Homework 2

View it online:

http://acsweb.ucsd.edu/~djc035/Assignment2.html (http://acsweb.ucsd.edu/~djc035/Assignment2.html)

Objective

The objective of this study is to investigate the responses of the participants in the study with the intention of providing udeful information about the students to the designers of the new computer lab?

Scenario 1

Begin by providing an estimate for the fraction of students who played a video game in the week prior to the survey. Provide an interval estimate as well as a point estimate for this proportion.

Point and Interval Estimation

We are looking for the point estimate of the proportion of students who played a video game in the week prior to the survey. We created a new column called "binary_time" that is 1 if the student played more than 0 hours of a video game and 0 for students who played 0 hours.

```
#read in "videodata.txt" into data
data <- read.table("videodata.txt", header=TRUE)
data["binary_time"] <- ifelse(data$time>0, 1, 0)
head(data)
```

```
time like where freq busy educ sex age home math work own cdrom email grade
##
## 1
      2.0
                    3
                          2
                               0
                                     1
                                             19
                                                    1
                                                              10
                                                                   1
                                                                          0
                                                                                1
      0.0
                     3
                                0
                                                               0
                                                                   1
                                                                          1
                                                                                1
                                                                                       2
## 2
              3
                          3
                                     0
                                            18
      0.0
              3
                    1
                          3
                               0
                                     0
                                            19
                                                               0
                                                                          0
      0.5
                    3
              3
                                         0 19
                                                                                       3
      0.0
              3
                                            19
                                                              0
                                                                          0
                                                                                       3
      0.0
              3
                                                             12
                                                                                       3
##
     binary time
## 1
## 2
                0
## 3
                n
## 4
                1
                0
## 5
## 6
```

The point estimation of the proportion of students who played a video game in the week prior to the survey is:

```
play.percentage <- mean(data$binary_time)
play.percentage</pre>
```

```
## [1] 0.3736264
```

Now we also want to have a confidence interval of this estimator. However, clearly the distribution of binary_time variable is not Normal, it is a Bernoulli random variable. We know our data were drawn from a population with size N=314. Hence, we first create a bootstrap population of this size by repeating every sample for 31491=3.45 times. Here, we'll just specify the parameter length.out to be 314.

```
set.seed(573929)
shuffle.ind=sample(1:nrow(data))
boot.population <- rep(data$binary_time[shuffle.ind], length.out = 314)
length(boot.population)</pre>
```

```
## [1] 314
```

Then we will choose n=91 samples from the Bootstrap population and call this a Bootstrap sample.

```
sample1 <- sample(boot.population, size = 91, replace = TRUE)</pre>
```

Continue this procedure until we have 400 Bootstrap samples.

```
B = 400 # the number of bootstrap samples we want
boot.sample <- array(dim = c(B, 91))
for (i in 1:B) {
   boot.sample[i, ] <- sample(boot.population, size = 91, replace = TRUE)
}</pre>
```

Then we can calculate the sample mean for each Bootstrap sample (i.e. each row of the Bootstrap sample matrix).

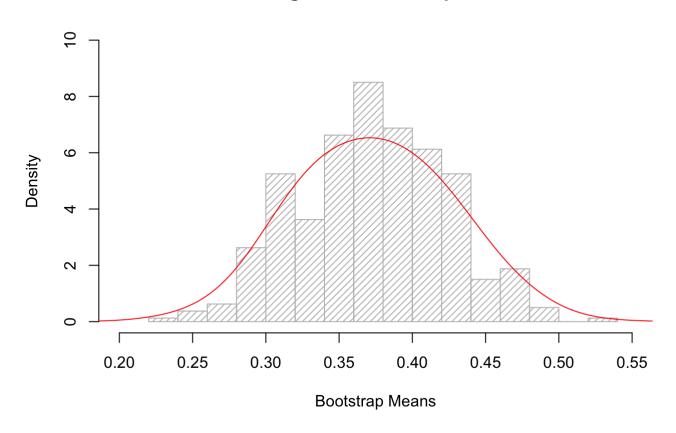
```
boot.mean <- apply(X = boot.sample, MARGIN = 1, FUN = mean)
head(boot.mean)</pre>
```

```
## [1] 0.3516484 0.2967033 0.3626374 0.3736264 0.3406593 0.4065934
```

Let's see the histogram of these Bootstrap sample means.

```
hist(boot.mean, xlim=c(0.2,0.55), ylim=c(0,10), breaks = 20, probability = TRUE, density
= 20, col = 8, border = 8, main = "Histogram of Bootstrap Mean", xlab = "Bootstrap Mean
s")
lines(density(boot.mean, adjust = 2), col = 2)
```

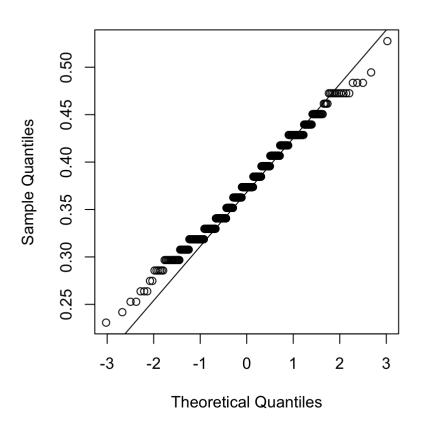
Histogram of Bootstrap Mean



Check Normality by Q-Q plot and Kolmogorov-Smirnov test.

```
par(pty = 's')
qqnorm(boot.mean)
qqline(boot.mean)
```

Normal Q-Q Plot



```
ks.test((boot.mean - mean(boot.mean))/sd(boot.mean), pnorm)
```

```
## Warning in ks.test((boot.mean - mean(boot.mean))/sd(boot.mean), pnorm): ties
## should not be present for the Kolmogorov-Smirnov test
```

```
##
## One-sample Kolmogorov-Smirnov test
##
## data: (boot.mean - mean(boot.mean))/sd(boot.mean)
## D = 0.071014, p-value = 0.03539
## alternative hypothesis: two-sided
```

So we can accept that the sample mean follows a Normal distribution. Then we can construct 95% confidence intervals.

```
boot.sd <- sd(boot.mean)
play.percentage + c(-1, 1)*1.96*boot.sd</pre>
```

```
## [1] 0.2745089 0.4727438
```

Scenario 2

Check to see how the amount of time spent playing video games in the week prior to the survey compares to the reported frequency of play (daily, weekly, etc). How might the fact that there was an exam in the week prior to the survey affect your previous estimates and this comparison?

```
#read in "videodata.txt" into data
data <- read.table("videodata.txt", header=TRUE)
head(data)</pre>
```

```
##
     time like where freq busy educ sex age home math work own cdrom email grade
## 1
      2.0
                                                                            0
              3
                     3
                           2
                                0
                                              19
                                                               10
                                                                     1
                                                                                  1
                                      1
                                           0
                                                     1
                                                                                         4
## 2
      0.0
              3
                     3
                           3
                                0
                                                                0
                                                                     1
                                                                            1
                                                                                  1
                                                                                         2
                                      0
                                           0
                                              18
                                                     1
                                                           1
## 3
      0.0
                     1
                           3
                                0
                                                                0
                                                                            0
                                                                                         3
              3
                                      0
                                           1
                                             19
                                                     1
                                                           0
                                                                     1
                                                                                  1
## 4
      0.5
              3
                     3
                           3
                                0
                                      1
                                             19
                                                                            0
                                                                                  1
                                                                                         3
## 5
      0.0
              3
                     3
                                0
                                      1
                                           0 19
                                                                0
                                                                            0
                                                                                  1
                                                                                         3
## 6
      0.0
                                           1 19
                                                               12
                                                                                         3
```

Show the number of rows in data

```
nrow(data)
```

```
## [1] 91
```

```
#cleaning unknown data rows
data <- data[!(data$freq==99),]</pre>
```

Show the number of rows in data

```
nrow(data)
```

```
## [1] 78
```

Make four seperate data versions

```
#use which() function to select rows which contain observation of smokers
freq_1.ind <- which(data['freq'] == 1)
#we pass in the vector of indices and use setdiff() function to get the non-smokers
data.freq_1 <- data[freq_1.ind,]

freq_2.ind <- which(data['freq'] == 2)
data.freq_2 <- data[freq_2.ind,]

freq_3.ind <- which(data['freq'] == 3)
data.freq_3 <- data[freq_3.ind,]

freq_4.ind <- which(data['freq'] == 4)
data.freq_4 <- data[freq_4.ind,]

data.freq_1</pre>
```

##		time	like	where	frea	busv	educ	sex	aσe	home	math	work	own	cdrom	email	grade
##	9	2	3	2	1	1	1	1		0	0	0	0	0	0	4
##	13	0	2	4	1	0	1	0	19	1	1	0	0	0	1	4
##	23	2	3	3	1	1	1	1	19	0	0	0	1	0	1	4
##	35	0	3	3	1	0	1	0	19	1	0	12	1	0	1	3
##	54	3	2	3	1	0	1	1	18	1	0	7	1	0	1	3
##	58	4	2	99	1	1	1	1	20	1	0	6	1	0	0	4
##	60	14	2	99	1	1	0	0	19	1	0	0	1	0	1	2
##	65	14	2	4	1	1	1	1	18	1	0	35	1	1	1	3
##	81	1	2	3	1	0	0	1	20	1	1	0	1	0	1	4

data.freq_2

##	time	like	where	freq	busy	educ	sex	age	home	math	work	own	cdrom	email	grade
## 1	2.0	3	3	2	0	1	0	19	1	0	10	1	0	1	4
## 1	4 3.0	3	3	2	1	0	0	18	0	0	0	0	0	1	3
## 1	5 1.0	3	5	2	0	1	0	18	1	1	14	1	0	1	3
## 19	9 2.0	2	2	2	1	0	1	18	1	0	0	1	0	1	4
## 2	1 2.0	3	2	2	0	1	1	20	1	0	15	1	0	0	4
## 3	2 1.0	3	5	2	0	1	1	19	1	0	99	1	1	1	3
## 3	0.1	2	6	2	0	1	1	18	0	0	5	1	1	1	4
## 4	0.0	3	3	2	1	1	0	20	1	0	20	1	0	0	3
## 42	2.0	2	4	2	0	0	1	19	1	0	0	1	0	1	3
## 4	3 2.0	3	4	2	0	1	1	19	0	0	10	1	1	1	3
## 4	4 0.5	3	4	2	1	0	1	19	1	1	99	0	0	1	4
## 4	6 2.0	3	5	2	1	1	1	19	1	0	15	0	0	1	4
## 4	7 0.0	3	4	2	0	0	1	19	1	1	0	1	1	0	3
## 5	2.0	3	2	2	0	0	1	19	1	0	0	1	0	1	4
## 5	3 0.5	3	2	2	0	0	1	19	1	0	16	1	0	1	3
## 5	9 30.0	2	99	2	1	0	1	19	0	1	0	0	0	1	3
## 6	4 0.5	2	3	2	1	1	1	19	1	0	20	1	1	1	4
## 6	1.0	2	4	2	0	1	1	19	1	0	19	1	0	1	4
## 6	0.0	2	5	2	1	1	1	20	1	1	20	0	0	1	4
## 6	9 1.5	3	3	2	0	1	0	19	1	1	8	1	0	0	3
## 7:	2.0	2	99	2	1	99	1	20	1	0	10	1	1	1	3
## 7	4 0.0	3	3	2	0	0	1	23	0	0	0	1	0	1	4
## 8	2.0	2	1	2	0	1	1	19	1	0	10	1	0	1	3
## 8	4 2.0	2	3	2	0	1	1	21	0	0	15	0	0	1	4
## 8	5 2.0	2	4	2	1	0	1	19	0	0	0	1	0	1	3
## 8	7 2.0	3	4	2	1	0	1	19	1	0	0	1	99	1	4
## 8	5.0	3	3	2	0	1	0	20	1	0	14	1	1	1	4
## 9	3.0	3	3	2	0	0	1	19	1	0	5	1	1	1	3

 $data.freq_3$

##		time	like	where	freq	busy	educ	sex	age	home	${\tt math}$	work	own	${\tt cdrom}$	email	grade
##	2	0.0	3	3	3	0	0	0	18	1	1	0	1	1	1	2
##	3	0.0	3	1	3	0	0	1	19	1	0	0	1	0	1	3
##	4	0.5	3	3	3	0	1	0	19	1	0	0	1	0	1	3
##	18	0.0	3	2	3	0	0	1	20	1	0	0	1	0	1	3
##	22	0.0	3	2	3	0	1	1	24	1	0	10	0	0	0	4
##	28	0.0	3	2	3	0	0	1	18	0	0	10	0	0	0	3
##	33	0.0	4	2	3	0	0	1	19	1	1	0	1	1	1	3
##	34	0.0	2	1	3	0	0	1	19	1	0	10	0	0	1	3
##	37	0.5	4	3	3	0	0	0	19	1	0	0	1	0	0	3
##	48	0.0	3	4	3	1	1	0	19	1	1	0	1	0	1	3
##	55	0.0	3	1	3	0	0	1	19	0	0	15	0	0	1	3
##	56	0.0	4	3	3	0	1	0	21	1	0	5	1	0	1	4
##	61	0.0	3	1	3	0	1	1	19	0	0	0	0	0	0	3
##	62	0.0	2	99	3	0	1	0	21	0	0	18	1	0	0	2
##	71	0.0	3	4	3	0	0	1	19	1	1	0	1	0	1	3
##	76	0.0	2	3	3	0	1	0	20	0	0	0	1	1	1	2
##	79	0.0	2	3	3	0	1	1	25	0	0	55	1	0	1	3
##	91	0.0	3	4	3	0	1	0	19	0	1	5	1	0	1	2

data.freq_4

##		time	like	where	freq	busy	educ	sex	age	home	${\tt math}$	work	own	\mathtt{cdrom}	email	grade
##	5	0	3	3	4	0	1	0	19	1	1	0	0	0	1	3
##	6	0	3	2	4	0	0	1	19	0	0	12	0	0	0	3
##	7	0	4	3	4	0	0	1	20	1	1	10	1	0	1	3
##	8	0	3	3	4	0	0	0	19	1	0	13	0	0	1	3
##	10	0	3	3	4	0	1	1	19	1	1	0	1	0	1	4
##	11	0	3	1	4	0	0	0	20	1	0	0	1	0	0	3
##	12	0	3	2	4	0	0	0	19	1	0	0	1	0	1	4
##	17	0	3	3	4	0	1	1	21	1	0	2	1	0	1	4
##	26	0	3	3	4	0	99	0	20	1	1	0	1	0	1	3
##	27	0	2	3	4	0	0	1	22	1	1	0	1	1	1	4
	29	0	4	3	4	0	0	1	19	1	1	0	1	0	1	3
##	30	0	4	3	4	0	1	0	20	1	0	0	1	0	1	3
##	31	0	4	3	4	0	0	0	19	1	1	0	0	0	1	4
##	38	1	3	4	4	99	1	0	20	1	0	0	1	0	1	3
##	39	0	3	1	4	0	0	0	19	0	0	0	0	0	1	3
##	51	0	4	99	4	0	99	0	18	1	1	0	1	0	1	3
##	57	0	4	3	4	0	0	0	18	1	0	0	1	0	1	4
##	67	0	4	2	4	0	0	1	18	1	0	0	1	0	1	4
	70	0	4	2	4	0	0	1	19	1	1	0	1	0	0	3
	78	0	3	3	4	0	0	1	19	1	0	16	0	0	1	3
	83	0	3	2	4	0	0	0	19	0	1	15	0	99	1	2
##	85	0	3	2	4	0	0	0	18	1	1	15	0	99	0	3
##	89	0	2	5	4	0	1	0	33	1	0	40	1	0	0	2

mean(data.freq_1\$time)

[1] 4.44444

5/3/2020

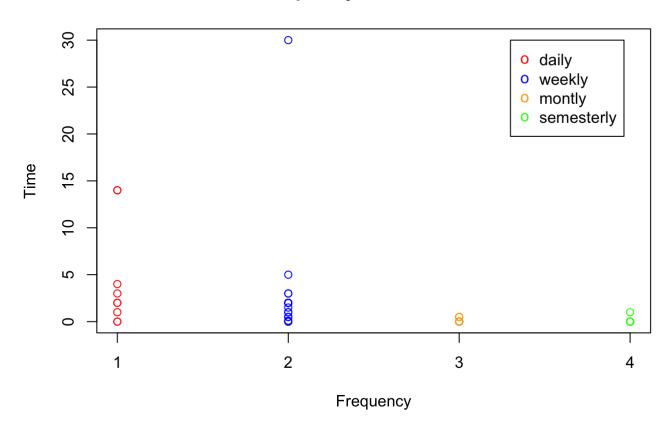
```
Homework 2
 mean(data.freq_2$time)
 ## [1] 2.539286
 mean(data.freq 3$time)
 ## [1] 0.0555556
 mean(data.freq_4$time)
 ## [1] 0.04347826
Plot for frequency and time.
 data$color[data$freq==1]="red"
 data$color[data$freq==2]="blue"
```

```
data$color[data$freq==3]="orange"
data$color[data$freq==4]="green"
data$color
```

```
"orange" "orange" "green"
                                                               "green"
   [1] "blue"
                                                      "green"
                                                                        "green"
                 "green"
                                                      "blue"
                                                               "blue"
   [9] "red"
                          "green"
                                   "green"
                                             "red"
                                                                        "green"
##
## [17] "orange" "blue"
                          "blue"
                                   "orange" "red"
                                                      "green"
                                                               "green"
                                                                        "orange"
                                   "blue"
                 "green"
                          "green"
                                             "orange" "orange" "red"
                                                                        "blue"
## [25] "green"
## [33] "orange" "green"
                          "green"
                                   "blue"
                                             "blue"
                                                      "blue"
                                                               "blue"
                                                                        "blue"
## [41] "blue"
                 "orange" "blue"
                                   "green"
                                            "blue"
                                                      "red"
                                                               "orange" "orange"
## [49] "green"
                 "red"
                          "blue"
                                   "red"
                                             "orange" "orange" "blue"
                                                                        "red"
## [57] "blue"
                 "green"
                          "blue"
                                   "blue"
                                             "green"
                                                      "orange" "blue"
                                                                        "blue"
                          "orange" "blue"
## [65] "orange" "green"
                                             "red"
                                                               "blue"
                                                      "green"
                                                                        "green"
## [73] "blue"
                 "blue"
                          "blue"
                                   "green"
                                            "blue"
                                                      "orange"
```

```
plot(x = data$freq, y = data$time, col=data$color, axes=FALSE, main = "Frequency and Tim
e Plot", xlab = "Frequency", ylab = "Time")
axis(side=1, at=c(1, 2, 3, 4))
axis(side=2, at=seq(0, 30, by=5))
legend(3.3, 30, legend=c("daily", "weekly", "montly", "semesterly"), col=c("red", "blue",
"orange", "green"), pch="o")
box()
```

Frequency and Time Plot



Grouped bar chart for busy or not busy frequency and time

```
library(ggplot2)
library(dplyr)

##
## Attaching package: 'dplyr'

## The following objects are masked from 'package:stats':
##
## filter, lag

## The following objects are masked from 'package:base':
##
## intersect, setdiff, setequal, union
```

```
data <- read.table("videodata.txt", header=TRUE)
data <- data[!(data$freq==99 | data$busy==99),]

busy.ind <- which(data['busy'] == 1)
data.busy <- data[busy.ind,]

not_busy.ind <- which(data['busy'] == 0)
data.not_busy <- data[not_busy.ind,]

#mutate(data, busy = factor(busy, labels = c("busy", "not busy")), freq = factor(freq))

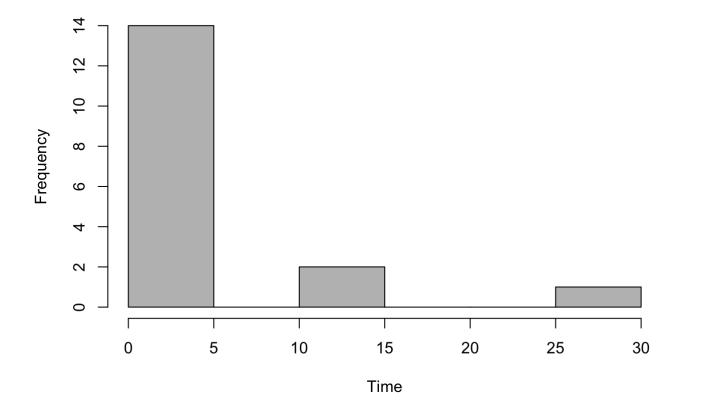
# Bar chart side by side
#ggplot(data, aes(x = freq, fill = busy)) + geom_bar(position=position_dodge()) + theme_classic

#ggplot(data, aes(freq, )) + geom_bar(aes(fill = busy), position = "dodge")

c1 <- "red2"
c2 <- "blue2"

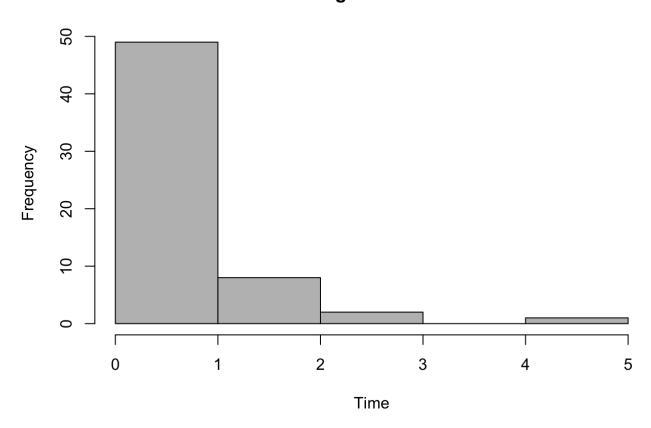
h_busy <- hist(data.busy$time, col=8, breaks=5, main = "Histogram of Time", xlab = "Time")</pre>
```

Histogram of Time



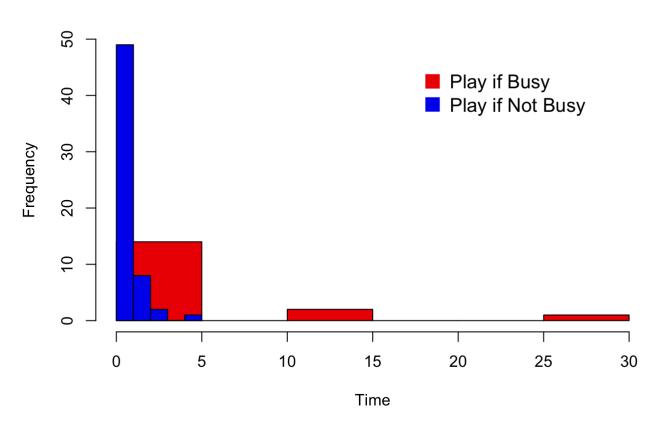
h_not_busy <- hist(data.not_busy\$time, col=8, breaks=5, main = "Histogram of Time", xlab = "Time")

Histogram of Time



```
plot(h_busy, col = c1, ylim=c(0,50), main="Histogram of Play if Busy vs Not Busy Time Di
stribution", xlab="Time")
plot(h_not_busy, col = c2, add = TRUE)
legend("topright",
    legend = c("Play if Busy", "Play if Not Busy"),
    col = c(c1, c2),
    pch = c(15,15),
    bty = "n",
    pt.cex = 2,
    cex = 1.2,
    text.col = "black",
    horiz = F ,
    inset = c(0.1, 0.1))
```

Histogram of Play if Busy vs Not Busy Time Distribution



```
data <- read.table("videodata.txt", header=TRUE)
data <- data[!(data$freq==99 | data$busy==99),]

busy.ind <- which(data['busy'] == 1)
data.busy <- data[busy.ind,]

not_busy.ind <- which(data['busy'] == 0)
data.not_busy <- data[not_busy.ind,]
nrow(data.busy)/nrow(data)</pre>
```

```
## [1] 0.2207792
```

```
nrow(data.not_busy)/nrow(data)
```

```
## [1] 0.7792208
```

Scenario 3

Consider making an interval estimate for the average amount of time spent playing video games in the week prior to the survey. Keep in mind the overall shape of the sample distribution. A simulation study may help determine the appropriateness of a interval estimate.

```
data <- read.table("videodata.txt", header=TRUE)
head(data)</pre>
```

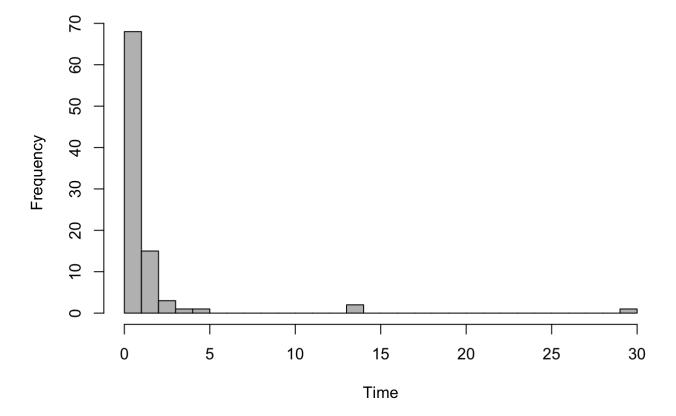
```
##
     time like where freq busy educ sex age home math work own cdrom email grade
## 1
       2.0
               3
                       3
                             2
                                   0
                                         1
                                              0
                                                 19
                                                         1
                                                               0
                                                                    10
                                                                          1
                                                                                 0
                                                                                         1
##
       0.0
               3
                       3
                             3
                                   0
                                         0
                                              0
                                                 18
                                                         1
                                                               1
                                                                     0
                                                                          1
                                                                                 1
                                                                                         1
                                                                                                2
   3
       0.0
               3
                       1
                             3
                                   0
                                                                     0
                                                                          1
                                                                                 0
                                                                                         1
                                                                                                3
##
                                         0
                                              1
                                                 19
                                                         1
       0.5
               3
                       3
                             3
                                   0
                                                 19
                                                               0
                                                                     0
                                                                                 0
                                                                                                3
                                                                                                3
       0.0
               3
                       3
                                         1
                                                 19
                                                         1
                                                               1
                                                                                         1
                                                                                                3
                                              1
                                                 19
                                                                    12
```

```
time.mean <- mean(data$time)
time.mean</pre>
```

```
## [1] 1.242857
```

```
hist(data$time, col=8, breaks=30, main = "Histogram of Time", xlab = "Time")
```

Histogram of Time



```
#old seed set.seed(189289)
set.seed(573929)
shuffle.ind=sample(1:nrow(data))
boot.population <- rep(data$time[shuffle.ind], length.out = 314)
length(boot.population)</pre>
```

```
## [1] 314
```

```
sample1 <- sample(boot.population, size = 91, replace = TRUE)</pre>
```

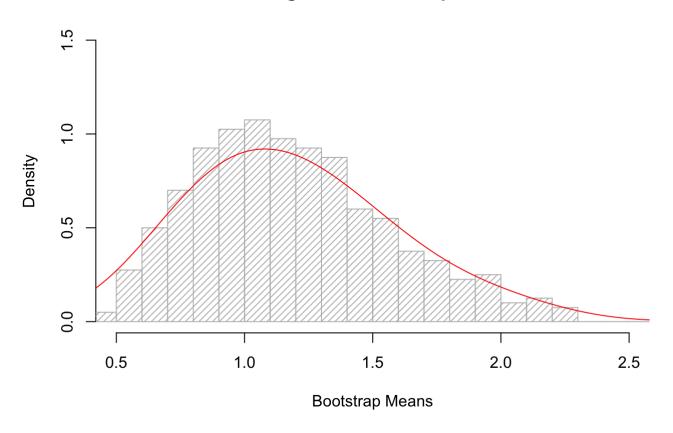
```
B = 400 # the number of bootstrap samples we want
boot.sample <- array(dim = c(B, 91))
for (i in 1:B) {
   boot.sample[i, ] <- sample(boot.population, size = 91, replace = TRUE)
}</pre>
```

```
boot.mean <- apply(X = boot.sample, MARGIN = 1, FUN = mean)
head(boot.mean)</pre>
```

```
## [1] 1.0010989 0.5824176 0.9021978 0.6549451 1.1604396 1.2417582
```

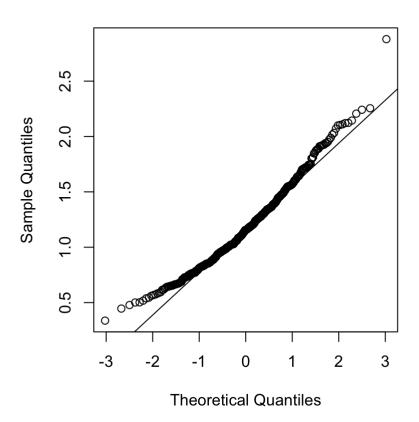
```
hist(boot.mean, xlim=c(0.5,2.5), ylim=c(0,1.5), breaks = 20, probability = TRUE, density = 20, col = 8, border = 8, main = "Histogram of Bootstrap Mean", xlab = "Bootstrap Mean s") lines(density(boot.mean, adjust = 2), col = 2)
```

Histogram of Bootstrap Mean



```
par(pty = 's')
qqnorm(boot.mean)
qqline(boot.mean)
```

Normal Q-Q Plot



```
ks.test((boot.mean - mean(boot.mean))/sd(boot.mean), pnorm)
```

```
## Warning in ks.test((boot.mean - mean(boot.mean))/sd(boot.mean), pnorm): ties
## should not be present for the Kolmogorov-Smirnov test
```

```
##
## One-sample Kolmogorov-Smirnov test
##
## data: (boot.mean - mean(boot.mean))/sd(boot.mean)
## D = 0.060836, p-value = 0.1035
## alternative hypothesis: two-sided
```

```
boot.sd <- sd(boot.mean)
time.mean + c(-1, 1)*1.96*boot.sd</pre>
```

```
## [1] 0.4812784 2.0044359
```

Scenario 4

Next consider the "attitude" questions. In general, do you think the students enjoy playing video games? if you had to make a short list of the most important reasons why studetns like/dislike video games, what would you put on the list? Don't forget that those students who say that they have never played video games or do not at all like

video games are asked to skip over some of these questions. So, there may be many nonrespondents to the questions as to whether they think video games are educational, where they play video games, etc.

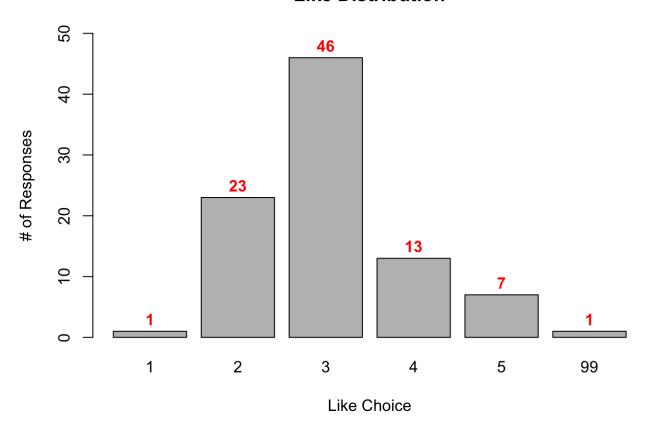
Barplot for "like" distribution in the "videodata.txt" dataset

```
counts <- table(data$like)
counts</pre>
```

```
##
## 1 2 3 4 5 99
## 1 23 46 13 7 1
```

```
bp <- barplot(counts, main="Like Distribution", xlab="Like Choice", ylab="# of Response
s", ylim=c(0,50), col=8)
text(bp, counts + 2, counts, font=2, col=2)</pre>
```

Like Distribution



```
data <- read.table("videodata.txt", header=TRUE)

like.ind <- which(!(data$like==1 | data$like==5 | data$like==99))

like <- data[!(data$like==1 | data$like==5 | data$like==99),]

like.ind</pre>
```

```
## [1] 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 17 18 19 20 21 22 23 26 27 28 ## [26] 29 30 31 32 33 34 35 36 37 38 39 40 41 42 43 44 45 46 47 48 50 51 53 54 55 ## [51] 56 57 58 59 60 61 62 63 64 65 66 67 68 69 70 71 72 74 76 78 79 80 81 83 84 ## [76] 85 86 87 88 89 90 91
```

Reading in the new "videoMultiple.txt" dataset

```
#read in "videoMultiple.txt" into data
data <- read.table("videoMultiple.txt", header=TRUE)
data.like <- data[like.ind,]
data = data.like
head(data)</pre>
```

```
##
      action adv sim sport strategy relax coord challenge master bored other
## 1
                 0
                      0
                             0
                                        1
                                               1
                                                      0
                                                                   1
                                                                           1
## 2
                      0
                                                                           0
                                                                                  1
            0
                 1
                             0
                                        1
                                                      0
                                                                   0
## 3
            1
                     0
                             1
                                        1
                                               1
                                                                   0
                                                                           0
                                                                                  0
                 0
                                                      0
## 4
            0
                 0
                             0
                                        1
                                               0
                                                                   1
                                                                           0
                                                                                  0
## 5
            0
                 0
                      0
                                               1
                                                                   1
                                                                           1
## 6
            1
                 0
                             1
                                        1
                                               1
                                                      0
##
      graphic time frust lonely rules cost boring friends point other2
## 1
             0
                          0
                                   0
                                          0
                                                         0
                   1
                                                1
                                                                   0
## 2
                                                0
             0
                   1
                          1
                                   0
                                          0
                                                         0
                                                                   0
                                                                          0
## 3
             0
                   0
                          0
                                   0
                                          0
                                                         0
                                                                          0
                                                1
                                                                   0
## 4
                   1
                          0
                                   0
                                          0
                                                0
                                                                          0
## 5
             0
                   0
                          0
                                   0
                                          1
                                                1
                                                                   0
                                                                          0
## 6
                          1
                                                1
                                                                          0
```

Only like = 2,3,4

```
counts <- table(like$like)
counts</pre>
```

```
##
## 2 3 4
## 23 46 13
```

```
bp <- barplot(counts, main="New Like Distribution", xlab="Like Choice", ylab="# of Respo
nses", ylim=c(0,50), col=8)
text(bp, counts + 2, counts, font=2, col=2)</pre>
```

New Like Distribution

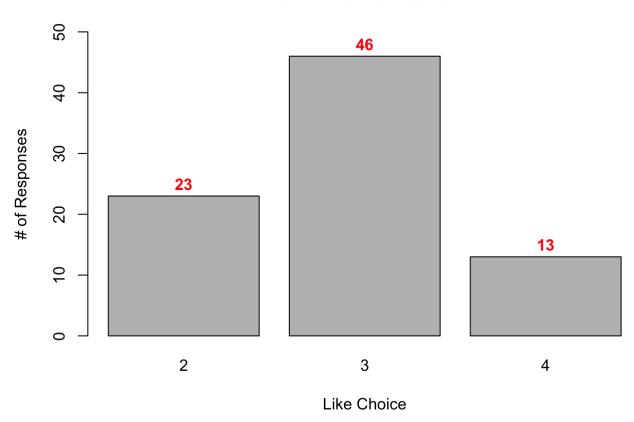


Table 1

```
action = Action
adv = Adventure
sim = Simulation
sport = Sports
strategy = Strategy
```

```
table1 <- data[,c("action", "adv", "sim", "sport", "strategy")]
head(table1)</pre>
```

```
## action adv sim sport strategy
## 1 0 0 0 0 1
## 2 0 1 0 0 0 1
## 3 1 0 0 1 1
## 4 0 0 0 0 0 1
## 5 0 0 0 0 0 1
## 6 1 0 0 1 1
```

Table 2

graphic = Graphics/Realism

```
relax = Relaxation

coord = Eye/hand coordination

challenge = MentalChallenge

master = Felling of mastery

bored = Bored

other = other
```

```
table2 <- data[,c("graphic", "relax", "coord", "challenge", "master", "bored")]
head(table2)</pre>
```

```
##
      graphic relax coord challenge master bored
## 1
             0
                                       1
                                                1
                    1
                           0
             0
## 2
                    0
                           0
                                                0
                                                       1
             0
                                                       0
## 3
                    1
                           0
                                                0
## 4
                           0
                                       1
## 5
             0
                    1
                           0
                                       1
                                                1
                                                       0
## 6
                    1
                                                1
```

```
graphic.ind <- which(table2["graphic"] == 1)</pre>
table2.graphic <- table2[graphic.ind,]</pre>
relax.ind <- which(table2["relax"] == 1)</pre>
table2.relax <- table2[relax.ind,]</pre>
coord.ind <- which(table2["coord"] == 1)</pre>
table2.coord <- table2[coord.ind,]</pre>
challenge.ind <- which(table2["challenge"] == 1)</pre>
table2.challenge <- table2[challenge.ind,]</pre>
master.ind <- which(table2["master"] == 1)</pre>
table2.master <- table2[master.ind,]</pre>
bored.ind <- which(table2["bored"] == 1)</pre>
table2.bored <- table2[bored.ind,]</pre>
like <- matrix(c(nrow(table2.graphic),nrow(table2.relax),nrow(table2.coord),nrow(table2.</pre>
challenge),nrow(table2.master),nrow(table2.bored)),ncol=6,byrow=TRUE)
colnames(like) <- c("graphic", "relax", "coord", "challenge", "master", "bored")</pre>
like <- as.table(like)</pre>
like
```

```
## graphic relax coord challenge master bored
## A 23 58 4 21 25 24
```

bp <- barplot(like, main="Like Game Reason Distribution", xlab="Categories", ylab="# of
Responses", ylim=c(0,65), col=8)
text(bp, like + 2, like, font=2, col=2)</pre>

Like Game Reason Distribution

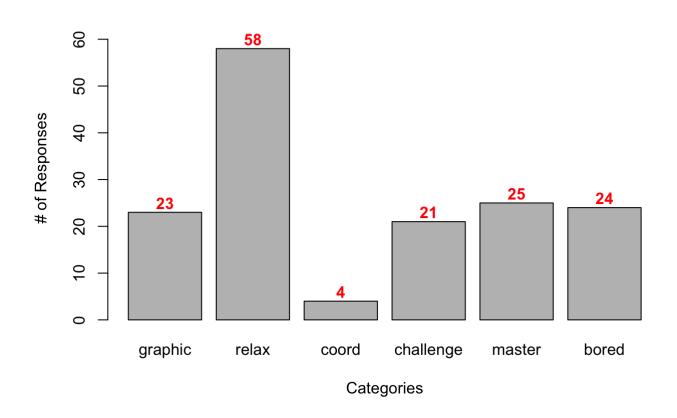


Table 3

```
time = Too much time
frust = Frustrating
lonely = Lonely
rules = Too many rules
cost = Costs too much
boring = Boring
friends = Friend's don't play
point = It is pointless
other2 = other

table3 <- data[,c("time", "frust", "lonely", "rules", "cost", "boring", "friends", "point")]
head(table3)</pre>
```

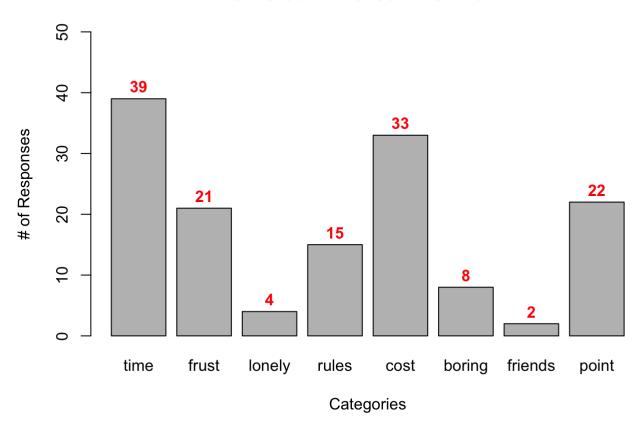
```
##
     time frust lonely rules cost boring friends point
## 1
                         0
                                0
                                       1
                                       0
                                                                0
## 2
         1
                 1
                         0
                                 0
                                               0
                                                         0
## 3
                 0
                         0
                                               0
                                                         0
                                                                0
         0
                                 0
                                       1
## 4
         1
                 0
                         0
                                0
                                       0
                                               0
                                                         0
                                                                0
## 5
                 0
                         0
                                1
                                       1
                                               0
                                                         0
                                                                0
## 6
                                                                0
```

```
time.ind <- which(table3["time"] == 1)</pre>
table3.time <- table3[time.ind,]</pre>
frust.ind <- which(table3["frust"] == 1)</pre>
table3.frust <- table3[frust.ind,]</pre>
lonely.ind <- which(table3["lonely"] == 1)</pre>
table3.lonely <- table3[lonely.ind,]
rules.ind <- which(table3["rules"] == 1)</pre>
table3.rules <- table3[rules.ind,]</pre>
cost.ind <- which(table3["cost"] == 1)</pre>
table3.cost <- table3[cost.ind,]</pre>
boring.ind <- which(table3["boring"] == 1)</pre>
table3.boring <- table3[boring.ind,]</pre>
friends.ind <- which(table3["friends"] == 1)</pre>
table3.friends <- table3[friends.ind,]</pre>
point.ind <- which(table3["point"] == 1)</pre>
table3.point <- table3[point.ind,]</pre>
dislike <- matrix(c(nrow(table3.time),nrow(table3.frust),nrow(table3.lonely),nrow(table</pre>
3.rules),nrow(table3.cost),nrow(table3.boring),nrow(table3.friends),nrow(table3.point)),
ncol=8,byrow=TRUE)
colnames(dislike) <- c("time", "frust", "lonely", "rules", "cost", "boring", "friends",</pre>
"point")
dislike <- as.table(dislike)</pre>
dislike
```

```
## time frust lonely rules cost boring friends point
## A 39 21 4 15 33 8 2 22
```

```
bp <- barplot(dislike, main="Dislike Game Reason Distribution", xlab="Categories", ylab=
"# of Responses", ylim=c(0,50), col=8)
text(bp, dislike + 2, dislike, font=2, col=2)</pre>
```

Dislike Game Reason Distribution



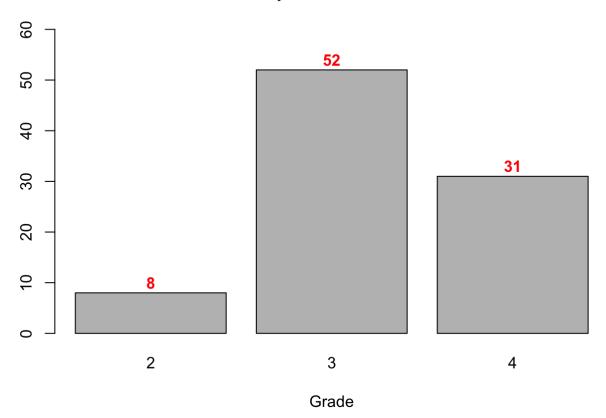
Advanced Analysis and Scenario 5

```
data <- read.table("videodata.txt", header=TRUE)</pre>
head(data)
     time like where freq busy educ sex age home math work own cdrom email grade
##
       2.0
               3
                      3
                                                19
                                                                  10
       0.0
               3
                      3
                            3
                                  0
                                        0
                                                18
                                                       1
                                                                        1
                                                                               1
                                                                                      1
                                                                                             2
       0.0
                            3
                                  0
                                                19
                                                                   0
                                                                               0
                                                                                             3
               3
                                        0
                                                                                             3
       0.5
                                        1
                                                19
   5
       0.0
               3
                      3
                                  0
                                        1
                                             0
                                                19
                                                       1
                                                             1
                                                                   0
                                                                        0
                                                                               0
                                                                                      1
                                                                                             3
                                                19
       0.0
                                        0
                                                                  12
                                                                               0
                                                                                      0
                                                                                             3
## 6
                                             1
fdata <- read.table("videoMultiple.txt",header=TRUE)</pre>
```

```
action adv sim sport strategy relax coord challenge master bored other
##
## 1
                                        1
                                               1
                                                      0
                                                                  1
## 2
            0
                     0
                                        1
                                                      0
                                                                  0
                                                                           0
                                                                                  1
                1
                            0
                                        1
                                                                           0
                                                                                  0
##
   3
            1
                0
                     0
                            1
                                               1
                                                      0
                                                                  0
                                        1
                                               0
                                                                  1
                                                                           0
                                        1
  5
            0
                0
                                               1
                                                      0
##
                                                                           1
                                               1
##
            1
                                        1
##
      graphic time frust lonely rules cost boring friends point other2
                                   0
## 1
                   1
                                          0
                                                1
                                                                         0
##
             0
                   1
                          1
                                   0
                                          0
                                                0
                                                        0
                                                                  0
## 3
             0
                   0
                          0
                                  0
                                          0
                                                        0
                                                                  0
                                                                         0
                                                1
## 4
                   1
                          0
                                          0
                                                0
                                                                         0
                                   0
                                                                  0
## 5
             0
                   0
                          0
                                                1
                                                                         0
                                   0
                                          1
                                                                  0
## 6
                                                1
                                                                         0
```

```
counts <- table(data$grade)
bp <-barplot(counts, main="Expected Grades", xlab="Grade", ylim=c(0,60))
text(bp, counts + 2, counts, font=2, col=2)</pre>
```

Expected Grades



Advanced Analysis

kruskal.test(action~point,data=fdata)

```
##
## Kruskal-Wallis rank sum test
##
## data: action by point
## Kruskal-Wallis chi-squared = 5.119, df = 1, p-value = 0.02366
```

SCENARIO 5

```
# data for males
male.ind <- which(data['sex'] == 1)
data.male <- data[male.ind,]
head(data.male)</pre>
```

```
##
       time like where freq busy educ sex age home math work own cdrom email grade
## 3
                 3
                        1
                              3
                                    0
                                           0
                                                1
                                                   19
                                                           1
                                                                 0
                                                                       0
                                                                            1
                                                                                                  3
                 3
                        2
                                                                 0
                                                                            0
                                                                                   0
                                                                                           0
## 6
           0
                              4
                                    0
                                           0
                                                1
                                                   19
                                                           0
                                                                      12
                                                                                                  3
## 7
                 4
                        3
                                           0
                                                   20
                                                                                   0
                                                                                           1
                                                                                                  3
           0
                              4
                                    0
                                                1
                                                           1
                                                                 1
                                                                      10
                                                                            1
                 3
## 9
           2
                                    1
                                           1
                                                   19
                                                           0
                                                                 0
                                                                       0
                                                                            0
## 10
           0
                 3
                        3
                              4
                                    0
                                           1
                                               1
                                                   19
                                                           1
                                                                 1
                                                                       0
                                                                            1
                                                                                           1
                                                                                                  4
## 16
                 5
                       99
                             99
                                   99
                                         99
                                               1 19
                                                           1
                                                                 0
                                                                       0
                                                                            1
                                                                                           1
                                                                                                  3
```

```
# data for females
female.ind <- which(data['sex']==0)
data.female <- data[female.ind,]
head(data.female)</pre>
```

```
time like where freq busy educ sex age home math work own cdrom email grade
##
## 1
        2.0
                 3
                        3
                              2
                                          1
                                                   19
                                                          1
                                                                0
                                                                     10
                                                                                   0
                                                                                          1
                                                                                                 4
                                    0
                                               0
                                                                           1
## 2
        0.0
                 3
                                                                                   1
                                                                                          1
                        3
                              3
                                    0
                                          0
                                                          1
                                                                1
                                                                      0
                                                                           1
                                                                                                 2
                                               0
                                                   18
## 4
        0.5
                 3
                                                          1
                                                                      0
                                                                           1
                                                                                   0
                        3
                              3
                                    0
                                          1
                                               0
                                                   19
                                                                0
                                                                                                 3
## 5
        0.0
                 3
                        3
                                          1
                                                   19
                                                          1
                                                                           0
                                                                                                 3
## 8
        0.0
                 3
                        3
                              4
                                    0
                                          0
                                                   19
                                                                0
                                                                     13
                                                                           0
                                                                                   0
                                                                                          1
                                                                                                 3
                                               0
                                                          1
## 11
        0.0
                 3
                        1
                                    0
                                          0
                                               0
                                                   20
                                                          1
                                                                0
                                                                      0
                                                                           1
                                                                                          0
                                                                                                 3
```

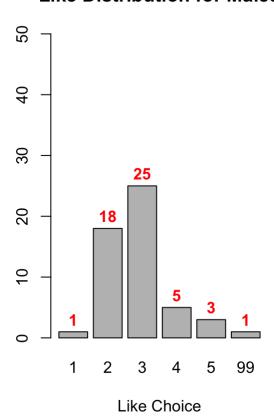
```
par(mfrow = c(1:2))

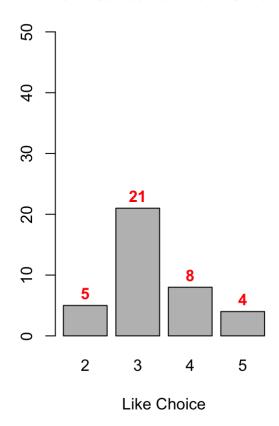
counts <- table(data.male$like)
bp <-barplot(counts, main="Like Distribution for Males", xlab="Like Choice", ylim=c(0,50))
text(bp, counts + 2, counts, font=2, col=2)

counts <- table(data.female$like)
bp <-barplot(counts, main="Like Distribution for Females", xlab="Like Choice", ylim=c(0,50))
text(bp, counts + 2, counts, font=2, col=2)</pre>
```

Like Distribution for Males

Like Distribution for Females





```
# data of students who do own a computer
owncom.ind <- which(data['own'] == 1)
data.owncom <- data[owncom.ind,]
head(data.owncom)</pre>
```

```
##
       time like where freq busy educ sex age home math work own cdrom email grade
                                     0
                                                           1
                                                                      10
                                                                             1
                                                                                    0
## 1
                                                    19
## 2
        0.0
                 3
                        3
                               3
                                     0
                                           0
                                                0
                                                    18
                                                           1
                                                                 1
                                                                        0
                                                                             1
                                                                                    1
                                                                                           1
                                                                                                   2
## 3
        0.0
                 3
                        1
                               3
                                     0
                                           0
                                                1
                                                    19
                                                           1
                                                                 0
                                                                        0
                                                                             1
                                                                                    0
                                                                                                   3
                 3
## 4
        0.5
                        3
                               3
                                     0
                                           1
                                                0
                                                    19
                                                           1
                                                                 0
                                                                        0
                                                                             1
                                                                                    0
                                                                                           1
                                                                                                   3
## 7
        0.0
                        3
                                     0
                                           0
                                                    20
                                                           1
                                                                 1
                                                                      10
                                                                             1
                                                                                    0
                                                                                           1
                                                                                                   3
                                                1
## 10
        0.0
                 3
                        3
                                           1
                                                    19
                                                           1
                                                                 1
                                                                        0
                                                                             1
                                                                                    0
                                                                                           1
                                                                                                   4
                                                1
```

```
# data of students who do not own a computer
nocom.ind <- which(data['own'] == 0)
data.nocom <- data[nocom.ind,]
head(data.nocom)</pre>
```

```
##
       time like where freq busy educ sex age home math work own cdrom email grade
## 5
                        3
                                     0
                                                   19
                                           1
                                                0
                                                           1
                                                                 1
                 3
                        2
                                                                 0
                                                                                           0
## 6
           0
                                     0
                                           0
                                                1
                                                   19
                                                           0
                                                                      12
                                                                            0
                                                                                   0
                                                                                                  3
                 3
## 8
                        3
                                     0
                                           0
                                                                 0
                                                                      13
                                                                            0
                                                                                   0
                                                                                           1
                                                                                                  3
           0
                               4
                                                0
                                                   19
                                                           1
## 9
           2
                 3
                        2
                               1
                                     1
                                           1
                                                   19
                                                           0
                                                                 0
                                                                       0
                                                                            0
                                                                                                  4
                 2
                               1
                                     0
                                                                 1
                                                                       0
## 13
                                                   19
                                                           1
                                                                            0
                                                                                                  4
## 14
                 3
                                                   18
                                                                                                  3
```

```
par(mfrow = c(1:2))

counts <- table(data.owncom$like)

bp <-barplot(counts, main="Students who own Computers", xlab="Like Choice", ylim=c(0,50))

text(bp, counts + 2, counts, font=2, col=2)

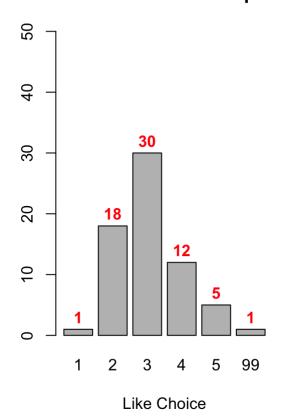
counts <- table(data.nocom$like)

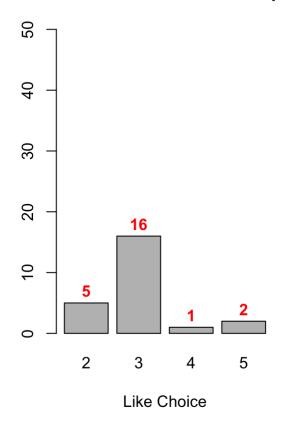
bp <-barplot(counts, main="Students who don't have computers", xlab="Like Choice", ylim=c(0,50))

text(bp, counts + 2, counts, font=2, col=2)</pre>
```

Students who own Computers

Students who don't have compute





data of students who do work
work.ind <- which(data['work'] > 0)
data.work <- data[work.ind,]
head(data.work)</pre>

```
##
       time like where freq busy educ sex age home math work own cdrom email grade
## 1
                        3
                              2
                                    0
                                          1
                                               0
                                                   19
                                                          1
                                                                0
                                                                     10
                                                                           1
## 6
                 3
                        2
                                                          0
                                                                0
                                                                           0
                                                                                   0
                                                                                          0
          0
                              4
                                    0
                                          0
                                               1
                                                   19
                                                                     12
                                                                                                  3
## 7
                 4
                                          0
                                                   20
                                                                                   0
                                                                                          1
                                                                                                  3
          0
                        3
                              4
                                    0
                                               1
                                                          1
                                                                1
                                                                     10
                                                                           1
## 8
          0
                 3
                        3
                              4
                                    0
                                          0
                                               0
                                                   19
                                                          1
                                                                0
                                                                     13
                                                                           0
                                                                                   0
                                                                                          1
                                                                                                  3
## 15
                 3
                              2
          1
                        5
                                    0
                                          1
                                               0
                                                   18
                                                          1
                                                                1
                                                                     14
                                                                           1
                                                                                   0
                                                                                          1
                                                                                                  3
## 17
                 3
                        3
                                          1
                                               1
                                                   21
                                                          1
                                                                0
                                                                      2
                                                                           1
                                                                                                  4
```

```
# data of students that do not work
nowork.ind <- which(data['work'] == 0)
data.nowork <- data[nowork.ind,]
head(data.nowork)</pre>
```

```
##
       time like where freq busy educ sex age home math work own cdrom email grade
## 2
        0.0
                 3
                        3
                              3
                                    0
                                          0
                                               0
                                                   18
                                                          1
                                                                 1
                                                                       0
                                                                           1
                                                                                   1
                                                                                          1
                                                                                                  2
## 3
        0.0
                 3
                        1
                              3
                                    0
                                           0
                                                   19
                                                          1
                                                                 0
                                                                       0
                                                                           1
                                                                                   0
                                                                                          1
                                                                                                  3
                                               1
## 4
        0.5
                 3
                        3
                              3
                                    0
                                           1
                                               0
                                                   19
                                                          1
                                                                 0
                                                                       0
                                                                           1
                                                                                   0
                                                                                          1
                                                                                                  3
## 5
        0.0
                 3
                        3
                                    0
                                           1
                                                   19
                                                          1
                                                                 1
                                                                       0
                                                                           0
                                                                                   0
                                                                                                  3
## 9
        2.0
                 3
                        2
                                           1
                                                   19
                                                                 0
                                                                       0
                                                                           0
                                                                                   0
                                                                                          0
                                                                                                  4
                              1
                                    1
                                               1
                                                          0
                 3
                                           1
                                                          1
                                                                           1
                                                                                          1
## 10
        0.0
                        3
                              4
                                    0
                                               1
                                                   19
                                                                 1
                                                                                                  4
```

```
par(mfrow = c(1:2))

counts <- table(data.work$like)

bp <-barplot(counts, main="Students who work", xlab="Like Choice", ylim=c(0,50))

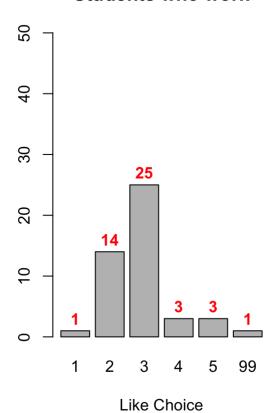
text(bp, counts + 2, counts, font=2, col=2)

counts <- table(data.nowork$like)

bp <-barplot(counts, main="Students who do not work", xlab="Like Choice", ylim=c(0,50))

text(bp, counts + 2, counts, font=2, col=2)</pre>
```

Students who work



Students who do not work

