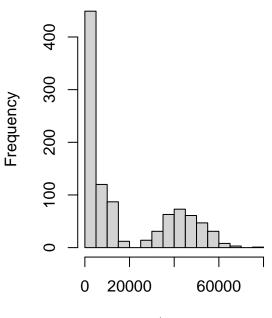
Patel's 02 DDS Case Study

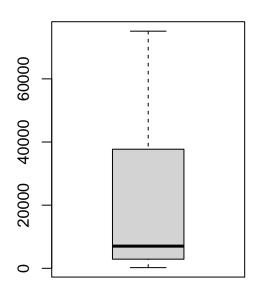
Harsh Patel

2024-09-06

```
# Distributions of single variables
#1.
#load the dataset
library(oibiostat)
data("dds.discr")
#produce table of the first five rows
dds.discr[1:5, ]
##
        id age.cohort age gender expenditures
                                                      ethnicity
## 1 10210
               13-17 17 Female
                                        2113 White not Hispanic
## 2 10409
                22-50 37
                           Male
                                       41924 White not Hispanic
## 3 10486
                 0-5 3 Male
                                       1454
                                                       Hispanic
               18-21 19 Female
## 4 10538
                                        6400
                                                       Hispanic
## 5 10568
               13-17 13 Male
                                        4412 White not Hispanic
#2.
#a)
#The distribution of annual expenditures is right-skewed.
#With most consumers spending between $0 and $5,000.
#While a few spend $60,000 to $80,000. Quartiles are $2,899, $7,026, and $37,710.
#graphical summaries
par(mfrow = c(1, 2)) #displays plots as 1 row / 2 column layout
hist(dds.discr$expenditures)
boxplot(dds.discr$expenditures)
```

Histogram of dds.discr\$expenditu

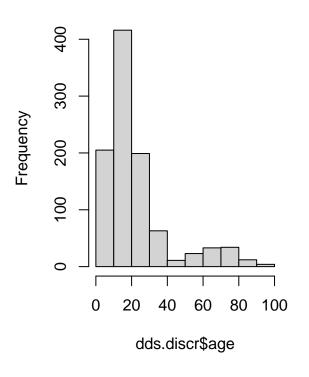


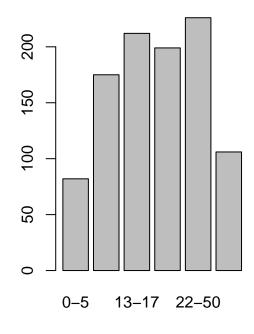


dds.discr\$expenditures

```
#numerical summaries
summary(dds.discr$expenditures)
##
      Min. 1st Qu.
                    Median
                              Mean 3rd Qu.
                                               Max.
##
       222
              2899
                      7026
                             18066
                                      37713
                                              75098
#b)
#graphical summaries
par(mfrow = c(1, 2)) #displays the following plots as 1 row / 2 column layout
hist(dds.discr$age)
plot(dds.discr$age.cohort)
```

Histogram of dds.discr\$age





```
#numerical summaries
summary(dds.discr$age)
      Min. 1st Qu.
##
                    Median
                               Mean 3rd Qu.
                                               Max.
##
       0.0
              12.0
                       18.0
                               22.8
                                       26.0
                                               95.0
table(dds.discr$age.cohort)
##
##
          6-12 13-17 18-21 22-50
                                    51+
                                    106
##
      82
           175
                 212
                       199
                              226
#The histogram shows right-skewing, with most consumers under 30 years old.
#The median age is 18, with around 200 people in the middle four age groups and about 100 in the other
#c)
#graphical summaries
plot(dds.discr$ethnicity)
#numerical summaries
```

table(dds.discr\$ethnicity)

```
American Indian
                                     Asian
                                                        Black
                                                                         Hispanic
##
##
                                       129
                                                            59
                                                                               376
##
           Multi Race
                          Native Hawaiian
                                                        Other White not Hispanic
##
                    26
                                                                               401
```

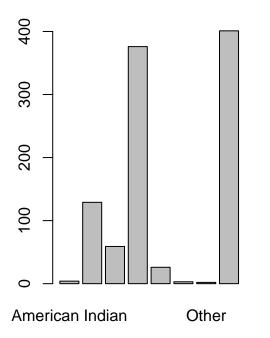
prop.table(table(dds.discr\$ethnicity)) #converts a table of counts to proportions

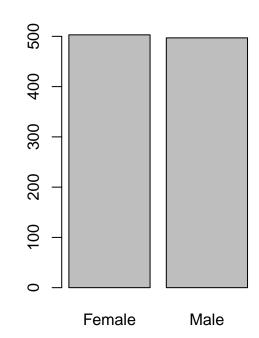
```
##
##
      American Indian
                                    Asian
                                                        Black
                                                                         Hispanic
                                    0.129
##
                0.004
                                                        0.059
                                                                             0.376
           Multi Race
##
                          Native Hawaiian
                                                        Other White not Hispanic
                0.026
                                    0.003
                                                                             0.401
##
                                                        0.002
```

#The data includes eight ethnic groups, but with unequal representation. #Hispanics and \forall Hite non-Hispanics make up about 80% of the consumers.

#d)

#graphical summaries
plot(dds.discr\$gender)



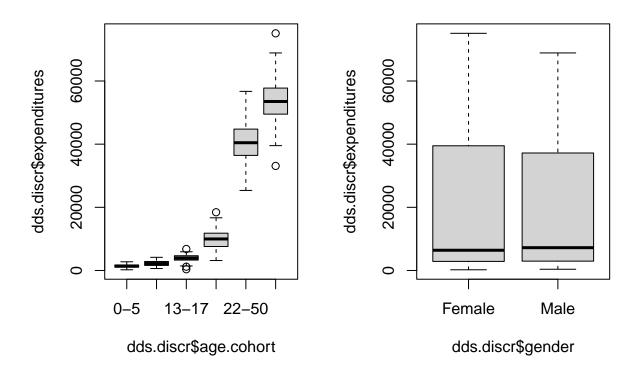


```
#numerical summaries
table(dds.discr$gender)
```

```
## Female
            Male
##
      503
            497
#Yes, the gender distribution is roughly equal, with about half female and half male.
#Relationships between two variables
#3.
#graphical summaries
boxplot(dds.discr$expenditures ~ dds.discr$age.cohort)
#numerical summaries
summary(dds.discr$expenditures[dds.discr$age.cohort == "0-5"])
##
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                              Max.
       222
              1034
                      1380
                              1415
                                      1739
                                              2750
##
summary(dds.discr$expenditures[dds.discr$age.cohort=="6-12"])
##
     Min. 1st Qu. Median
                              Mean 3rd Qu.
                                              Max.
##
              1602
                      2191
                              2227
                                      2846
                                              4163
summary(dds.discr$expenditures[dds.discr$age.cohort=="13-17"])
##
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                              Max.
       386
              3306
                              3923
                                      4666
##
                      3952
                                              6798
summary(dds.discr$expenditures[dds.discr$age.cohort=="18-21"])
##
     Min. 1st Qu. Median
                              Mean 3rd Qu.
                                              Max.
##
      3153
              7588
                      9979
                              9889
                                     11806
                                             18435
summary(dds.discr$expenditures[dds.discr$age.cohort=="22-50"])
##
     Min. 1st Qu. Median
                              Mean 3rd Qu.
                                              Max.
##
     25348
            36447
                     40456
                             40209
                                     44721
                                             56716
summary(dds.discr$expenditures[dds.discr$age.cohort=="51+"])
                              Mean 3rd Qu.
##
     Min. 1st Qu. Median
                                              Max.
           49515
                   53509
                             53522
                                             75098
##
     33110
                                   57746
#Expenditures rise with age, with older individuals receiving more DDS funds.
#Average expenditures range from $1,400 to $10,000.
#For the youngest cohorts and increase to about $40,000 and $53,500 for the oldest.
#The data's broad age range explains the variation.
#A dataset limited to one age group, like 18-21 years, would show less variability.
#This trend aligns with the goal of DDS funds to support increasing financial needs as individuals age.
```

```
#4.

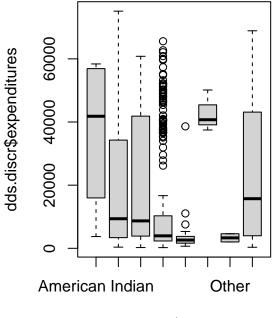
#graphicalsummaries
boxplot(dds.discr$expenditures ~ dds.discr$gender)
```

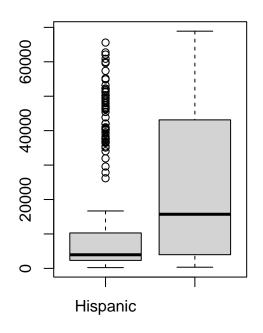


```
#numerical summaries
summary(dds.discr$expenditures[dds.discr$gender == "Male"])
##
                    Median
      Min. 1st Qu.
                               Mean 3rd Qu.
                                               Max.
       386
              2954
                      7219
                              18001
                                      37201
                                              68890
##
summary(dds.discr$expenditures[dds.discr$gender == "Female"])
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                               Max.
##
       222
              2872
                      6400
                              18130
                                      39488
                                              75098
#Expenditures for both males and females are similarly right-skewed.
#With comparable medians and interquartile ranges.
#5.
#graphical summaries
boxplot(dds.discr$expenditures ~ dds.discr$ethnicity)
```

```
#numerical summaries
summary(dds.discr$expenditures[dds.discr$ethnicity == "American Indian"])
##
     Min. 1st Qu. Median
                             Mean 3rd Qu.
                                             Max.
     3726 22085 41818
                                    56171
                            36438
                                            58392
##
summary(dds.discr$expenditures[dds.discr$ethnicity == "Asian"])
     Min. 1st Qu. Median
##
                             Mean 3rd Qu.
                                             Max.
      374
                     9369
                            18392
                                    34274
##
             3382
                                            75098
summary(dds.discr$expenditures[dds.discr$ethnicity == "Black"])
##
     Min. 1st Qu. Median
                             Mean 3rd Qu.
                                             Max.
##
      240
             3870
                     8687
                            20885
                                    41857
                                            60808
summary(dds.discr$expenditures[dds.discr$ethnicity == "Hispanic"])
##
     Min. 1st Qu. Median
                             Mean 3rd Qu.
                                             Max.
      222
             2331
                     3952
                            11066
                                    10292
                                            65581
##
summary(dds.discr$expenditures[dds.discr$ethnicity == "Multi Race"])
     Min. 1st Qu. Median
                             Mean 3rd Qu.
##
                                             Max.
                     2622
                             4457
                                     3750
##
      669
             1690
                                            38619
summary(dds.discr$expenditures[dds.discr$ethnicity == "Native Hawaiian"])
##
     Min. 1st Qu. Median
                             Mean 3rd Qu.
                                             Max.
                            42782
##
            39103 40727
                                    45434
                                            50141
summary(dds.discr$expenditures[dds.discr$ethnicity == "Other"])
##
     Min. 1st Qu. Median
                             Mean 3rd Qu.
                                             Max.
##
     2018
             2667
                     3316
                             3316
                                     3966
                                             4615
summary(dds.discr$expenditures[dds.discr$ethnicity == "White not Hispanic"])
##
     Min. 1st Qu. Median
                            Mean 3rd Qu.
                                             Max.
      340
             3977 15718
                            24698
                                    43134
                                            68890
##
#bonus:usingtapply( )
tapply(dds.discr$expenditures, dds.discr$ethnicity, summary)
```

```
## $'American Indian'
##
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                               Max.
      3726
             22085
                                              58392
##
                    41818
                             36438
                                     56171
##
## $Asian
##
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                               Max.
##
       374
              3382
                      9369
                             18392
                                     34274
                                              75098
##
## $Black
##
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                               Max.
##
              3870
                      8687
                             20885
                                     41857
                                              60808
##
## $Hispanic
##
                              Mean 3rd Qu.
      Min. 1st Qu. Median
                                               Max.
##
       222
              2331
                      3952
                             11066
                                     10292
                                              65581
##
## $'Multi Race'
##
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                               Max.
##
       669
              1690
                      2622
                              4457
                                      3750
                                              38619
##
## $'Native Hawaiian'
##
     Min. 1st Qu. Median
                              Mean 3rd Qu.
     37479
           39103
                    40727
                             42782
                                     45434
                                              50141
##
##
## $Other
                              Mean 3rd Qu.
##
      Min. 1st Qu. Median
                                               Max.
##
      2018
              2667
                      3316
                              3316
                                      3966
                                               4615
##
## $'White not Hispanic'
##
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                               Max.
##
       340
              3977
                     15718
                             24698
                                     43134
                                              68890
#Expenditure distributions vary by ethnicity. Multi Race, Native Hawaiian.
#And Other groups show little variation.
#While groups like White non-Hispanics have a wider range.
#American Indian and Native Hawaiian groups have a median annual support of about $40,000.
#Compared to $10,000 for Asian and Black consumers.
#The tapply() function can summarize these differences more efficiently than summary().
#A closer look
#6.
#graphical summaries
boxplot(dds.discr$expenditures[dds.discr$ethnicity == "Hispanic"],
        dds.discr$expenditures[dds.discr$ethnicity == "White not Hispanic"],
        names = c("Hispanic", "White not Hispanic"))
```





dds.discr\$ethnicity

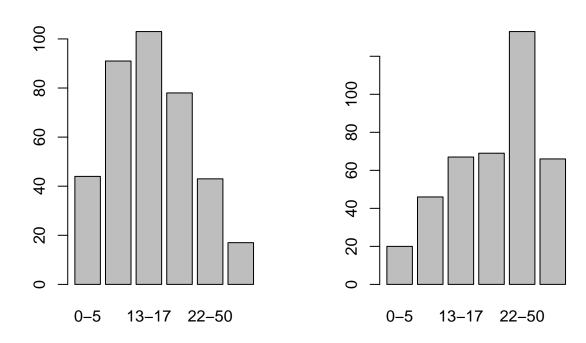
```
#numerical summaries
summary(dds.discr$expenditures[dds.discr$ethnicity == "Hispanic"])
##
      Min. 1st Qu.
                    Median
                              Mean 3rd Qu.
                                               Max.
##
       222
              2331
                      3952
                              11066
                                      10292
                                              65581
IQR(dds.discr$expenditures[dds.discr$ethnicity == "Hispanic"])
## [1] 7961.25
summary(dds.discr$expenditures[dds.discr$ethnicity == "White not Hispanic"])
##
      Min. 1st Qu.
                    Median
                              Mean 3rd Qu.
                                               Max.
##
              3977
                     15718
                              24698
                                      43134
                                              68890
IQR(dds.discr$expenditures[dds.discr$ethnicity == "White not Hispanic"])
## [1] 39157
#The boxplot shows that most Hispanic consumers receive between $0 and $20,000.
#From California DDS, with higher amounts being upper outliers.
```

#In contrast, White non-Hispanic consumers have a median expenditure of \$15,718.

```
#With the middle 50% receiving between $4,000 and $43,000.
#Hispanic consumers average $11,066, while White non-Hispanics average $24,698.
#Indicating that Hispanics receive less financial support on average.

#7.

#graphical summaries
par(mfrow = c(1, 2)) #displays the following plots as 1 row / 2 column layout
plot(dds.discr$age.cohort[dds.discr$ethnicity == "Hispanic"])
plot(dds.discr$age.cohort[dds.discr$ethnicity == "White not Hispanic"])
```



```
#numerical summaries
table(dds.discr$age.cohort[dds.discr$ethnicity == "Hispanic"])
##
##
     0-5
          6-12 13-17 18-21 22-50
                                    51+
##
      44
            91
                 103
                        78
                               43
                                     17
prop.table(table(dds.discr$age.cohort[dds.discr$ethnicity == "Hispanic"]))
##
          0-5
                    6-12
                               13-17
                                          18-21
                                                      22-50
                                                                   51+
## 0.11702128 0.24202128 0.27393617 0.20744681 0.11436170 0.04521277
```

```
table(dds.discr$age.cohort[dds.discr$ethnicity == "White not Hispanic"])
##
##
     0-5 6-12 13-17 18-21 22-50
                                   51+
##
            46
                  67
                        69
                             133
                                    66
prop.table(table(dds.discr$age.cohort[dds.discr$ethnicity == "White not Hispanic"]))
##
          0-5
                    6-12
                              13-17
                                         18-21
                                                    22-50
## 0.04987531 0.11471322 0.16708229 0.17206983 0.33167082 0.16458853
#Hispanics are generally younger, with most in the 6-12, 13-17, and 18-21 age groups.
#In contrast, White non-Hispanics are older, with the majority in the 22-50 age group.
#And a higher proportion in the 51+ group.
#8.
#subset data into two ethnicity groups
dds.hispanics = dds.discr[dds.discr$ethnicity == "Hispanic",]
dds.white.non.hisp = dds.discr[dds.discr$ethnicity == "White not Hispanic", ]
#calculate mean expenditures by age cohort for Hispanics
hisp.mean.Oto5 = mean(dds.hispanics$expenditures[dds.hispanics$age.cohort ==
                                                 "0-5"])
hisp.mean.6to12 = mean(dds.hispanics$expenditures[dds.hispanics$age.cohort ==
                                                   "6-12"])
hisp.mean.13to17 = mean(dds.hispanics$expenditures[dds.hispanics$age.cohort ==
                                                   "13-17"])
hisp.mean.18to21 = mean(dds.hispanics$expenditures[dds.hispanics$age.cohort ==
                                                   "18-21"])
hisp.mean.22to50 = mean(dds.hispanics$expenditures[dds.hispanics$age.cohort ==
                                                   "22-50"])
hisp.mean.51 = mean(dds.hispanics$expenditures[dds.hispanics$age.cohort ==
                                               "51+"])
#calculate mean expenditures by age cohort for White non Hispanics
nonhisp.mean.0to5 = mean(dds.white.non.hisp$expenditures[dds.white.non.hisp$
                                                         age.cohort == "0-5"])
nonhisp.mean.6to12 = mean(dds.white.non.hisp$expenditures[dds.white.non.hisp$
                                                          age.cohort == "6-12"])
nonhisp.mean.13to17 = mean(dds.white.non.hisp$expenditures[dds.white.non.hisp$
                                                           age.cohort == "13-17"])
nonhisp.mean.18to21 = mean(dds.white.non.hisp$expenditures[dds.white.non.hisp$
                                                              age.cohort == "18-21"])
nonhisp.mean.22to50 = mean(dds.white.non.hisp$expenditures[dds.white.non.hisp$
                                                              age.cohort == "22-50"])
nonhisp.mean.51 = mean(dds.white.non.hisp$expenditures[dds.white.non.hisp$
                                                         age.cohort == "51+"])
#calculate differences in mean expenditures between ethnicity groups
hisp.means = c(hisp.mean.0to5, hisp.mean.6to12, hisp.mean.13to17,
```

```
hisp.mean.18to21, hisp.mean.22to50, hisp.mean.51)
hisp.means
## [1] 1393.205 2312.187 3955.282 9959.846 40924.116 55585.000
nonhisp.means = c(nonhisp.mean.0to5, nonhisp.mean.6to12, nonhisp.mean.13to17,
                  nonhisp.mean.18to21, nonhisp.mean.22to50, nonhisp.mean.51)
nonhisp.means
## [1] 1366.900 2052.261 3904.358 10133.058 40187.624 52670.424
nonhisp.means hisp.means
## [1]
        -26.30455 -259.92594
                                 -50.92334
                                             173.21182 -736.49222 -2914.57576
#bonus: using tapply( )
hisp.means = tapply(dds.hispanics$expenditures, dds.hispanics$age.cohort, mean)
nonhisp.means = tapply(dds.white.non.hisp$expenditures, dds.white.non.hisp$age.cohort,
nonhisp.means - hisp.means
##
                      6-12
                                 13-17
                                             18-21
                                                         22-50
     -26.30455 -259.92594
                                        173.21182 -736.49222 -2914.57576
##
                             -50.92334
#Within age cohorts, mean expenditures for White non-Hispanics and Hispanics are similar.
#This suggests that the initial observed difference in overall averages is less pronounced.
#When comparing individuals of the same age.
#9.
#There is no evidence of ethnic discrimination.
#Lower average expenditures for Hispanics are due to their younger age.
#Compared to White non-Hispanics, younger individuals typically receive less support.
#When comparing individuals of similar ages.
#Expenditure differences between Hispanics and White non-Hispanics are minimal.
#Simpson's paradox
#10.
#calculations
hisp.weights = prop.table(table(dds.discr$age.cohort[dds.discr$ethnicity ==
                                                       "Hispanic"]))
hisp.weights
##
          0 - 5
                    6-12
                              13-17
                                         18-21
                                                    22-50
## 0.11702128 0.24202128 0.27393617 0.20744681 0.11436170 0.04521277
```

```
\verb|hisp.weights*| hisp.means|
##
##
         0-5
                  6-12
                           13-17
                                      18-21
                                                22-50
## 163.0346 559.5984 1083.4947 2066.1383 4680.1516 2513.1516
sum(hisp.weights*hisp.means)
## [1] 11065.57
nonhisp.weights = prop.table(table(dds.discr$age.cohort[dds.discr$ethnicity ==
                                                           "White not Hispanic"]))
nonhisp.weights
##
##
          0-5
                    6-12
                              13-17
                                          18-21
                                                     22-50
                                                                  51+
## 0.04987531 0.11471322 0.16708229 0.17206983 0.33167082 0.16458853
{\tt nonhisp.weights*nonhisp.means}
##
##
           0-5
                      6-12
                                  13-17
                                              18-21
                                                          22-50
                                                                        51+
##
      68.17456
                 235.42145
                             652.34913 1743.59352 13329.06234 8668.94763
sum(nonhisp.weights*nonhisp.means)
```

[1] 24697.55