=mu4
21 #Ha: at least two mean values will be different
22
23 #To find F critical value
24 F<-qf(p=1-alpha,df1=v1,df2=v2)
25 print(paste("Critical value F:",F))
26
27 #To find mean square for treatment
28 MStr<-(J/(I-1))*sum((Mean-tot_mean)^2)
29 print(paste("MStr:",MStr))
30
```

```

31 #To find mean square for error
32 MSE<-(1/I)*sum(SD^2)
33 print(paste("MSE:",MSE))
34
35 #To find f value
36 f<-MSTr/MSE
37 print(paste("f:",f))
38
39 if(f>=F) print(paste("H0 is rejected at
    significance level",alpha,"since f>=F"))
else
print(paste("H0 not rejected"))

```

---

### R code Exa 10.3 F distribution and the F test

```

1 #Ex10.3 , Page 397
2 #Answers may vary slightly due to rounding off of
values
3
4 Treatment<-c(1,2,3,4,5)
5 Sample_mean<-c(10.5,14.8,15.7,16.0,21.6)
6 Sample_sd<-c(4.5,6.8,6.5,6.7,6.0)
7
8 #To find total mean of mean values
9 tot_mean<-mean(Sample_mean)
10 print(paste("Grand mean:",tot_mean))
11
12 #H0: mu1=mu2=mu3=mu4=mu5
13 #Ha: at least two of the mean values are different
14
15 I<-5
16 J<-10
17 alpha<-0.01
18
19 #Numerator
20 v1<-I-1

```

```

21
22 #Denominator
23 v2<-I*(J-1)
24
25 #To find F value
26 F<-qf(1-alpha,v1,v2)
27 print(paste("Critical value F:",F))
28
29 #To find mean square for treatment
30 s<-Sample_mean-tot_mean
31 MStr<-(J/(I-1))*sum(s^2)
32 print(paste("MStr:",MStr))
33
34 #To find mean square for error
35 MSE<-mean(Sample_sd^2)
36 print(paste("MSE:",MSE))
37
38 #To find f value
39 f<-MStr/MSE
40 print(paste("f:",f))
41
42 if(f>=F) print(paste("H0 is rejected at
significance level",alpha,"since f>=F"))
else
print(paste("H0 not rejected"))

```

---

#### R code Exa 10.4 Sums of squares

```

1 #Ex10.4 , Page 400
2 #Answers may vary slightly due to rounding off of
values
3
4 Mixture1<-c(0.56,1.12,0.90,1.07,0.94)
5 Mixture2<-c(0.72,0.69,0.87,0.78,0.91)
6 Mixture3<-c(0.62,1.08,1.07,0.99,0.93)
7

```

```

8 data1<-data.frame(Mixture1,Mixture2,Mixture3)
9
10 I<-3
11 J<-5
12
13 #Numerator
14 v1<-I-1
15
16 #Denominator
17 v2<-I*(J-1)
18
19 alpha<-0.01
20 #To find F value
21 F<-qf(1-alpha,v1,v2)
22 print(paste("Critical value , F:",F))
23
24
25 #To create ANOVA table
26 mix<-stack(data1)
27 names(mix)<-c("Degree","Treatment")
28
29 a<-aov(Degree~Treatment,data=mix)
30 print(paste("ANOVA table:"))
31 a1<-summary(a)
32 print(a1)
33 print(paste("f value:",a1[[1]]$F[1]))

```

---

### R code Exa 10.6 Multiple comparisons in ANOVA

```

1 #Ex10.6 , Page 404
2
3 Treatment1<-c(88.6,73.2,91.4,68.0,75.2)
4 Treatment2<-c(63.0,53.9,69.2,50.1,71.5)
5 Treatment3<-c(44.9,59.5,40.2,56.3,38.7)
6 Treatment4<-c(31.0,39.6,45.3,25.2,22.7)

```

```
7 data1<-data.frame(Treatment1,Treatment2,Treatment3,
                      Treatment4)
8
9 Treatment<-stack(data1)
10 names(Treatment)<-c("Time","Model")
11
12 #To display ANOVA table
13 a<-aov(Time~Model,data=Treatment)
14 print(summary(a))
```

---

### R code Exa 10.9 Unequal sample sizes

```
1 #Ex10.9 , Page 412
2
3 Permanent_molding<-c
4   (45.5,45.3,45.4,44.4,44.6,43.9,44.6,44.0)
4 Die_casting<-c
5   (44.2,43.9,44.7,44.2,44.0,43.8,44.6,43.1)
5 Plaster_molding<-c(46.0,45.9,44.8,46.2,45.1,45.5)
6
7 #To display ANOVA table
8 data1<-data.frame(Mold=c(Permanent_molding,Die_
9   casting,Plaster_molding),Treatment=factor(rep(c("Mold1","Mold2","Mold3"),times=c(length(Permanent_
10  molding),length(Die_casting),length(Plaster_
11  molding)))))
12 cat("ANOVA table\n")
11 a<-aov(Mold~Treatment,data=data1)
12 print(summary(a))
```

---

### R code Exa 10.10 Unequal sample sizes

```

1 #Ex10.10 , Page 413
2
3 alpha<-0.95
4 n<-22
5 J1<-8
6 J2<-8
7 J3<-6
8 I<-3
9 J<-n-I
10 MSE<-0.316
11 Q<-qtukey(alpha,I,J)
12 xibar<-c(44.71,44.06,45.58)
13
14 #To find w12
15 w12<-Q*sqrt((MSE/2)*(1/J1+1/J2))
16 print(paste("w12:",w12))
17 w23<-Q*sqrt((MSE/2)*(1/J2+1/J3))
18 print(paste("w23:",w23))
19 w31<-Q*sqrt((MSE/2)*(1/J3+1/J1))
20 print(paste("w31:",w31))
21
22 if(xibar[1]-xibar[2]< w12){
23   print(paste("mu1 and mu2 are not significantly
24   different"))
25 }
26 if(xibar[2]-xibar[3]< w23){
27   print(paste("mu2 and mu3 are not significantly
28   different"))
29 }
30 }
```

---

### R code Exa 10.11 A random effects model

```
1 #Ex.10.11 , Page 415
2
3 #H0: sigmaA^2=0
4
5 C1<-c(55,53,54)
6 C2<-c(26,37,32)
7 C3<-c(78,91,85)
8 C4<-c(92,100,96)
9 C5<-c(49,51,50)
10 C6<-c(80,85,83)
11 data1<-data.frame(C1,C2,C3,C4,C5,C6)
12 print(paste("x..=", sum(data1)))
13
14
15 #To create ANOVA table
16 col<-stack(data1)
17 names(col)<-c("Type","Treatments")
18 a<-aov(Type~Treatments, data=col)
19 print(paste("ANOVA table:"))
20 print(summary(a))
```

---

# Chapter 11

## Multifactor analysis of variance

**R code Exa 11.1** Two factor ANOVA

```
1 #Ex11.1 , Page 420
2
3 dat<-c
4 (0.97,0.48,0.48,0.46,0.77,0.14,0.22,0.25,0.67,0.39,0.57,0.19)
5
6 mat1<-matrix(dat , nrow=3 , ncol=4 , byrow=TRUE)
7 rownames(mat1)<-c("Brand1" , "Brand2" , "Brand3")
8 colnames(mat1)<-c("WT1" , "WT2" , "WT3" , "WT4")
9 print(mat1)
10
11 print(paste("Number of levels of factor A(Brand of pen) , I:" , nrow(mat1)))
12 print(paste("Number of levels of factor B(Washing treatment) , J:" , ncol(mat1)))
```

---

**R code Exa 11.3** Fixed effects model

```
1 #Ex11.3 , Page 424
```

```

2 #Answers may vary slightly due to rounding off of
  values
3
4 #To create data frame
5 brand<-rep(c("I","II","III"),4)
6 WT<-rep(c("1","2","3","4"),each=3) #WT<-Washing
  treatment
7 col_change<-c
  (0.97,0.77,0.67,0.48,0.14,0.39,0.48,0.22,0.57,0.46,0.25,0.19)

8
9 df1<-data.frame(brand,WT,col_change)
10 print(df1)
11
12 #To display ANOVA table
13 a<-aov(col_change~brand+WT,data=df1)
14 print(a)
15 cat("\nSummarized table:\n")
16 print(summary(a))
17
18 #Diagnostic plots
19 model<-lm(col_change~brand+WT,data=df1)
20 par(mfrow=c(1,2))
21 qqnorm(model$residuals,datax=TRUE,main="Normal
  probability plot",ylab="Residual",xlab="Percent")
22 qqline(model$residuals,datax=TRUE)
23
24 plot(df1$col_change,resid(model),main="Residual plot
  ",xlab="Fitted value",ylab="Residual")
25 abline(0,0)

```

---

### R code Exa 11.5 Randomized block experiments

```

1 #Ex11.5, Page 427
2 #Answers may vary slightly due to rounding off of

```

```

    values
3
4 #To create data frame
5 Treatment<-rep(c("I","II","III","IV","V"),4)
6 Block<-rep(c("1","2","3","4"),each=5)
7 Power<-c
    (685,722,733,811,828,792,806,802,888,920,838,893,880,952,978,875,
8
9 df1<-data.frame(Treatment,Block,Power)
10 print(df1)
11
12 #To display ANOVA table
13 a<-aov(Power~Treatment+Block,data=df1)
14 print(a)
15 cat("\nSummarized table:\n")
16 print(summary(a))

```

---

### R code Exa 11.6 Randomized block experiments

```

1 #Ex11.6 , Page 428
2 #Answers may vary slightly due to rounding off of
    values
3
4 #To create data frame
5 Tension<-rep(c("210","235","260","285"),6)
6 Player<-rep(c("1","2","3","4","5","6"),each=4)
7 Speed<-c
    (105.7,113.3,117.2,110.0,116.6,119.9,124.4,106.8,106.6,120.5,122.3,
8
9 df1<-data.frame(Tension,Player,Speed)
10 print(df1)
11
12 #To find mean for corresponding tension data

```

```
13 cat("\nTension mean values:\n")
14 m1<-tapply(df1$Speed,list(Tension),mean)
15 print(m1)
16
17 #To find mean of corresponding player data
18 cat("\nPlayer mean values:\n")
19 m2<-tapply(df1$Speed,list(Player),mean)
20 print(m2)
21
22 #To display ANOVA table
23 a<-aov(Speed~Tension+Player,data=df1)
24 print(a)
25 print(summary(a))
```

**R code Exa 11.7** Two factor ANOVA with  $K_{ij}$  greater than 1

```
1 #Ex11.7 , Page 435
2
3 AggCont<-rep(c("38","41","44"),each=6)
4 AsphGr<-rep(c("PG58","PG64","PG70"),6)
5 data<-c
6 (0.835,0.855,0.815,0.845,0.865,0.825,0.822,0.832,0.800,0.826,0.830
7
8
9 #To find mean for corresponding content data
10 cat("\nCoarse aggregate content(%) mean values:\n")
11 m1<-tapply(df1$data,list(AggCont),mean)
12 print(m1)
13
14 #To find mean of corresponding Asphalt binder grade
15 cat("\nAsphalt binder grade mean values:\n")
16 m2<-tapply(df1$data,list(AsphGr),mean)
```

```

17 print(m2)
18
19
20 #To display ANOVA table
21 model<-lm(data~AsphGr+AggCont+AsphGr:AggCont)
22 a<-aov(data~AsphGr+AggCont+AsphGr:AggCont)
23 print(a)
24 print(summary(a))
25
26 #To display interaction plots (Thermal diffusivity
   data is not given)
27 interaction.plot(AggCont, AsphGr, response=data)
28
29 #Plots for checking normality and constant variance
   assumptions
30 par(mfrow=c(1,2))
31 qqnorm(model$residuals, datax=TRUE, main="Normal
   probability plot", ylab="Residual", xlab="Percent")
32 qqline(model$residuals, datax=TRUE)
33
34 plot(df1$data, resid(model), main="Residual plot", xlab
   ="Fitted value", ylab="Residual")
35 abline(0,0)

```

---

### R code Exa 11.9 Models with mixed and random effects

```

1 #Ex11.9, Page 439
2 #Answers may vary slightly from textbook values
3
4 #To create data frame
5 Casmater<-rep(c("Steel","Aluminium","Plastic"),10)
6 Source<-rep(c("1","2","3","4","5"),each=6)
7 Power<-c
   (13.1,15.0,14.0,13.2,14.8,14.3,16.3,15.7,17.2,15.8,16.4,16.7,13.7

```

```

8
9 df1<-data.frame(Casmater,Source,Power)
10 print(df1)
11
12 #To create ANOVA table
13 a<-aov(Power~Casmater+Source+Casmater:Source,data=
    df1)
14 print(a)
15 cat("\nSummarized table:\n")
16 print(summary(a))

```

---

### R code Exa 11.10 Three factor ANOVA

```

1 #Ex11.10, Page 444
2 #Answers may vary slightly due to rounding off of
   values
3
4 #To create data frame
5 A<-rep(c(rep(c("A1","A2","A3","A4"),each=3)),8)
6 B<-rep(c("B1","B2"),each=48)
7 C<-rep(c("C1","C2","C3","C4","C1","C2","C3","C4"),
   each=12)
8 data<-c
   (3.6,3.8,3.9,3.8,3.6,4.0,3.7,3.9,4.2,3.6,3.5,3.8,3.4,3.7,3.9,3.8,
9
10 df1<-data.frame(A,B,C,data)
11 print(df1)
12
13 #To find cell totals for all combinations of the
   three factors
14 cat("\nCell totals:\n")
15 m1<-tapply(df1$data,list(A,B,C),sum)
16 print(m1)
17

```

```

18 #To create ANOVA table
19 a<-aov(data~A+B+C+A:B+A:C+B:C+A:B:C, data=df1)
20 print(a)
21 cat("\nSummarized table:\n")
22 print(summary(a))

```

---

### R code Exa 11.11 Latin square designs

```

1 #Ex11.11, Page 447
2 #Answers may vary from textbook values
3
4 library(nlme)
5 library(multcomp)
6
7 #Dependent variable
8 data<-c
  (7.38,7.15,6.75,8.05,5.65,6.00,5.39,8.16,5.64,6.45,5.44,6.55,5.03
9
10 #Repeated measures
11 ##B(Columns)
12 B<-factor(rep(c("1","2","3","4","5","6"), each=6))
13
14 ##A(Rows)
15 A<-factor(rep(c("I","II","III","IV","V","VI"), 6))
16
17 df1<-data.frame(A,B,data)
18 print(df1)
19
20 #To create ANOVA table
21 #using aov() function
22 cat("\nUsing aov():\n")
23 a1<-aov(data~A+Error(B/A), data=df1)
24 print(summary(a1))
25

```

```
26 #using lme()
27 cat("\nUsing lme():\n")
28 model<-lme(data~A,random=~1|B/A,data=df1)
29 a2<-anova(model)
30 print(a2)
31
32 #Tukey test
33 print(summary(glht(model,linfct=mcp(A="Tukey"))))
```

**R code Exa 11.12** Factorial experiments with p factors at two levels

```

1 #Ex11.12 , Page 452
2
3 Age<-rep(c("1","2"),each=2,4)
4 Temp<-rep(c("1","2"),8)
5 Soil<-rep(c("1","2"),each=8)
6 Comp_Stre<-c
    (471,485,712,712,413,552,637,789,385,530,770,741,434,593,705,806)

7 df1<-data.frame(Age,Temp,Soil,Comp_Stre)
8
9 #To compute cell totals
10 s1<-s2<-s3<-s4<-s5<-s6<-s7<-s8<-c(NULL)
11 for(i in 1:length(Comp_Stre)){
12   if(df1$Age[i]=="1" && df1$Temp[i]=="1" && df1$Soil
13     [i]=="1"){
14     s1[i]<-df1$Comp_Stre[i]
15     x111<-sum(s1,na.rm=TRUE)
16   }
17   else if(df1$Age[i]=="1" && df1$Temp[i]=="2" && df1
18     $Soil[i]=="1"){
19     s2[i]<-df1$Comp_Stre[i]
20     x121<-sum(s2,na.rm=TRUE)
21   }
22   else if(df1$Age[i]=="1" && df1$Temp[i]=="1" && df1
23     $Soil[i]=="2"){
24     s3[i]<-df1$Comp_Stre[i]
25     x112<-sum(s3,na.rm=TRUE)
26   }
27   else if(df1$Age[i]=="1" && df1$Temp[i]=="2" && df1
28     $Soil[i]=="2"){
29     s4[i]<-df1$Comp_Stre[i]
30     x122<-sum(s4,na.rm=TRUE)
31   }
32 }
33
34 #Print results
35 print(x111)
36 print(x121)
37 print(x112)
38 print(x122)

```

```

    $Soil[i]=="2"){
21      s3[i]<-df1$Comp_Stre[i]
22      x112<-sum(s3,na.rm=TRUE)
23    }
24    else if(df1$Age[i]=="2" && df1$Temp[i]=="1" && df1
25      $Soil[i]=="1"){
26      s4[i]<-df1$Comp_Stre[i]
27      x211<-sum(s4,na.rm=TRUE)
28    }
29    else if(df1$Age[i]=="2" && df1$Temp[i]=="1" && df1
30      $Soil[i]=="2"){
31      s5[i]<-df1$Comp_Stre[i]
32      x212<-sum(s5,na.rm=TRUE)
33    }
34    else if(df1$Age[i]=="1" && df1$Temp[i]=="2" && df1
35      $Soil[i]=="2"){
36      s6[i]<-df1$Comp_Stre[i]
37      x122<-sum(s6,na.rm=TRUE)
38    }
39    else if(df1$Age[i]=="2" && df1$Temp[i]=="2" && df1
40      $Soil[i]=="1"){
41      s7[i]<-df1$Comp_Stre[i]
42      x221<-sum(s7,na.rm=TRUE)
43    }
44  }
45 }
46 #Parameters of the model
47 n<-2
48 alpha1_cap<-(x111+x121+x112+x122-x211-x212-x221-x222
49   )/(8*n)
50 alpha2_cap<-(-1)*alpha1_cap
51 gamma11_cap<-(x111-x121-x211+x221+x112-x122-x212+

```

```

        x222)/(8*n)
52 gamma12_cap<-(-1)*gamma11_cap
53 gamma21_cap<-(-1)*gamma11_cap
54 gamma22_cap<-gamma11_cap
55
56 print(paste("alpha1_cap:",alpha1_cap))
57 print(paste("alpha2_cap:",alpha2_cap))
58 print(paste("gamma11_cap:",gamma11_cap))
59 print(paste("gamma12_cap:",gamma12_cap))
60 print(paste("gamma21_cap:",gamma21_cap))
61 print(paste("gamma22_cap:",gamma22_cap))

```

---

### R code Exa 11.13 Factorial experiments with p factors at two levels

```

1 #Ex11.13, Page 453
2 #Answers may vary slightly due to rounding off of
  values
3
4 Age<-factor(rep(c("1","2"),each=2,4))
5 Temp<-factor(rep(c("1","2"),8))
6 Soil<-factor(rep(c("1","2"),each=8))
7 Comp_Stre<-c
  (471,485,712,712,413,552,637,789,385,530,770,741,434,593,705,806)

8 df1<-data.frame(Age,Temp,Soil,Comp_Stre)
9
10 #To compute cell totals
11 s1<-s2<-s3<-s4<-s5<-s6<-s7<-s8<-c(NULL)
12 for(i in 1:length(Comp_Stre)){
13   if(df1$Age[i]=="1" && df1$Temp[i]=="1" && df1$Soil
     [i]=="1"){
14     s1[i]<-df1$Comp_Stre[i]
15     x111<-sum(s1,na.rm=TRUE)
16   }
17   else if(df1$Age[i]=="1" && df1$Temp[i]=="2" && df1

```

```

    $Soil[i]=="1"){
18      s2[i]<-df1$Comp_Stre[i]
19      x121<-sum(s2,na.rm=TRUE)
20    }
21    else if(df1$Age[i]=="1" && df1$Temp[i]=="1" && df1
22      $Soil[i]=="2"){
23      s3[i]<-df1$Comp_Stre[i]
24      x112<-sum(s3,na.rm=TRUE)
25    }
26    else if(df1$Age[i]=="2" && df1$Temp[i]=="1" && df1
27      $Soil[i]=="1"){
28      s4[i]<-df1$Comp_Stre[i]
29      x211<-sum(s4,na.rm=TRUE)
30    }
31    else if(df1$Age[i]=="2" && df1$Temp[i]=="1" && df1
32      $Soil[i]=="2"){
33      s5[i]<-df1$Comp_Stre[i]
34      x212<-sum(s5,na.rm=TRUE)
35    }
36    else if(df1$Age[i]=="1" && df1$Temp[i]=="2" && df1
37      $Soil[i]=="2"){
38      s6[i]<-df1$Comp_Stre[i]
39      x122<-sum(s6,na.rm=TRUE)
40    }
41    else if(df1$Age[i]=="2" && df1$Temp[i]=="2" && df1
42      $Soil[i]=="1"){
43      s7[i]<-df1$Comp_Stre[i]
44      x221<-sum(s7,na.rm=TRUE)
45    }
46  }
47
48 Effect_contrasts<-c(NULL)

```

```

49 #To compute effect contrasts
50 for(j in 1:7){
51   if(j==1){
52     Effect_contrasts[j]=-x111+x211-x121+x221-x112+
      x212-x122+x222
53   }
54   else if(j==2){
55     Effect_contrasts[j]=-x111-x211+x121+x221-x112-
      x212+x122+x222
56   }
57   else if(j==3){
58     Effect_contrasts[j]=x111-x211-x121+x221+x112-
      x212-x122+x222
59   }
60   else if(j==4){
61     Effect_contrasts[j]=-x111-x211-x121-x221+x112+
      x212+x122+x222
62   }
63   else if(j==5){
64     Effect_contrasts[j]=x111-x211+x121-x221-x112+
      x212-x122+x222
65   }
66   else if(j==6){
67     Effect_contrasts[j]=x111+x211-x121-x221-x112-
      x212+x122+x222
68   }
69   else if(j==7){
70     Effect_contrasts[j]=-x111+x211+x121-x221+x112-
      x212-x122+x222
71   }
72 }
73
74 SS<-(Effect_contrasts^2)/(8*n)
75 df2<-data.frame(Effect_contrasts,SS)
76 cat("\nEffect contrast and SS values:\n")
77 print(df2)
78 SSsum<-sum(SS)
79

```

```

80 #To find sum of squares value
81 x2_ijkl<-0
82 X2<-0
83 for(k in 1:length(Comp_Stre)){
84   x2_ijkl<-x2_ijkl+(Comp_Stre[k]^2)
85 }
86 x2<-(x111+x112+x211+x121+x212+x221+x122+x222)^2/16
87 print(paste("Sum of square of data:",x2_ijkl))
88 print(paste("x...^2 / 16:",x2))
89
90 #To find SST value
91 SST<-x2_ijkl-x2
92 print(paste("SST:",SST))
93
94 #To find SSE value
95 SSE<-SST-SSsum
96 print(paste("SSE:",SSE))
97
98 #To display corresponding ANOVA tables
99 model1<-lm(Comp_Stre~Age:Temp:Soil)
100 model2<-lm(Comp_Stre~Age*Temp*Soil)
101 a<-aov(model1,data=df1)
102 b<-aov(model2,data=df1)
103 print(summary(a))
104 print(summary(b))

```

---

# Chapter 12

## Simple linear regression and correlation

**R code Exa 12.1** The simple linear regression model

```
1 #Ex12.1 , Page 470
2
3 i<-c
(1,2,3,4,5,6,7,8,9,10,11,12,13,14,15,16,17,18,19,20,21,22,23,24,25)
4 xi<-c
(0.40,0.42,0.48,0.51,0.57,0.60,0.70,0.75,0.75,0.78,0.84,0.95,0.99)
5 yi<-c
(1.02,1.21,0.88,0.98,1.52,1.83,1.50,1.80,1.74,1.63,2.00,2.80,2.48)
6 data<-data.frame(xi,yi, row.names=i)
7 print(data)
8
9 par(mfrow=c(1,3))
10 plot(xi,yi,main=" Scatterplot ",xlab="Width of
    palprebal fissure ",ylab="OSA")
11 dotchart(xi, labels=row.names(xi),main="Dot plot of x
    values")
```

```
12 dotchart(yi, labels=row.names(yi), main="Dot plot of y  
values")
```

---

**R code Exa 12.2** The simple linear regression model

```
1 #Ex12.2 , Page 471  
2  
3 x<-c  
    (7.01,7.11,7.12,7.24,7.94,7.94,8.04,8.05,8.07,8.90,8.94,8.95,8.97  
4 y<-c  
    (60,67,66,52,50,45,52,48,40,23,20,40,31,26,9,22,13,7)  
5 data1<-data.frame(x,y)  
6 print(data)  
7  
8 plot(x,y,main="Scatterplot",xlab="pH",ylab="Arsenic  
removed(%)")
```

---

**R code Exa 12.3** A linear probabilistic model

```
1 #Ex12.3 , Page 474  
2 #Answers may slightly vary due to rounding off of  
    probabilities  
3  
4 y<- function(x) (65-1.2*x)  
5 sd<-8  
6  
7 #P(time-to-failure exceeds 50 when applied stress is  
    20)  
8 x1<-20  
9 mu1<-y(x1)  
10 q<-50
```

```

11 P1<-1-pnorm(q,mu1, sd)
12 print(paste("Probability that the time-to-failure >50
   when applied stress=20) : ",P1))
13
14 #P(time-to-failure exceeds 50 when applied stress is
   25)
15 x2<-25
16 mu2<-y(x2)
17 q<-50
18 P2<-1-pnorm(q,mu2, sd)
19 print(paste("Probability that the time-to-failure >50
   when applied stress=25) : ",P2))
20
21 #Let Y1<-observation made with x=25 and Y2<-
   observation made with x=24
22 #Mean value
23 X1<-25
24 X2<-24
25 E<-y(X1)-y(X2)
26 #Variance
27 V<-sd^2+sd^2
28 SD<-sqrt(V)
29 #Probability that Y1 exceeds Y2
30 P3<-1-pnorm(0,E,V)
31 print(paste("P(Y1>Y2) : ",P3))

```

---

#### R code Exa 12.4 Estimating model parameters

```

1 #Ex12.4 , Page 479
2 #Answers may slightly vary due to rounding off of
   values
3
4 x<-c
   (132.0,129.0,120.0,113.2,105.0,92.0,84.0,83.2,88.4,59.0,80.0,81.5

```

```
5 y<-c  
 (46.0,48.0,51.0,52.1,54.0,52.0,59.0,58.7,61.6,64.0,61.4,54.6,58.8  
6 data1<-data.frame(x,y)  
7  
8 #To display regression model  
9 model<-lm(y~x,data=data1)  
10 cat("Regression model of data:\n")  
11 a<-summary(model)  
12 print(a)  
13  
14 #To display the scatterplot  
15 plot(x,y,main="Scatterplot with least square line  
superimposed",xlab="iod val",ylab="cet num")  
16 abline(a$coefficients[1],a$coefficients[2])
```

---

### R code Exa 12.5 Estimating model parameters

```
1 #Ex12.5 , Page 480  
2  
3 y<- function(x) {75.212-0.2094*x}  
4 #If iodine value 100 is selected ...  
5 x<-100  
6 print(paste("Point prediction for the resulting  
cetane number:",round(y(x),digits=2)))
```

---

### R code Exa 12.6 Estimating model parameters

```
1 #Ex12.6 , Page 482  
2 #Answers may slightly vary due to rounding off of  
values  
3
```

```

4 x<-c
(125.3,98.2,201.4,147.3,145.9,124.7,112.2,120.2,161.2,178.9,159.5

5 y<-c
(77.9,76.8,81.5,79.8,78.2,78.3,77.5,77.0,80.1,80.2,79.9,79.0,76.7

6 data1<-data.frame(x,y)
7
8 model<-lm(y~x)
9
10 #To display final table of predicted values and
    residuals
11 yb<-predict(model,data1)
12 Residual<-resid(model)
13 data1<-data.frame(x,y,yb,Residual)
14 colnames(data1)[colnames(data1)=="x"]<- "Filtrate"
15 colnames(data1)[colnames(data1)=="y"]<- "Moistcon"
16 colnames(data1)[colnames(data1)=="yb"]<- "Fit"
17 print(data1)

```

---

### R code Exa 12.7 Estimating model parameters

```

1 #Ex12.7, Page 483
2 #Answers may vary slightly due to rounding off of
    values
3
4 #From Ex12.6
5 x<-c
(125.3,98.2,201.4,147.3,145.9,124.7,112.2,120.2,161.2,178.9,159.5

6 y<-c
(77.9,76.8,81.5,79.8,78.2,78.3,77.5,77.0,80.1,80.2,79.9,79.0,76.7

7 data1<-data.frame(x,y)
8

```

```

9 model<-lm(y~x)
10 Residual<-resid(model)
11 n<-length(Residual)
12
13 SSE<-sum(Residual^2)
14 print(paste("SSE:",SSE))
15
16 #To find variance (sigma^2)
17 s2<-SSE/(n-2)
18 print(paste("Estimate of variance:",s2))
19
20 #To find standard deviation (sigma)
21 sd<-sqrt(s2)
22 print(paste("Estimate of standard deviation:",sd))
23
24 #To display ANOVA table
25 a<-aov(model,data=data1)
26 cat("ANOVA table:\n")
27 print(summary(a))

```

---

### R code Exa 12.8 Estimating model parameters

```

1 #Ex12.8 , Page 484
2 #Answers may vary slightly due to rounding off of
   values
3
4 x<-c(12,30,36,40,45,57,62,67,71,78,93,94,100,105)
5 y<-c
   (3.3,3.2,3.4,3.0,2.8,2.9,2.7,2.6,2.5,2.6,2.2,2.0,2.3,2.1)

6 data1<-data.frame(x,y)
7
8 #To display ANOVA table
9 model<-lm(y~x)
10 print(summary(model))

```

```
11 a<-aov(model,data=data1)
12 cat("ANOVA table:\n")
13 print(summary(a))
```

---

### R code Exa 12.9 Coefficient of determination

```
1 #Ex12.9 , Page 486
2 #Answers may vary slightly due to rounding off of
   values
3
4 #From Ex12.4
5 x<-c
   (132.0,129.0,120.0,113.2,105.0,92.0,84.0,83.2,88.4,59.0,80.0,81.5

6 y<-c
   (46.0,48.0,51.0,52.1,54.0,52.0,59.0,58.7,61.6,64.0,61.4,54.6,58.8

7 data1<-data.frame(x,y)
8
9 n<-14
10 beta0<-75.212432
11 beta1<-(-0.20938742)
12 yi<-779.2
13 xiyi<-71347.30
14 yi2<-43745.22
15
16 #To find SST and SSE
17 SST<-yi2-(yi^2)/n
18 print(paste("SST:",SST))
19 SSE<-yi2-beta0*yi-beta1*xiyi
20 print(paste("SSE:",SSE))
21
22 #Coefficient of determination
23 r2<-1-(SSE/SST)
24 print(paste("Coefficient of determination:",r2))
```

```

25
26 #To create regression model using ANOVA table
27 a<-lm(y~x)
28 print(summary(a))
29 a1<-aov(a,data=data1)
30 print(summary(a1))

```

---

### R code Exa 12.11 Confidence interval for beta1

```

1 #Ex12.11, Page 494
2 #Answers may vary slightly due to rounding off of
   values
3
4 x<-c
  (5.7,6.8,9.6,10.0,10.7,12.6,14.4,15.0,15.3,16.2,17.8,18.7,19.7,20
5 y<-c
  (119.0,121.3,118.2,124.0,112.3,114.1,112.2,115.1,111.3,107.2,108.9
6
7 plot(x,y,main=" Scatterplot",xlab=" Air content",ylab=
   " Density")
8
9 n<-length(x)
10 xi<-sum(x)
11 yi<-sum(y)
12 #To find sum of xi^2, yi^2 and xi*yi
13 xi2<-sum(x^2)
14 yi2<-sum(y^2)
15 xiyi<-sum(x*y)
16
17 #To find Sxx and Sxy
18 Sxx<-xi2-(xi^2)/length(x)
19 Sxy<-xiyi-(yi*xi)/length(y)
20 print(paste("Sxx:",Sxx))

```

```

21 print(paste("Sxy:", Sxy))
22
23 #To find beta1 and beta0
24 xbar<-mean(x)
25 ybar<-mean(y)
26 beta1<-Sxy/Sxx
27 beta0<-ybar-beta1*xbar
28 print(paste("Beta1:", beta1))
29 print(paste("Beta0:", beta0))
30
31 #To find SSE
32 SSE<-yi2-beta0*yi-beta1*xiyi
33 print(paste("SSE:", SSE))
34
35 #To find SST
36 SST<-yi2-yi^2/n
37 print(paste("SST:", SST))
38
39 #To find r^2
40 r2<-1-(SSE/SST)
41 print(paste("r ^ 2:", r2))
42
43 I<-15
44 J<-2
45 df<-I-J
46
47 #s ^ 2
48 s2<-SSE/df
49 s<-sqrt(s2)
50
51 #Estimated standard deviation of beta1
52 sb<-s/sqrt(Sxx)
53 print(paste("Estimated standard deviation of beta1:")
, sb))
54
55 alpha<-0.05
56 t<-qt(1-alpha/2, df)
57

```

```

58 #To find confidence intervals
59 l<-beta1-t*sb
60 r<-beta1+t*sb
61 print(paste("Left endpoint of confidence interval:", 
62 print(paste("Right endpoint of confidence interval:" 
63 ,r))
64 #To display analysis of variance and parameter
65 estimates
66 model<-lm(y~x)
67 cat("\nParameter estimates\n")
68 print(summary(model))
69 cat("\nANOVA table:\n")
70 print(summary(aov(model)))
71 a<-predict(model)
72 print(a)
73 print(paste("Residuals:"))
74 print(resid(model))

```

---

### R code Exa 12.12 Hypothesis testing procedures

```

1 #Ex12.12, Page 496
2 #Answers may vary slightly due to rounding off of
   values
3
4 x<-c
   (42.2,42.6,43.3,43.5,43.7,44.1,44.9,45.3,45.7,45.7,45.9,46.0,46.2
5 y<-c
   (44,44,44,45,45,46,46,46,47,48,48,48,47,48,48,49,49,49)
6 data1<-data.frame(x,y)
7

```

```

8 model<-lm(y~x,data=data1)
9 cat(" Regression model:\n")
10 print(summary(model))
11
12 #To display ANOVA table
13 a<-aov(model)
14 cat("ANOVA table:\n")
15 print(summary(a))

```

---

### R code Exa 12.13 Inferences concerning mean

```

1 #Ex12.13 , Page 501
2 #Answers may vary slightly due to rounding off of
   values
3
4 library(ggplot2)
5
6 x<-c
   (8.0,15.0,16.5,20.0,20.0,27.5,30.0,30.0,35.0,38.0,40.0,45.0,50.0,
7 y<-c
   (22.8,27.2,23.7,17.1,21.5,18.6,16.1,23.4,13.4,19.5,12.4,13.2,11.4
8 data1<-data.frame(x,y)
9
10 #To plot data using ggplot
11 ggplot(data=data1,mapping=aes(x,y))+geom_point(size
   =2)+geom_smooth(method=lm)
12
13 #To display linear regression model
14 model<-lm(y~x)
15 print(summary(model))
16
17 #To display analysis of variance
18 cat("ANOVA table:\n")

```

```
19 a<-aov(model , data=data1)
20 print(summary(a))
21
22 #To display confidence and prediction intervals
23 d<-data.frame(x=c(35 ,45))
24 cat("Confidence intervals :\n")
25 print(predict(model , newdata=d , interval="confidence" ,
26 level=0.95))
26 cat("Prediction intervals :\n")
27 print(predict(model , newdata=d , interval="predict" ,
28 level=0.95))
```

---

### R code Exa 12.14 Prediction interval for a future value of Y

```
1 #Ex12.14 , Page 505
2 #Answers may vary slightly due to rounding off of
values
3
4 ycap<-13.79
5 sy<-0.7582
6 s<-2.8640
7 n<-18
8 df<-n-2
9 t<-2.120
10
11 #To find confidence intervals
12 l<-ycap-t*sqrt(s^2+sy^2)
13 r<-ycap+t*sqrt(s^2+sy^2)
14 print(paste("Left endpoint of confidence interval :" ,
1 ))
15 print(paste("Right endpoint of confidence interval :" ,
,r))
```

---

### R code Exa 12.15 Correlation

```
1 #Ex12.15 , Page 509
2 #Answers may vary slightly due to rounding off of
   values
3
4 x<-c(2.4,3.4,4.6,3.7,2.2,3.3,4.0,2.1)
5 y<-c(1.33,2.12,1.80,1.65,2.00,1.76,2.11,1.63)
6
7 #To find sample correlation coefficient
8 r<-cor(x,y)
9 print(paste("Sample correlation coefficient ,r :",r))
```

---

### R code Exa 12.16 Inferences about the population correlation coefficient

```
1 #Ex12.16 , Page 511
2 #Answers may vary slightly due to rounding off of
   values
3
4 x<-c
   (0.066,0.088,0.120,0.050,0.162,0.186,0.057,0.100,0.112,0.055,0.154,
5 y<-c
   (4.6,11.6,9.5,6.3,13.8,15.4,2.5,11.8,8.0,7.0,20.6,16.6,9.2,17.9,21.1)
6
7 #To find r(point estimate of population correlation
   coefficient)
8 r<-cor(x,y)
9 print(paste("r : ",r))
```

---

### R code Exa 12.17 Inferences about the population correlation coefficient

```
1 #Ex12.17, Page 513
2 #Answers may vary slightly due to rounding off of
   values
3
4 r<-0.29
5 n<-45
6 #To find the test statistic
7 t<-r*sqrt(n-2)/sqrt(1-r^2)
8 print(paste("t:", round(t, digits=0)))
9
10 #P value for two tailed test
11 p<-2*pt(-abs(t), df=n-1)
12 print(p)
```

---

### R code Exa 12.18 Other inferences concerning rho

```
1 #Ex12.18, Page 515
2 #Answers may vary slightly due to rounding off of
   values
3
4 x<-c
   (55.10,44.83,46.32,51.10,49.89,45.20,48.18,46.70,54.31,41.50,47.50
5 y<-c
   (49.10,31.20,32.80,42.60,42.50,32.70,36.21,40.40,37.42,30.80,35.30
6
7 #To find r
8 r<-cor(x,y)
9 print(paste("Correlation coefficient , r:",r))
10
11 #H0: rho=0.5
12 #Ha: rho>0.5
13 rho<-0.5
14
```

```

15 #To find v
16 v<-0.5*log((1+r)/(1-r))
17 print(paste("v:",v))
18
19 muv<-0.5*log((1+rho)/(1-rho))
20 print(paste("muv:",muv))
21
22 z<-(v-muv)*sqrt(length(x)-3)
23 print(paste("z:",z))
24
25 #To find P value
26 p<-pnorm(z,lower.tail=FALSE)
27 print(paste("p value:",p))
28
29 print(paste("H0 is rejected..."))

```

---

### R code Exa 12.19 Other inferences concerning rho

```

1 #Ex12.19, Page 516
2 #Answers may vary slightly due to rounding off of
   values
3
4 xi<-285.90
5 xi2<-4409.55
6 yi<-690.30
7 yi2<-29040.29
8 xiyi<-10818.56
9 r<-0.733
10 v<-0.935
11 n<-20
12 alpha<-0.05
13
14 #To find z
15 zalpha2<-qnorm(1-alpha/2)
16

```

```
17 #95% interval for muv
18 c1<-v-zalpha2/sqrt(n-3)
19 c2<-v+zalpha2/sqrt(n-3)
20 print(paste("Left endpoint of CI for muv:",c1))
21 print(paste("Right endpoint of CI for muv:",c2))
22
23 #95% interval for rho
24 l<-(exp(1)^(2*c1)-1)/(exp(1)^(2*c1)+1)
25 r<-(exp(1)^(2*c2)-1)/(exp(1)^(2*c2)+1)
26 print(paste("Left endpoint of CI for rho:",l))
27 print(paste("Right endpoint of CI for rho:",r))
```

---

# Chapter 13

## Nonlinear and multiple regression

R code Exa 13.2 Diagnostic plots

```
1 #Ex13.2 , Page 526
2
3 x<-c
  (100,125,125,150,150,200,200,250,250,300,300,350,400,400)
4 y<-c
  (150,140,180,210,190,320,280,400,430,440,390,600,610,670)

5 y_cap<-(-45.55)+(1.71*x)
6 m1<-lm(y~x)
7 ei<-round(resid(m1),digits=1)
8 ei_std<-round(rstandard(m1),digits=2)
9 df<-data.frame(x,y,y_cap,ei,ei_std)
10 print(df)
11
12 par(mfrow=c(3,2))
13 plot(x,y,main="y vs. x")
14 abline(m1)
15 plot(y_cap,ei_std,main=" Standardized residuals vs. y")
```

```

    _cap")
16 abline(0,0)
17 plot(y,y_cap,main="y_cap vs. y")
18 abline(lm(y_cap~y))
19 plot(x,ei_std,main=" Standardized residuals vs. x")
20 abline(0,0)
21 qqnorm(ei_std,xlab="z percentile",ylab="e*",main=
    Normal probability plot")

```

---

### R code Exa 13.4 Regression with transformed variables

```

1 #Ex13.4 , Page 534
2 #Answers may vary slightly due to rounding off of
   values
3
4 x<-c(2,10,20,30,40,50,60,70,80,90,100)
5 y<-c(408,274,196,137,90,78,51,40,30,22,15)
6 y_dash<-log(y,base=exp(1))
7 m1<-lm(y~x)
8 m2<-lm(y_dash~x)
9 ei_std1<-rstandard(m1)
10 ei_std2<-rstandard(m2)
11
12 par(mfrow=c(2,2))
13 plot(x,y,main=" Scatterplot")
14 abline(m1)
15 plot(x,ei_std1,xlab="x",ylab="e*",main=" Residual
   plot from linear regression for the data")
16 abline(0,0)
17
18 #To find the coefficients
19 beta0<-m2$coefficients[1]
20 beta1<-round(m2$coefficients[2],digits=4)
21
22 y_cap<-(exp(1)^(beta0))*(exp(1)^(beta1*x))

```

```

23
24 df<-data.frame(x,y,y_dash,y_cap)
25 print(df)
26
27 plot(x,ei_std2,ylab="e*",main="Standardized
      residuals (after transforming) vs. x")
28 abline(0,0)
29 plot(y,y_cap,main="ycap vs. y")
30 abline(lm(y_cap~y))

```

---

### R code Exa 13.7 Polynomial regression

```

1 #Ex13.7, Page 544
2
3 Thickness<-c
  (220,220,220,220,370,370,370,370,440,440,440,440,680,680,680,680,
4 Strength<-c
  (24.0,22.0,19.1,15.5,26.3,24.6,23.1,21.2,25.2,24.0,21.7,19.2,17.0
5
6 df<-data.frame(Thickness,Strength)
7 cat("Regression model:\n")
8 relation<-lm(Strength~Thickness+I(Thickness^2))
9 print(summary(relation))
10
11 cat("Analysis of variance:\n")
12 model<-lm(Strength~poly(Thickness,2))
13 a<-aov(model,data=df)
14 print(summary(a))
15
16 #To find confidence and prediction intervals
17 cat("\nWhen thickness=500\n")
18 cat("95% CI:\n")
19 print(predict(relation,newdata=data.frame(Thickness

```

```

        =500),interval="confidence"))
20 cat("95% PI:\n")
21 print(predict(relation,newdata=data.frame(Thickness
    =500),interval="prediction"))
22
23 cat("\nWhen thickness=800\n")
24 cat("95% CI:\n")
25 print(predict(relation,newdata=data.frame(Thickness
    =800),interval="confidence"))
26 cat("95% PI:\n")
27 print(predict(relation,newdata=data.frame(Thickness
    =800),interval="prediction"))

```

---

### R code Exa 13.8 Estimating parameters

```

1 #Ex13.8 , Page 546
2 #Answers may vary slightly due to rounding off of
   values
3
4 #From Ex13.7
5 Thickness<-c
   (220,220,220,220,370,370,370,370,440,440,440,440,680,680,680,680,
6 Strength<-c
   (24.0,22.0,19.1,15.5,26.3,24.6,23.1,21.2,25.2,24.0,21.7,19.2,17.0
7 df<-data.frame(Thickness,Strength)
8 relation<-lm(df$Strength~poly(df$Thickness,2),data=
   df)
9 a<-summary(aov(relation,data=df))
10 print(a)
11
12 n<-20
13 k<-2
14 SSE<-a[[1]][, 'Sum Sq'][2]

```

```

15 SST<-a[[1]][, 'Sum Sq'][1]+a[[1]][, 'Sum Sq'][2]
16 R2<-1-(SSE/SST)
17 print(paste("R-squared value:",R2))
18
19 #To find variance
20 sigma2<-SSE/(n-(k+1))
21 print(paste("sigma^2:",sigma2))
22 print(paste("sigma:",sqrt(sigma2)))

```

---

### R code Exa 13.9 Statistical intervals and test procedures

```

1 #Ex13.9 , Page 548
2 #Answers may vary slightly due to rounding off of
   values
3
4 Thickness<-c
   (220,220,220,220,370,370,370,370,440,440,440,440,680,680,680,680,
5 Strength<-c
   (24.0,22.0,19.1,15.5,26.3,24.6,23.1,21.2,25.2,24.0,21.7,19.2,17.0
6
7 model<-lm(Strength~Thickness+I(Thickness^2))
8
9 new<-data.frame(Thickness=500)
10 y_cap<-predict(model,new)
11 print(paste("ycap when x=500:",y_cap))
12
13 #To find confidence and prediction intervals
14 cat("95% CI:\n")
15 print(predict(model,newdata=data.frame(Thickness
   =500),interval="confidence"))
16 cat("95% PI:\n")
17 print(predict(model,newdata=data.frame(Thickness
   =500),interval="prediction"))

```

---

### R code Exa 13.10 Centering x values

```
1 #Ex13.10, Page 549
2 #Answers may vary slightly due to rounding off of
  values
3
4 x<-c(280,284,292,295,298,305,308,315)
5 x_dash<-c
  (-17.13,-13.13,-5.13,-2.13,0.87,7.87,10.87,17.87)
6 y<-c(770,800,840,810,735,640,590,560)
7 df<-data.frame(x,x_dash,y)
8
9 #To find estimated coefficients and standard
  deviations using original model
10 m1<-lm(y~x+I(x^2))
11 print(summary(m1))
12 Estimate1<-c(NULL)
13 Estimated_SD1<-c(NULL)
14 for(i in 1:3){
15   Estimate1[i]<-m1$coefficients[i]
16   Estimated_SD1[i]<-coef(summary(m1))[, "Std. Error"
  ][i]
17 }
18 cat("Estimated coefficients and standard deviations
  using original model\n")
19 Parameter1<-c("beta0","beta1","beta2")
20 df1<-data.frame(Parameter1,Estimate1,Estimated_SD1)
21 print(df1)
22
23 #To find estimated coefficients and standard
  deviations using centered model
24 Estimate2<-c(NULL)
25 Estimated_SD2<-c(NULL)
26 m2<-lm(y~x_dash+I(x_dash^2))
```

```

27 print(summary(m2))
28 for(i in 1:3){
29   Estimate2[i] <- m2$coefficients[i]
30   Estimated_SD2[i] <- coef(summary(m2))[, "Std. Error"]
31 }[i]
32 cat("Estimated coefficients and standard deviations
      using centered model\n")
33 Parameter2<-c("beta0*","beta1*","beta2*")
34 df2<-data.frame(Parameter2,Estimate2,Estimated_SD2)
35 print(df2)

```

---

### R code Exa 13.12 Estimating parameters

```

1 #Ex13.12, Page 558
2 #Answers may vary slightly due to rounding off of
  values
3
4 Observation<-1:30
5 Force<-c
  (30,40,30,40,30,40,30,40,30,40,30,40,30,40,30,40,25,45,35,35,35,
6 Power<-c
  (60,60,90,90,60,60,90,90,60,60,90,90,60,60,90,90,75,75,45,105,75,
7 Temperature<-c
  (175,175,175,175,225,225,225,225,175,175,175,175,225,225,225,225,
8 Time<-c
  (15,15,15,15,15,15,15,25,25,25,25,25,25,25,25,20,20,20,20,20,20,
9 Strength<-c
  (26.2,26.3,39.8,39.7,38.6,35.5,48.8,37.8,26.6,23.4,38.6,52.1,39.5

```

```

11 m1<-lm(Strength~(Force+Power+Temperature+Time))
12
13 #To form estimated regression equation
14 Force<-35 #Force
15 Power<-75 #Power
16 Temperature<-200 #Temperature
17 Time<-20 #Time
18
19 new<-data.frame(Force,Power,Temperature,Time)
20 y_cap<-predict(m1,new)
21 print(paste("Point prediction of strength at
  (35,75,200,20) : ",y_cap,"gm"))

```

---

### R code Exa 13.13 Estimating parameters

```

1 #Ex13.13, Page 560
2 #Answers may vary slightly due to rounding off of
  values
3
4 temp1<-x1<-c(21,21,7,7,28,0,14,14,14)
5 temp2<-x2<-c
  (0.65,0.55,0.65,0.55,0.60,0.60,0.70,0.50,0.60)
6 x1x2<-x1*x2
7 Comp_str<-c
  (33.55,47.55,35.00,35.90,40.90,39.10,31.55,48.00,42.30)

8 Adsorbability<-c
  (8.42,6.26,6.74,6.59,7.28,6.90,10.80,5.63,7.43)
9 df1<-data.frame(x1,x2,x1x2,Comp_str,Adsorbability)
10
11 #To find mean and SST values
12 ybar_compstr<-mean(Comp_str)
13 ybar_Adsorb<-mean(Adsorbability)
14 SST_CompStr<-sum((Comp_str-ybar_compstr)^2)
15 SST_Adsorb<-sum((Adsorbability-ybar_Adsorb)^2)

```

```

16 cat("Mean of compression strength values:",ybar_
compstr,"\\n")
17 cat("Mean of adsorbability values:",ybar_Adsorb,"\\n"
)
18 cat("SST of compression strength:",SST_CompStr,"\\n")
19 cat("SST of adsorbability:",SST_Adsorb,"\\n\\n")
20
21 #First-order regression model
22 m1<-lm(Comp_str~(x1+x2))
23 SSE1<-sum(resid(m1)^2)
24 cat("SSE for first-order model:",SSE1,"\\n")
25 cat("R squared value:",summary(m1)$r.squared,"\\n\\n")
26
27 #Model including interaction predictor
28 m2<-lm(Comp_str~(x1*x2))
29 SSE2<-sum(resid(m2)^2)
30 cat("SSE for first-order model including interaction
predictor:",SSE2,"\\n")
31 cat("R squared value:",summary(m2)$r.squared,"\\n\\n")
32
33 #To create estimated regression function
34 x1<-14 #% limestone
35 x2<-0.6 #Water-cement ratio
36 new<-data.frame(x1,x2)
37 y_cap<-predict(m2,new)
38 cat("Prediction of compression strength at (14,0.6):"
,y_cap,"\\n")
39
40 #When adsorbability is taken as the dependent
variable
41 #First-order regression model
42 m3<-lm(Adsorbability~(temp1+temp2))
43 cat("R squared value for first-order model:",summary
(m3)$r.squared,"\\n")
44
45 #Model including interaction predictor
46 m4<-lm(Adsorbability~(temp1*temp2))
47 cat("R squared value when using interaction

```

```
predictor : " , summary(m4)$r.squared , " \n\n")
```

---

### R code Exa 13.14 Model utility test

```
1 #Ex13.14 , Page 562
2
3 #H0: beta1=beta2=beta3=beta4=0
4 #Ha: at least one of these four betas !=0
5
6 Observation<-1:30
7 Force<-c
     (30 ,40 ,30 ,40 ,30 ,40 ,30 ,40 ,30 ,40 ,30 ,40 ,30 ,40 ,30 ,40 ,25 ,45 ,35 ,35 ,35 ,35
8 Power<-c
     (60 ,60 ,90 ,90 ,60 ,60 ,90 ,90 ,60 ,60 ,90 ,90 ,60 ,60 ,90 ,90 ,75 ,75 ,45 ,105 ,75 ,
9 Temperature<-c
     (175 ,175 ,175 ,175 ,225 ,225 ,225 ,225 ,175 ,175 ,175 ,175 ,225 ,225 ,225 ,225 ,225 ,
10 Time<-c
     (15 ,15 ,15 ,15 ,15 ,15 ,15 ,25 ,25 ,25 ,25 ,25 ,25 ,25 ,25 ,20 ,20 ,20 ,20 ,20 ,20 ,
11 Strength<-c
     (26.2 ,26.3 ,39.8 ,39.7 ,38.6 ,35.5 ,48.8 ,37.8 ,26.6 ,23.4 ,38.6 ,52.1 ,39.5
12
13 Model<-cbind(Force ,Power ,Temperature ,Time)
14
15 m1<-lm(Strength~Model)
16 print(summary(m1))
17
18 #To display analysis of variance table
19 a<-summary(aov(Strength~Model))
20 print(a)
21
```

```
22 print(paste("F value:", a[[1]]$F[1]))
```

---

### R code Exa 13.15 Inferences in multiple regression

```
1 #Ex13.15, Page 564
2 #Answers may vary slightly due to rounding off of
   values
3
4 x1<-c
   (61,175,111,124,130,173,169,169,160,244,257,333,199)

5 x2<-c(13,21,24,23,64,38,33,61,39,71,112,88,54)
6 y<-c(4,18,14,18,26,26,21,30,28,36,65,62,40)
7 data1<-data.frame(x1,x2,y)
8
9 model<-lm(y~(x1+x2))
10 print(summary(model))
11
12 new<-data.frame(x1=160,x2=39)
13 y_cap<-predict(model,new)
14 print(paste("y_cap:",y_cap))
15
16 cat("\n99% CI:\n")
17 print(confint(model,level=0.99))
18
19 #To find confidence and prediction intervals
20 cat("95% CI:\n")
21 print(predict(model,new,interval="confidence"))
22 cat("95% PI:\n")
23 print(predict(model,new,interval="prediction"))
```

---

### R code Exa 13.16 Inferences in multiple regression

```

1 #Ex13.16 , Page 566
2 #Answers may slightly vary due to rounding off of
   values
3
4 Observation<-1:30
5 x1<-c
   (8,2,7,10,7,7,5,4,5,8,2,4,6,10,4,4,10,5,8,10,2,6,7,5,8,4,6,4,7)
6 x2<-c
   (4,4,4,7,4,7,13,4,7,1,10,4,10,7,13,10,13,10,4,13,1,13,13,1,13,1,1
7 x3<-c
   (100,180,180,120,180,180,140,160,140,100,140,100,180,120,180,160,
8 x4<-c
   (1,7,1,5,5,1,1,7,3,7,3,3,3,7,3,5,7,7,1,1,1,1,7,7,1,7,7,1,1,7)
9 y<-c
   (1.4,2.2,4.6,4.9,4.6,4.7,4.6,4.5,4.8,1.4,4.7,1.6,4.5,4.7,4.8,4.6,
10 x12<-x1^2
11 x22<-x2^2
12 x32<-x3^2
13 x42<-x4^2
14 x1x2<-x1*x2
15 x1x3<-x1*x3
16 x1x4<-x1*x4
17 x2x3<-x2*x3
18 x2x4<-x2*x4
19 x3x4<-x3*x4
20 df1<-data.frame(Observation,x1,x2,x3,x4,y)
21 print(df1)
22
23 #To find estimate for reduced model
24 cat("\nReduced model:\n")
25 m1<-lm(y~x1+x2+x3+x4)
26 print(summary(m1))
27

```

```

28 #To find estimate for full model
29 cat(" Full model:\n")
30 m2<-lm(y~(x1+x2+x3+x4+x12+x22+x32+x42+x1x2+x1x3+x1x4
+ x2x3+x2x4+x3x4))
31 print(summary(m2))
32
33 #H0: beta5=beta6=....=beta14=0
34 #Ha: at least one among beta5 ,.... beta14 is not 0
35 n<-30
36 k<-14
37 l<-4
38 alpha<-0.01
39 #To find F value
40 Fval<-qf(1-alpha,df1=k-1,df2=n-(k+1))
41 cat("F value:",Fval,"\\n")
42
43 #Unexplained variation for the full model
44 SSEk<-sum(resid(m2)^2)
45
46 #Unexplained variation for the reduced model
47 SSEl<-sum(resid(m1)^2)
48
49 #f value
50 f<-((SSEl-SSEk)/(k-1))/(SSEk/(n-(k+1)))
51 cat(" f value:",f,"\\n")
52
53 if(f>=Fval) cat("H0 is rejected since",f,>=,Fval)

```

---

### R code Exa 13.18 Transformations

```

1 #Ex13.18, Page 575
2
3 s<-c
(20,20,20,20,20,20,20,20,20,60,60,60,60,60,60,60,60,100,100,100

```

```
4 l_1000s<-c  
  (3,3,3,6,6,6,10,10,10,3,3,3,6,6,10,10,10,3,3,3,6,6,10,10,10)  
  
5 w<-c  
  (300.2,310.8,333.0,99.6,136.2,142.4,20.2,28.2,102.7,67.3,77.9,93.9)  
  
6  
7 si<-log(s,base=exp(1))  
8 li<-log(l_1000s,base=exp(1))  
9 wi<-log(w,base=exp(1))  
10  
11 #To display estimated coefficients and t ratios  
12 df1<-data.frame(si,li,wi)  
13 model<-lm(wi~(si+li),data=df1)  
14 print(summary(model))
```

---

# Chapter 14

## Goodness of fit tests and categorical data analysis

**R code Exa 14.1** Goodness of fit tests when category probabilities are completely specified

```
1 #Ex14.1 , Page 597
2 #Answers may vary slightly due to rounding off of
  value
3
4 p<-c(9/16,3/16,3/16,1/16)
5 ni<-c(926,288,293,104)
6 n<-1611
7 k<-4
8 df<-k-1
9
10 npi<-round(n*p,digits=1)
11 df1<-data.frame(ni,npi)
12
13 #To find contribution to chi square from each cell
14 chi<-c(NULL)
15 for(i in 1:length(ni)){
16   s<-((ni[i]-npi[i])^2)/npi[i]
17   chi[i]<-s
```

```

18 }
19 print(paste("Chi-square values :"))
20 print(chi)
21
22 sum<-sum(chi)
23 print(paste("Chi square value : ", sum))
24
25 alpha<-0.1
26 #To find chi square value
27 chival<-qchisq(1-alpha, df)
28 print(paste("Critical value : ", chival))
29
30 if(sum < chival) print(paste("H0 cannot be rejected"))
   )) else print(paste("H0 can be rejected"))

```

---

### R code Exa 14.2 P values for chi squared tests

```

1 #Ex14.2 , Page 599
2 #Answers may vary slightly due to rounding off of
   values
3
4 p<-9/16
5 n<-4
6 k<-5
7 df<-k-1
8 b<-c(NULL)
9 prob<-dbinom(0:4, n, p)
10 print(prob)
11
12 npi<-269*prob
13 print(npi)
14
15 Observed<-c(16, 45, 100, 82, 26)
16 Expected<-npi
17

```

```

18 df1<-data.frame(Observed,Expected)
19
20 #To find contribution to chi square from each cell
21 chi<-c(NULL)
22 for(i in 1:length(prob)){
23   s<-((Observed[i]-Expected[i])^2)/Expected[i]
24   chi[i]<-round(s,digits=3)
25 }
26 print(paste("Chi-square values:"))
27 print(chi)
28
29 sum<-sum(chi)
30 print(paste("Chi square value:",sum))
31
32 alpha<-0.01
33 #To find chi square value
34 chival<-qchisq(1-alpha,df)
35 print(paste("Critical value:",chival))
36
37 if(sum < chival) print(paste("H0 cannot be rejected"))
  ) else print(paste("H0 can be rejected"))

```

---

**R code Exa 14.3** Chi square when underlying distribution is continuous

```

1 #Ex14.3 , Page 600
2 #Answers may vary slightly due to rounding off of
  values
3
4 k<-24
5 df<-k-1
6 p<-1/24
7
8 #Cell counts
9 Observed<-c
  (52,73,89,88,68,47,58,47,48,53,47,34,21,31,40,24,37,31,47,34,36,4

```

```

10 npi<-1186*p
11 Expected<-c(NULL)
12 for(i in 1:length(Observed)){
13   Expected[i]<-npi
14 }
15 chi<-c(NULL)
16 for(i in 1:length(Observed)){
17   s<-((Observed[i]-Expected[i])^2)/Expected[i]
18   chi[i]<-round(s,digits=3)
19 }
20 sum<-sum(chi)
21 print(paste("Chi square value:",sum))
22
23 alpha<-0.01
24 #To find chi square value
25 chival<-qchisq(1-alpha,df)
26 print(paste("Critical value:",chival))
27
28 if(sum < chival) print(paste("H0 cannot be rejected"))
  ) else print(paste("H0 can be rejected"))

```

---

**R code Exa 14.4** Chi square when underlying distribution is continuous

```

1 #Ex14.4 , Page 600
2 #Answers may vary slightly due to rounding off fo
  values
3
4 #Cell counts
5 Observed<-c(21,17,12,16,10,15,19,10)
6 p<-1/8
7 n<-120
8 k<-8
9 df<-k-1
10 npi<-n*p

```

```

11
12 Expected<-c(NULL)
13 for(i in 1:length(Observed)){
14   Expected[i]<-npi
15 }
16 chi<-c(NULL)
17 for(i in 1:length(Observed)){
18   s<-((Observed[i]-Expected[i])^2)/Expected[i]
19   chi[i]<-round(s,digits=3)
20 }
21 sum<-sum(chi)
22 print(paste("Chi square value:",sum))
23
24 alpha<-0.1
25 #To find chi square value
26 chival<-qchisq(1-alpha,df)
27 print(paste("Critical value:",chival))
28
29 if(sum < chival) print(paste("H0 cannot be rejected"))
  ) else print(paste("H0 can be rejected"))

```

---

**R code Exa 14.5** Chi square when parameters are estimated

```

1 #Ex14.5 , Page 603
2
3 Type<-c("Observed")
4 M<-c(125)
5 MN<-c(225)
6 N<-c(150)
7 print(paste("Observed counts:"))
8 df<-data.frame(Type,M,MN,N)
9 print(df)
10
11 n<-500
12

```

```

13 n1<-M
14 n2<-MN
15 theta<-(2*n1+n2)/(2*n)
16 print(paste(" Resulting estimator : " ,theta))

```

---

**R code Exa 14.6** Chi square when parameters are estimated

```

1 #Ex14.6 , Page 604
2 #Answers may slightly due to rounding off of values
3
4 k<-3
5 m<-1
6 theta<-0.475
7 n<-500
8 npi1<-500*theta^2
9 npi2<-n*2*theta*(1-theta)
10 npi3<-n-npi1-npi2
11
12 Observed<-c(125,225,150)
13 Estimated_expected<-c(npi1,npi2,npi3)
14
15 chi<-NULL
16 for(i in 1:length(Observed)){
17   s<-((Observed[i]-Estimated_expected[i])^2) /
18     Estimated_expected[i]
19   chi[i]<-round(s,digits=3)
20 }
21 sum<-sum(chi)
22 print(paste("Chi square value :" ,sum))
23
24 alpha<-0.05
25 df<-k-m-1
26 #To find chi square value
27 chival<-qchisq(1-alpha,df)
28 print(paste(" Critical value :" ,chival))

```

```
28
29 if(sum < chival) print(paste("H0 is rejected")) else
  print(paste("H0 can be rejected"))
```

---

### R code Exa 14.9 Goodness of fit for discrete distributions

```
1 #Ex14.9 , Page 608
2 #Answers may vary slightly due to rounding off of
  values
3
4 k<-5
5 m<-1
6 mu<-2.10
7 n<-48
8 df<-k-m-1
9
10 Frequency<-c(9,9,10,14,6)
11
12 npi<-c(NULL)
13 for(i in 1:(k-1)){
14   num<-(exp(1)^((-1)*mu))*(mu^(i-1))
15   npi[i]<-n*(num/factorial(i-1))
16
17 }
18 npi[5]<-n-npi[1]-npi[2]-npi[3]-npi[4]
19 print(npi)
20
21 chi<-c(NULL)
22 for(i in 1:length(Frequency)){
23   s<-((Frequency[i]-npi[i])^2)/npi[i]
24   chi[i]<-round(s,digits=3)
25 }
26 sum<-sum(chi)
27 print(paste("Chi square value:",sum))
28
```

```

29 alpha<-0.05
30 #To find chi square value
31 chival<-qchisq(1-alpha,df)
32 print(paste("Critical value:",chival))
33
34 if(sum < chival) print(paste("H0 is not rejected
      since",sum,"<",chival)) else print(paste("H0 can
      be rejected"))

```

---

### R code Exa 14.10 Goodness of fit for continuous distributions

```

1 #Ex14.10, Page 608
2 #Answers may vary slightly from textbook values
3
4 data<-c
  (204,108,140,152,158,129,175,146,157,174,192,194,144,152,135,223,
5
6 n<-length(data)
7 mu_cap<-round(mean(data),digits=2)
8 sigma_cap<-round(sqrt((n-1)*(sd(data)^2)/n),digits
  =2)
9 print(paste("mu_cap:",mu_cap))
10 print(paste("sigma_cap:",sigma_cap))
11
12 #To find estimated expected counts
13 interval<-c(-Inf
  ,117.9,132.9,144.6,155.4,167.1,182.1,Inf)
14 p<-c(NULL)
15 npi<-c(NULL)
16 for(i in 1:length(interval)-1){
17   p[i]<-pnorm(interval[i+1],mean=mu_cap,sd=sigma_cap
    )-pnorm(interval[i],mean=mu_cap,sd=sigma_cap)
18   npi[i]<-n*p[i]
19 }

```

```

20
21 Cell<-c("(-Inf ,117.9)" ,"(117.9 ,132.9)" ,
22      "(132.9 ,144.6)" ,"(144.6 ,155.4)" ,"(155.4 ,167.1)" ,
23      "(167.1 ,182.1)" ,"(182.1 ,Inf)")
24 Observed<-c(5 ,5 ,11 ,6 ,6 ,7 ,9)
25 Estimated_expected<-npi
26 data1<-data.frame(Cell ,Observed ,Estimated_expected)
27 print(data1)
28
29 #To find chi-squared values
30 alpha<-0.95
31 df1<-length(npi)-1
32 m<-2
33 q1<-qchisq(alpha ,df=df1)
34 print(paste("X^2(0.05 ,k-1) :" ,q1))
35 df2<-df1-m
36 q2<-qchisq(alpha ,df=df2)
37 print(paste("X^2(0.05 ,k-1-m) :" ,q2))

```

---

### R code Exa 14.12 A special test for normality

```

1 #Ex14.12 , Page 611
2
3 #Package to be installed: DescTools
4 library(DescTools)
5
6 yi<-c
7      (-1.871 ,-1.404 ,-1.127 ,-0.917 ,-.742 ,-0.587 ,-0.446 ,-0.313 ,-0.186 ,-0
8 xi<-c
9      (24.46 ,25.61 ,26.25 ,26.42 ,26.66 ,27.15 ,27.31 ,27.54 ,27.74 ,27.94 ,27.98

```

```

10 #To find z percentiles
11 for(i in 1:length(xi)){
12   z[i]<-round(qnorm(1-((i-0.5)/length(xi)),lower.
13     tail=FALSE),digits=2)
14 }
15 #Shapiro test is similar to Ryan-Joiner test which
16   is not available in R
16 t<-shapiro.test(xi)
17 print(t)
18
19 #To create normal probability plot
20 qqnorm(xi,datax=TRUE,ylab="Voltage",xlab="Probability",main="Normal probability plot")
21 qqline(xi,datax=TRUE)

```

---

### R code Exa 14.13 Testing for homogeneity

```

1 #Ex14.13 , Page 615
2
3 print(paste("Reason for nonconformity:"))
4 Blemish<-c(34,23,32)
5 Crack<-c(65,52,28)
6 Location<-c(17,25,16)
7 Missing<-c(21,19,14)
8 Other<-c(13,6,10)
9 Sample_size<-c(150,125,100)
10 df1<-data.frame(Blemish,Crack,Location,Missing,Other
11   ,Sample_size)
11 print(df1)
12
13
14 #Total values
15 Blemish_tot<-sum(Blemish)
16 Crack_tot<-sum(Crack)

```

```

17 Location_tot<-sum(Location)
18 Missing_tot<-sum(Missing)
19 Other_tot<-sum(Other)
20 Sample_tot<-sum(Sample_size)
21
22 #H0: production lines are homogeneous
23 #Ha: production lines are not homogeneous
24
25 tbl<-cbind.data.frame(df1$Blemish,df1$Crack,df1$
26   Location,df1$Missing,df1$Other)
27 c<-chisq.test(tbl,df1$Sample_size)
28 print(c)
29 print(paste("P value:",c$p.value))
30
31 print(paste("H0 should not be rejected at levels
32   0.05 or 0.01"))

```

---

### R code Exa 14.14 Testing for independence

```

1 #Ex14.14, Page 617
2 #Answers may vary slightly due to rounding off of
3   values
4 O<-c(24,15,17,52,73,80,58,86,36)
5 E<-c
6   (17.02,22.10,16.89,62.29,80.88,61.83,54.69,71.02,54.29)
7
8 print(paste("Observed pricing policy"))
9 Observed<-matrix(data=0,nrow=3,ncol=3,byrow=TRUE)
10 rownames(Observed)<-c("Substandard","Standard",
11   "Modern")
12 colnames(Observed)<-c("Aggressive","Neutral",
13   "Nonaggressive")

```

```

11 print(Observed)
12
13 print(paste("Expected pricing policy"))
14 Expected<-matrix(data=E, nrow=3, ncol=3, byrow=TRUE)
15 rownames(Expected)<-c("Substandard", "Standard", "
16 colnames(Expected)<-c("Aggressive", "Neutral", "
17 print(Expected)
18
19 chi<-c(NULL)
20 for(i in 1:length(Observed)){
21   chi[i]<-(Observed[i]-Expected[i])^2/(Expected[i]
22 }
23 sum<-sum(chi)
24 print(paste("Chi square value:", sum))
25
26 alpha<-0.01
27 #To find chi square value
28 chival<-qchisq(1-alpha, df=4)
29 print(paste("Critical value (Chi square):", chival))

```

---

# Chapter 15

## Distribution free procedures

**R code Exa 15.1** The Wilcoxon signed rank test

```
1 #Ex15.1 , Page 629
2
3 library(stats)
4
5 x<-c
   (494.6,510.8,487.5,493.2,502.6,485.0,495.9,498.2,501.6,497.3,492.0,
6 y<-x-500
7
8 #Performing Wilcoxon signed rank test using wilcox.
   test function
9 print(wilcox.test(y))
```

---

**R code Exa 15.2** Paired observations

```
1 #Ex15.2 , Page 630
2
3 library(stats)
```

```

4
5 IF_REE<-c
(1753.7,1604.4,1576.5,1279.7,1754.2,1695.5,1700.1,1717.0)

6 Std_REE<-c
(1755.0,1691.1,1697.1,1477.7,1785.2,1669.7,1901.3,1735.3)

7 Difference<-IF_REE-Std_REE
8
9 #Performing wilcoxon signed rank test
10 w1<-wilcox.test(Difference)      #or wilcox.test(IF_
    REE,Std_REE,paired=TRUE)
11 print(w1)
12
13 #Along with continuity correction
14 w2<-wilcox.test(Difference,exact=FALSE)  #or wilcox
    .test(IF_REE,Std_REE,paired=TRUE,exact=FALSE)
15 print(w2)

```

---

### R code Exa 15.3 Large sample approximation

```

1 #Ex15.3 , Page 631
2 #Here p value is used to make an inference regarding
   the rejection of hypotheses
3 #wilcoxonsign_test() from coin package can also be
   used to find z value if needed
4
5 #H0: mu=50000
6 #Ha: mu<50000
7
8 Signed_rank<-c
(-1,-2,+3,-4,+5,-6,-7,+8,-9,-10,+11,-12,-13,+14,-15,-16,-17,+18,-

9 xi_50000<-c
(-10,-27,36,-55,73,-77,-81,90,-95,-99,113,-127,-129,136,-150,-155

```

```
10 alpha_level<-0.01
11
12 w1<-wilcox.test(xi_50000,Signed_rank,paired=T,exact=
  F,correct=F,alt="two.sided")
13
14 #Using p value:
15 if(w1$p.value<alpha_level) print(paste("H0 is
  rejected since p value ,",w1$p.value," is smaller
  than level ,",alpha_level)) else print(paste("H0
  is not rejected"))
```

---

#### R code Exa 15.4 The Wilcoxon rank sum test

```
1 #Ex15.4, Page 637
2
3 Polluted<-c(21.3,18.7,23.0,17.1,16.8,20.9,19.7)
4 Unpolluted<-c(14.2,18.3,17.2,18.4,20.0)
5
6 #Performing Wilcoxon rank sum test....
7 print(wilcox.test(Polluted,Unpolluted,conf.level
  =0.99))
```

---

#### R code Exa 15.5 A normal approximation for W

```
1 #Ex15.5, Page 638
2 #Answers may vary slightly due to rounding off of
  values
3
4 Allergics<-c
  (67.6,39.6,1651.0,100.0,65.9,1112.0,31.0,102.4,64.7)
```

```

5 Nonallergics<-c
(34.3,27.3,35.4,48.1,5.2,29.1,4.7,41.7,48.0,6.6,18.9,32.4,45.5)

6
7 m<-length(Allergics)
8 n<-length(Nonallergics)
9
10 #H0: mu1-mu2=0
11
12 new<-c(Allergics,Nonallergics)
13
14 #To find rank of combined vectors
15 r<-rank(new)
16 s<-0
17 for(i in 1:length(Allergics)){
18   s<-s+r[i]
19 }
20 print(paste("Rank sum of allergics:",s))
21
22 #To find mean and variance of W
23 mu_w<-(m+n+1)*m/2
24 print(paste("Mean of W:",mu_w))
25 var_w<-m*n*(m+n+1)/12
26 print(paste("Variance of W:",var_w))
27
28 #To find test statistic value
29 z<-(s-mu_w)/sqrt(var_w)
30 print(paste("Test statistic value:",z))
31
32 alpha<-0.01
33 z1<-qnorm(alpha/2)
34
35 if(z>=z1 || z<=z1) print(paste("H0 is rejected"))
  else print(paste("H0 is not rejected"))

```

---

**R code Exa 15.6** The Wilcoxon signed rank interval

```
1 #Ex15.6 , Page 642
2 #Interval values may vary slightly .....
3
4 #Given data
5 averages<-c
  (4.51,4.55,4.59,4.705,4.72,4.745,4.76,4.795,4.835,4.90,4.915,4.93
6
7 print(summary(averages))
8
9 #To display confidence intervals of the data
10 print(wilcox.test(averages,conf.int=TRUE,conf.level
 =0.95))
```

---

**R code Exa 15.8** The Wilcoxon rank sum interval

```
1 #Ex15.8 , Page 643
2 #Answers vary from that of text book(CI in text
 =>(4830,8220))
3
4 Epoxy<-c(10860,11120,11340,12130,14380,13070)
5 Other<-c(4590,4850,6510,5640,6390,0)
6
7 dat<-data.frame(Crush_Strength=c(Epoxy,Other),Bark_
 board=rep(c("Epoxy","Other"),each=6))
8 print(dat)
9
10 #To display differences between crushing strengths
   of both bark boards
11 o<-outer(Epoxy,Other,"-")
12 print(o)
13
14 #To find corresponding CI intervals
```

```
15 print(wilcox.test(Crush_Strength~Bark_board , data=dat  
 , conf.int=TRUE, conf.level=0.95))
```

---

### R code Exa 15.9 The Kruskal Wallis test

```
1 #Ex15.9 , Page 646  
2 #Answers may vary slightly due to rounding off of  
values  
3  
4 data<-c  
    (309.2,309.7,311.0,316.8,326.5,349.8,409.5,331.0,347.2,348.9,361.0  
5 m1<-matrix(data,nrow=5,dimnames=list(c("4","6","8","10","12")),byrow=TRUE)  
6 print(m1)  
7  
8 N<-length(data)  
9  
10 #To find ranks of respective data  
11 r1<-matrix(rank(m1),nrow=5)  
12 cat("Ranks of data\n")  
13 print(r1)  
14  
15 I<-nrow(r1)  
16 J<-ncol(r1)  
17  
18 #To find rank sum and mean with respect to each  
plate length type  
19 ri<-c(NULL)  
20 ribar<-c(NULL)  
21 for(i in 1:nrow(r1)){  
22   ri[i]<-sum(r1[i,])  
23   ribar[i]<-round(mean(r1[i,]),digits=2)  
24 }  
25 df1<-data.frame(ri,ribar)
```

```

26 cat("Rank sum and mean\n")
27 print(df1)
28
29 #To find k value
30 sum<-0
31 for(j in 1:nrow(r1)){
32   sum<-sum+(ri[j])^2/J
33 }
34 k<-(12/(N*(N+1)))*sum-3*(N+1)
35 print(paste("k value:",k))
36
37 #To find chi-square value
38 alpha<-0.99
39 chival<-qchisq(alpha,df=I-1)
40 print(paste("Chi-squared value:",chival))
41
42 if(k>=chival) print(paste("H0 is not rejected since"
43   ,k,">=",chival)) else print(paste("H0 is
44   rejected"))

```

---

### R code Exa 15.10 Friedman test for a randomized block experiment

```

1 #Ex15.10, Page 647
2 #Answers may vary slightly due to rounding off of
  values
3
4 data<-c
  (23.1,57.6,10.5,23.6,11.9,54.6,21.0,20.3,22.7,53.2,9.7,19.6,13.8,
5 m1<-matrix(data,nrow=4,dimnames=list(c("Fear",""
  "Happiness","Depression","Calmness"),c("1","2","3"
  ,"4","5","6","7","8")),byrow=TRUE)
6 print(m1)
7
8 #To find ranks of respective data

```

```

9 r1<-rank(m1[,1])
10 r2<-rank(m1[,2])
11 r3<-rank(m1[,3])
12 r4<-rank(m1[,4])
13 r5<-rank(m1[,5])
14 r6<-rank(m1[,6])
15 r7<-rank(m1[,7])
16 r8<-rank(m1[,8])
17 data1<-data.frame(r1,r2,r3,r4,r5,r6,r7,r8)
18 cat("\nRanks of data:\n")
19 print(data1)
20
21 I<-nrow(data1)
22 J<-ncol(data1)
23
24 #To find rank sum and mean with respect to each
   plate length type
25 ri<-c(NULL)
26 ri2<-c(NULL)
27 for(i in 1:nrow(data1)){
28   ri[i]<-sum(data1[i,])
29   ri2[i]<-(ri[i])^2
30 }
31 df1<-data.frame(ri,ri2)
32 print(df1)
33
34 #To find test statistic
35 Fr<-(12/(I*J*(I+1)))*sum(ri2)-3*J*(I+1)
36 print(paste("Test statistic value:",Fr))
37
38 #To find chi-square value
39 alpha<-0.95
40 chival<-qchisq(alpha,df=I-1)
41 print(paste("Chi-squared value:",chival))
42
43 if(Fr<chival) print(paste("H0 is not rejected since"
   ,Fr,"<",chival)) else print(paste("H0 is
rejected"))

```



# Chapter 16

## Quality control methods

R code Exa 16.1 X bar chart based on known parameter values

```
1 #Ex16.1 , Page 655
2 #Answers may vary slightly due to rounding off of
   values
3
4 #Package to be installed: qcc(Quality control charts
   )
5 library(qcc)
6
7 Vis_obs<-c
   (10.37,10.48,10.77,10.47,10.84,10.48,10.41,10.40,10.33,10.73,10.4
8 s<-c(rep(1:25,3))
9
10 q<-qcc.groups(Vis_obs,s)
11
12 #To plot X-bar chart
13 q1<-qcc(q,type="xbar",center=10.5, std.dev=0.18)
14 plot(q1)
15 print(summary(q1))
```

---

**R code Exa 16.2** X bar charts based on estimated parameters

```
1 #Ex16.2 , Page 657
2 #Answers may vary slightly due to rounding off of
   values
3
4 n<-3
5 k<-25
6 xdoublebar<-261.896/k
7 sbar<-3.834/k
8 a3<-0.886
9
10 #To find control limits
11 LCL<-xdoublebar-n*sbar/(a3*sqrt(n))
12 UCL<-xdoublebar+n*sbar/(a3*sqrt(n))
13 print(paste("LCL:",LCL))
14 print(paste("UCL:",UCL))
15
16 #Old limits:
17 #mu=10.5, sigma=0.18
18
19 #New limits:
20 print(paste("mu_cap:",xdoublebar))
21 print(paste("sigma_cap:",sbar/a3))
```

---

**R code Exa 16.3** X bar charts based on estimated parameters

```
1 #Ex16.3 , Page 658
2
3 n<-3
4 k<-25
5 xdoublebar<-261.896/k
```

```

6 rbar<-0.292
7 b3<-1.693
8 sigma_cap<-0.292/b3
9
10 #To find control limits
11 LCL<-xdoublebar-3*rbar/(b3*sqrt(n))
12 UCL<-xdoublebar+3*rbar/(b3*sqrt(n))
13 print(paste("LCL:", round(LCL, digits=3)))
14 print(paste("UCL:", round(UCL, digits=3)))

```

---

### R code Exa 16.4 The S chart

```

1 #Ex16.4 , Page 663
2 #Answers may vary slightly due to rounding off of
   values
3
4 #Package to be installed: qcc(Quality control charts
   )
5 library(qcc)
6
7 n<-4
8 k<-22
9 obs1<-c
   (29.7,32.2,35.9,28.8,30.9,30.6,32.3,32.0,24.2,33.7,35.3,28.1,28.7
10 obs2<-c
   (29.0,29.3,29.1,27.2,32.6,34.3,27.7,27.9,27.5,24.4,33.2,34.0,28.9
11 obs3<-c
   (28.8,32.2,32.1,28.5,28.3,34.8,30.9,31.0,28.5,34.3,31.4,31.0,25.8
12 obs4<-c
   (30.2,32.9,31.3,35.7,28.3,26.3,27.8,30.8,31.1,31.0,28.0,30.8,29.7
13 SD<-c

```

```

(0.64,1.60,2.83,3.83,2.11,3.94,2.30,1.76,2.85,4.53,3.09,2.41,1.71

14 Range<-c
(1.4,3.6,6.8,8.5,4.3,8.5,4.6,4.1,6.9,9.9,7.3,5.9,3.9,4.0,4.4,5.2,4.8

15 data1<-data.frame(obs1,obs2,obs3,obs4)
16
17 #Sum of SD values
18 si<-sum(SD)
19 print(paste("Sum of SD values:",si))
20 sbar<-mean(SD)
21 print(paste("Mean of SD values:",sbar))
22
23 a4<-0.921
24 LCL<-0
25 UCL<-sbar+3*sbar*sqrt(1-a4^2)/a4
26 print(paste("LCL:",LCL))
27 print(paste("UCL:",UCL))
28
29 #To plot S chart
30 q4<-qcc(data1,type="S")
31 print(summary(q4))

```

---

### R code Exa 16.5 R chart

```

1 #Ex16.5 , Page 665
2 #Answers may vary slightly due to rounding off of
   values
3
4 #Package to be installed: qcc(Quality control charts
   )
5 library(qcc)
6
7 des_dim<-c
(200,250,300,350,400,450,500,550,600,650,700,750,800,850,900,950,

```

```

8 obs1<-c(12,6,5,19,9,9,8,4,11,13,10,8,14,7,14,10,7)
9 obs2<-c(17,9,9,6,14,15,11,14,14,9,14,9,7,9,5,12,11)
10 obs3<-c(6,17,15,11,9,8,12,11,7,9,8,4,9,12,8,10,15)
11 mean<-c
    (11.7,10.7,9.7,12.0,10.7,10.7,10.3,9.7,10.7,10.7,10.3,10.7,7.0,10.0,9.3)
12 range<-c(11,11,10,13,5,7,4,10,7,4,6,5,7,5,9,2,8)
13 st_dev<-c
    (5.51,5.69,5.03,6.56,2.84,3.79,2.08,5.13,3.51,2.31,3.06,2.65,3.61)
14 data1<-data.frame(obs1,obs2,obs3)
15
16 n<-3
17 b3<-1.693
18 c3<-0.888
19
20 #To find sum of range values
21 ri<-sum(range)
22 rbar<-mean(range)
23
24 #To find control limits
25 UCL<-rbar+n*c3*rbar/b3
26 print(paste("LCL:",LCL))
27 print(paste("UCL:",UCL))
28
29 #To display X-bar chart (can only be displayed
   separately by using run method)
30 q1<-qcc(data1,type="xbar")
31 print(summary(q1))
32
33 #To display R chart (can only be displayed
   separately by using run method)
34 q2<-qcc(data1,type="R")
35 print(summary(q2))

```

---

### R code Exa 16.6 The p chart

```
1 #Ex16.6 , Page 669
2 #Answers may vary slightly due to rounding off of
   values
3
4 #Package to be installed: qcc(Quality control charts
   )
5 library(qcc)
6
7 Dayi<-c
   (1,2,3,4,5,6,7,8,9,10,11,12,13,14,15,16,17,18,19,20,21,22,23,24,25)
8 xi<-c
   (7,4,3,6,4,9,6,7,5,3,7,8,4,6,2,9,7,6,7,11,6,7,4,8,6)
9 pi<-c
   (0.07,0.04,0.03,0.06,0.04,0.09,0.06,0.07,0.05,0.03,0.07,0.08,0.04,
    0.05,0.06,0.03,0.07,0.04,0.05,0.06,0.07,0.04,0.05,0.03,0.07,0.08,0.04)
10 data1<-data.frame(xi,pi)
11
12 #Sum of pi values
13 p<-sum(pi)
14 print(paste("Sum of pi values:",p))
15 pbar<-mean(pi)
16 print(paste("Mean of p values:",pbar))
17
18 #To find control limits
19 LCL<-pbar-3*sqrt(pbar*(1-pbar)/100)
20 UCL<-pbar+3*sqrt(pbar*(1-pbar)/100)
21 print(paste("LCL:",LCL))
22 print(paste("UCL:",UCL))
23
24 #To display p chart
```

```
25 q1<-qcc(data1,sizes=length(Dayi),type="p")
26 print(summary(q1))
```

---

### R code Exa 16.7 c chart for number of defectives

```
1 #Ex16.7 , Page 670
2 #Answers may slightly vary due to rounding off of
   values
3
4 #Package to be installed: qcc(Quality control charts
   )
5 library(qcc)
6
7 x<-c
   (7,10,9,12,13,6,13,7,5,11,8,10,13,9,21,10,6,8,3,12,7,11,14,10)

8
9 #To find the sum of x values
10 xi<-sum(x)
11 xbar<-mean(x)
12 print(paste("Sum of x values:",xi))
13 print(paste("Mean of x values:",xbar))
14
15 #To find control limits
16 LCL<-xbar-3*sqrt(xbar)
17 UCL<-xbar+3*sqrt(xbar)
18 print(paste("LCL:",LCL))
19 print(paste("UCL:",UCL))
20
21 #To display c chart
22 q1<-qcc(x,sizes=length(x),type="c")
23 print(summary(q1))
24
25 #From the chart, the 15th value lies above the UCL
26 #Eliminating that observation.....
```

```

27 xbar1<-(sum(x)-x[15])/(length(x)-1)
28 print(paste("Mean value when the 15th value is
               eliminated : ",xbar1))
29 LCL1<-xbar1-3*sqrt(xbar1)
30 UCL1<-xbar1+3*sqrt(xbar1)
31 print(paste("Control limits when 15th value is
               eliminated :"))
32 print(paste("New LCL value : ",LCL1))
33 print(paste("New UCL value : ",UCL1))
34
35 #Remaining 23 observation lie within control lines (
      in-control)

```

---

### R code Exa 16.8 CUSUM procedures

```

1 #Ex16.8 , Page 674
2
3 #Package to be installed: qcc( Quality control charts
   )
4 library(qcc)
5
6 n<-4
7 mu=mu0=40
8 sigma<-0.5
9 obs<-c
   (40.77 ,39.95 ,40.86 ,39.21 ,38.94 ,39.70 ,40.37 ,39.88 ,40.43 ,40.27 ,40.9
10 sa<-c(rep(1,4),rep(2,4),rep(3,4),rep(4,4),rep(5,4),
       rep(6,4),rep(7,4),rep(8,4),rep(9,4),rep(10,4),rep
       (11,4),rep(12,4),rep(13,4),rep(14,4),rep(15,4),
       rep(16,4))
11
12 #To display X-bar chart
13 q<-qcc.groups(data=obs,sample=sa)
14 q4<-qcc(q,center=mu0, std.dev=sigma, type="xbar")

```

```
15 print(summary(q4))
```

---

### R code Exa 16.9 Computational version

```
1 #Ex16.9 , Page 676
2
3 #Package to be installed: qcc(Quality control charts
4 )
4 library(qcc)
5
6 mu0<-40
7 delta<-0.3
8 k<-delta/2
9 l<-mu0-k
10 r<-mu0+k
11 obs<-c
   (40.77,39.95,40.86,39.21,38.94,39.70,40.37,39.88,40.43,40.27,40.9
12 sa<-c(rep(1,4),rep(2,4),rep(3,4),rep(4,4),rep(5,4),
      rep(6,4),rep(7,4),rep(8,4),rep(9,4),rep(10,4),rep
      (11,4),rep(12,4),rep(13,4),rep(14,4),rep(15,4),
      rep(16,4))
13 xbar<-c
   (40.20,39.72,40.42,39.98,40.06,39.76,39.65,40.41,40.32,39.84,40.4
14
15 xbar1<-xbar-r
16 xbar2<-xbar-l
17
18 #To find d and e values
19 d0<-0
20 d1<-max(0,d0+(xbar[1]-r))
21 e0<-0
22 e1<-max(0,e0-(xbar[1]-l))
23
```

```

24 d<-c(d1)
25 e<-c(e1)
26 for(i in 2:length(xbar)){
27   d[i]<-max(0,d[i-1]+(xbar[i]-r))
28   e[i]<-max(0,e[i-1]-(xbar[i]-l))
29 }
30
31 df<-data.frame(xbar,xbar1,d,xbar2,e)
32 print(df)
33
34 q<-qcc.groups(data=obs,sample=sa)
35 c<-cusum(q,sizes=4,se.shift=delta,center=mu0)
36 print(summary(c))

```

---

#### R code Exa 16.10 Designing a CUSUM procedure

```

1 #Ex16.10 , Page 680
2
3 sigma<-0.004
4 kbar<-0.74
5 delta<-0.003
6
7 n<-round((2*kbar*sigma/delta)^2,digits=0)
8 print(paste("Sample size:",n))
9
10 hbar<-3.2
11 h<-(sigma/sqrt(n))*hbar
12 print(paste("h value:",h))
13
14 print(paste("Out of control signal if d>",h,"or e>",
h))

```

---

#### R code Exa 16.11 Acceptance sampling

```

1 #Ex16.11, Page 681
2
3 P<- function(p) {(1-p)^50+50*p*(1-p)^49+1225*p^2*(1-
   p)^48}
4
5 p<-c
   (0.01,0.02,0.03,0.04,0.05,0.06,0.07,0.08,0.09,0.10,0.12,0.15)

6
7 #Finding P(A) values
8 PA<-c(NULL)
9 for(i in 1:length(p)){
10   PA[i]<-round(P(p[i]),digits=3)
11 }
12
13 df<-data.frame(p,PA)
14 print(df)
15
16 #To plot data
17 plot(p,PA,ylab="P(A)",main="Curve plotting P(A) and
   p values")

```

---

### R code Exa 16.12 Designing a single sample plan

```

1 #Ex16.12, Page 683
2 #Answers may vary slightly due to rounding off of
   values
3
4 #Package to be installed: AcceptanceSampling
5 library(AccuracySampling)
6
7 c<-0:15
8 np1<-c
   (0.051,0.355,0.818,1.366,1.970,2.613,3.285,3.981,4.695,5.425,6.169)

```

```

9 np2<-c
(2.30,3.89,5.32,6.68,7.99,9.28,10.53,11.77,12.99,14.21,15.41,16.6

10 p2_p1<-np2/np1
11 df1<-data.frame(c,np1,np2,p2_p1)
12 print(df1)
13 cat("\n")
14
15 AQL<-p1<-0.01
16 LTPD<-p2<-0.045
17
18 #Ratio of p2 to p1
19 r<-LTPD/AQL
20 print(paste("Ratio of p2 to p1:",r))
21
22 for(i in 1:length(c)){
23   if(r>p2_p1[i+1] && r<p2_p1[i]){
24     j<-i
25     np_1<-np1[i]
26     c1<-c[i]
27     c2<-c[i+1]
28     np_2<-np2[i+1]
29
30   }
31 }
32 cat("Ratio lies between",p2_p1[j],"and",p2_p1[j+1],""
      values corresponding to c values",c[j],"and",c[j+1],"\\n")
33
34 #Single sample plan: 1st c value
35 cat("When c value is",c1,"\\n")
36
37 ##To find sample size
38 n<-round(np_1/p1,digits=0)
39 print(paste("Sample size:",n))
40
41 ##To find alpha and beta values
42 alpha1<-1-pbinom(c1,n,p1)

```

```
43 print(paste("Alpha value:",alpha1))
44
45 beta1<-pbinom(c1,n,p2)
46 print(paste("Beta value:",beta1))
47
48 #Single sample plan: 2nd c value
49 cat("When c value is",c2,"\\n")
50
51 #To find sample size
52 n<-round(np_2/p2,digits=0)
53 print(paste("Sample size:",n))
54
55 ##To find alpha and beta values
56 alpha2<-1-pbinom(c2,n,p1)
57 print(paste("Alpha value:",alpha2))
58
59 beta2<-pbinom(c2,n,p2)
60 print(paste("Beta value:",beta2))
```

---