

El Cerrito Sporting Goods

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R Markdown

The **goal** of the analysis is to determine if any of the salespersons are performing exceptionally well or exceptionally poorly. In particular, Barb was given more assignments than the others. A major question will be to determine if she did better than the three other salespersons.

For each assignment (row in table), the salesperson was assigned to a region in order to sell a specific type of ball. Prices are fixed.

There is no missing data (so no use of `na.rm = TRUE`)

Results: The first group of graphs show that Barb did indeed have more assignments than the other salespersons, so she produced more revenue.

Looking further, there was little difference in terms of the median number of balls sold. Barb dominated the positive outliers.

Conclusions: Most of the time there was little difference in the performance of the four salespersons. However, if there was an exceptionally large sale to be made, by an overwhelming margin Barb was the one to make the big sale.

Create the data

```
counts = 1000
set.seed(2019)

orderID = 1:counts
salesDate = sample(seq(as.Date('2016-01-01'), as.Date('2018-12-31'), by="day"), counts)
salesperson = sample(x = c('Al', 'Barb', 'Carol', 'Dave'), size = counts, replace = TRUE)
ball = sample(x = c('baseball', 'basketball', 'football', 'soccer ball'), size = counts, replace = TRUE)
itemsSold = round(rnorm(n = counts, mean = 55, sd = 10),0)

transactionsDF = data.frame(orderID = orderID, salesDate = salesDate,
                             salesperson = as.character(salesperson),
                             ball = ball, stringsAsFactors = FALSE )

transactionsDF$year = as.integer(format(transactionsDF$salesDate, '%Y'))
transactionsDF$region = sample(x = c('North', 'South', 'East', 'West'), size = counts, replace = TRUE)
transactionsDF$itemsSold = itemsSold
transactionsDF$price = ifelse(transactionsDF$ball == 'baseball', 10,
                              ifelse(transactionsDF$ball == 'basketball', 12,
                                      ifelse(transactionsDF$ball == 'football', 15,20)))

transactionsDF$salesTotal = transactionsDF$itemsSold * transactionsDF$price

head(transactionsDF)
```

```
##  orderID salesDate salesperson      ball year region itemsSold price
## 1         1 2018-04-23         Barb soccer ball 2018  West          75     20
## 2         2 2018-02-19          Al  baseball 2018  North          63     10
```

```
## 3      3 2016-11-27      Carol    football 2016  North      49      15
## 4      4 2017-11-06      Al soccer ball 2017  North      60      20
## 5      5 2016-02-25      Carol    baseball 2016   East      46      10
## 6      6 2016-02-17      Carol soccer ball 2016  North      66      20
## salesTotal
## 1      1500
## 2      630
## 3      735
## 4      1200
## 5      460
## 6      1320
```

```
# Now give Barbara excellent results and then "forget" what I did as I analyze the data
barbCount = 30
transactionsDF$salesperson[1:barbCount] = rep('Barb', barbCount)
transactionsDF$itemsSold[1:barbCount] = sample(x = 85:100, size = barbCount, replace = TRUE)

# reorganize the columns so that year is next to salesDate
transactionsDF = transactionsDF %>% select(orderID, salesDate, year, salesperson,
                                           ball, region, itemsSold, price, salesTotal)
```

Data Summaries with Charts

Counts Tables and Charts

Simple Counts

```
# Group by salespersons
table(transactionsDF$salesperson)
```

```
##
## Al Barb Carol Dave
## 231 289 247 233
```

```
# Group by region
table(transactionsDF$region)
```

```
##
## East North South West
## 250 250 251 249
```

```
# Group by salesperson and region
addmargins(table(transactionsDF$salesperson, transactionsDF$region), c(1,2))
```

```
##
##      East North South West Sum
## Al      55    63    66  47 231
## Barb    68    74    65  82 289
## Carol   61    58    63  65 247
## Dave    66    55    57  55 233
## Sum    250   250   251 249 1000
```

```
# Columns add to 100%
round(prop.table(table(transactionsDF$salesperson, transactionsDF$region), 2),3)
```

```
##
##      East North South West
## Al    0.220 0.252 0.263 0.189
## Barb 0.272 0.296 0.259 0.329
```

```
## Carol 0.244 0.232 0.251 0.261
## Dave 0.264 0.220 0.227 0.221
```

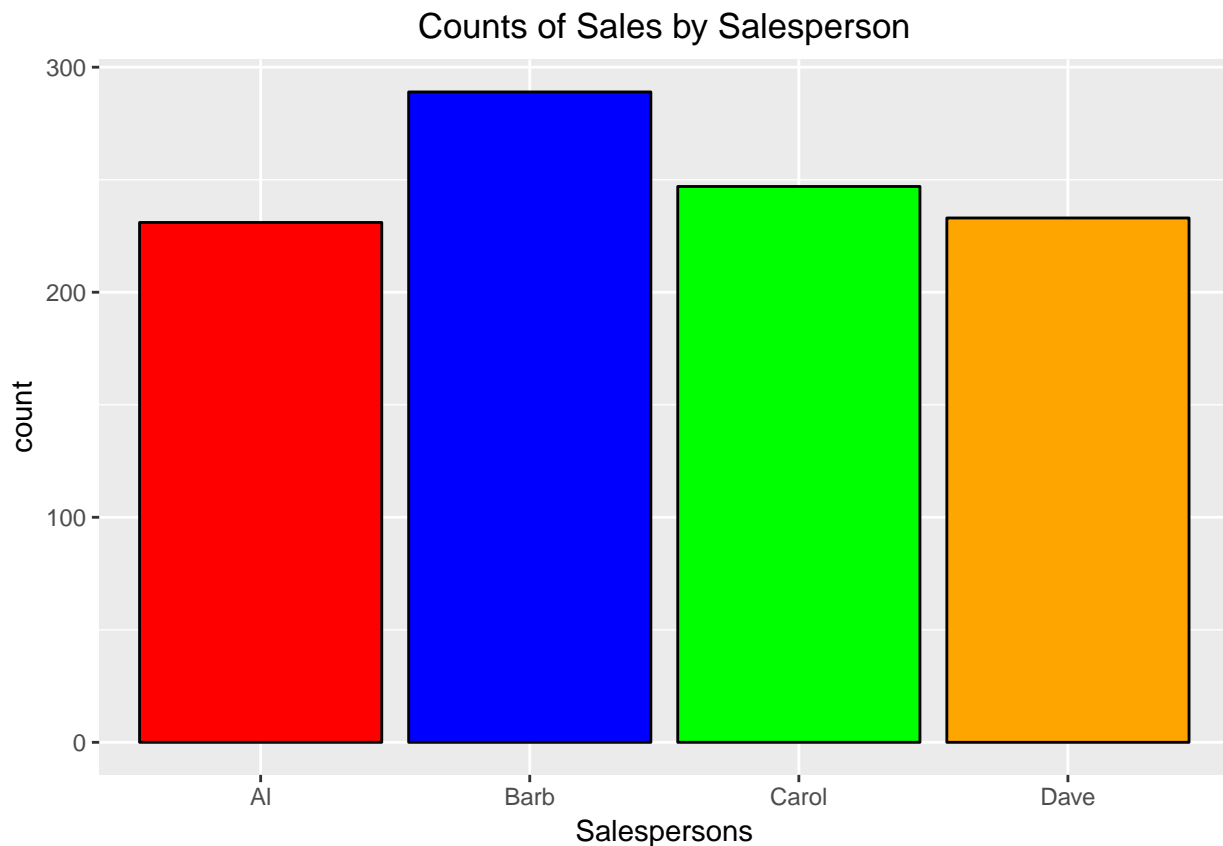
```
# Group by year
table(transactionsDF$year)
```

```
##
## 2016 2017 2018
## 332 333 335
```

Color palettes defined
Bar charts of counts Some pie charts

```
colorValuesPeople = c("red", "blue", "green", "orange")
colorValuesRegions = c("#E69F00", "#56B4E9", "#009E73", "#F0E442")
colorValuesYears = c('#D55E00', '#009E73', '#56B4E9')
```

```
ggplot(transactionsDF, aes(x = factor(salesperson))) + geom_bar(fill = colorValuesPeople, color = 'black') +
  ggtitle("Counts of Sales by Salesperson") + xlab("Salespersons") +
  theme(plot.title = element_text(hjust=0.5))
```



```
# Pie chart
res = transactionsDF %>% group_by(salesperson) %>% summarize(counts = n())
res = data.frame(res)
res = res[order(res[,2]), ]

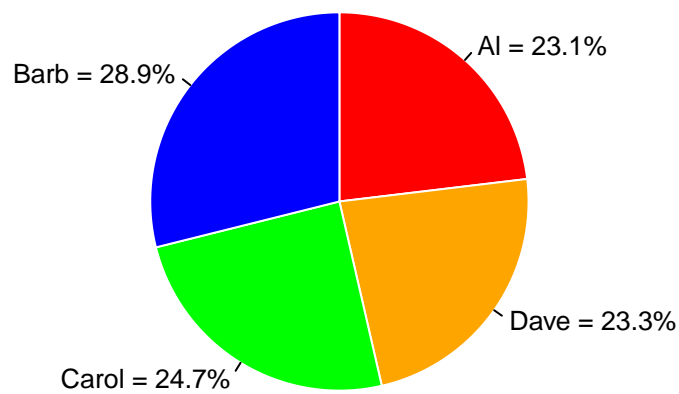
pielabels <- sprintf("%s = %3.1f%s", res[,1],
```

```

100*res[,2]/sum(res[,2]), "%")
pie(res[, 2],
    labels = pielabels,
    clockwise = TRUE,
    col = c('red', 'orange', 'green', 'blue'),
    border = 'white',
    cex = 0.8,
    main = "Percents of Sales by Salesperson")

```

Percents of Sales by Salesperson



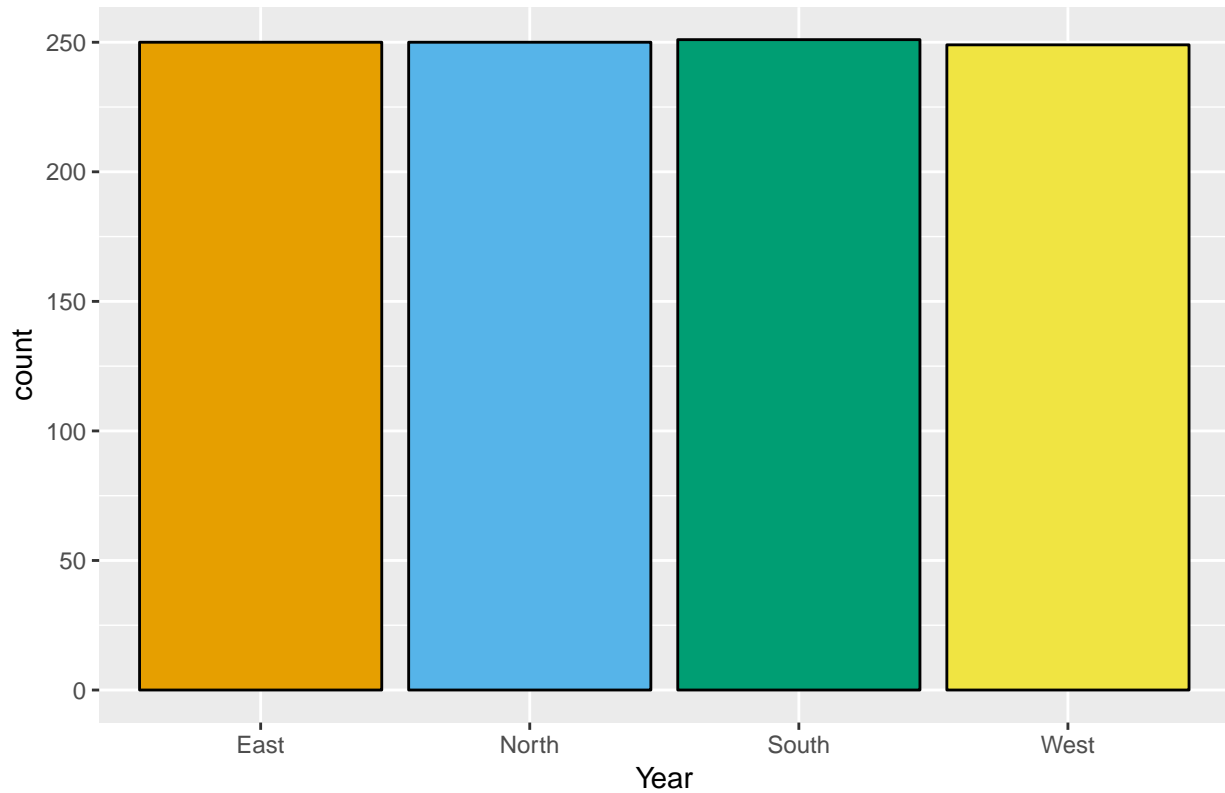
Barchart and pie chart by Region

```

ggplot(transactionsDF, aes(x = factor(region))) + geom_bar(fill = colorValuesRegions, color = 'black') +
  ggtitle("Counts of Sales by Region") + xlab("Year") +
  theme(plot.title = element_text(hjust=0.5))

```

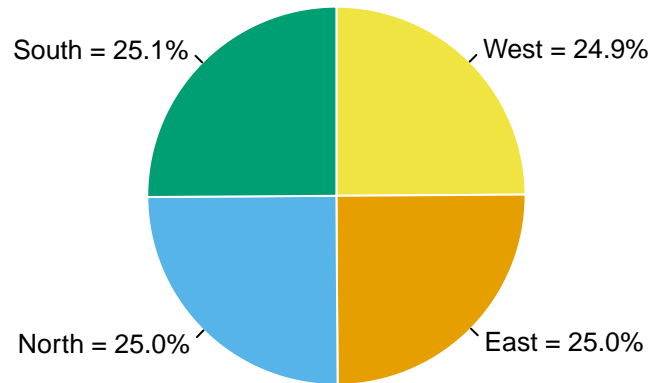
Counts of Sales by Region



```
# Pie chart
res = transactionsDF %>% group_by(region) %>% summarize(counts = n())
res = data.frame(res)
res = res[order(res[,2]), ]

pielabels <- sprintf("%s = %3.1f%s", res[,1],
                    100*res[,2]/sum(res[,2]), "%")
pie(res[, 2],
    labels = pielabels,
    clockwise = TRUE,
    col = c('#F0E442', '#E69F00', '#56B4E9', '#009E73'),
    border = 'white',
    cex = 0.8,
    main = "Percents of Sales by Region")
```

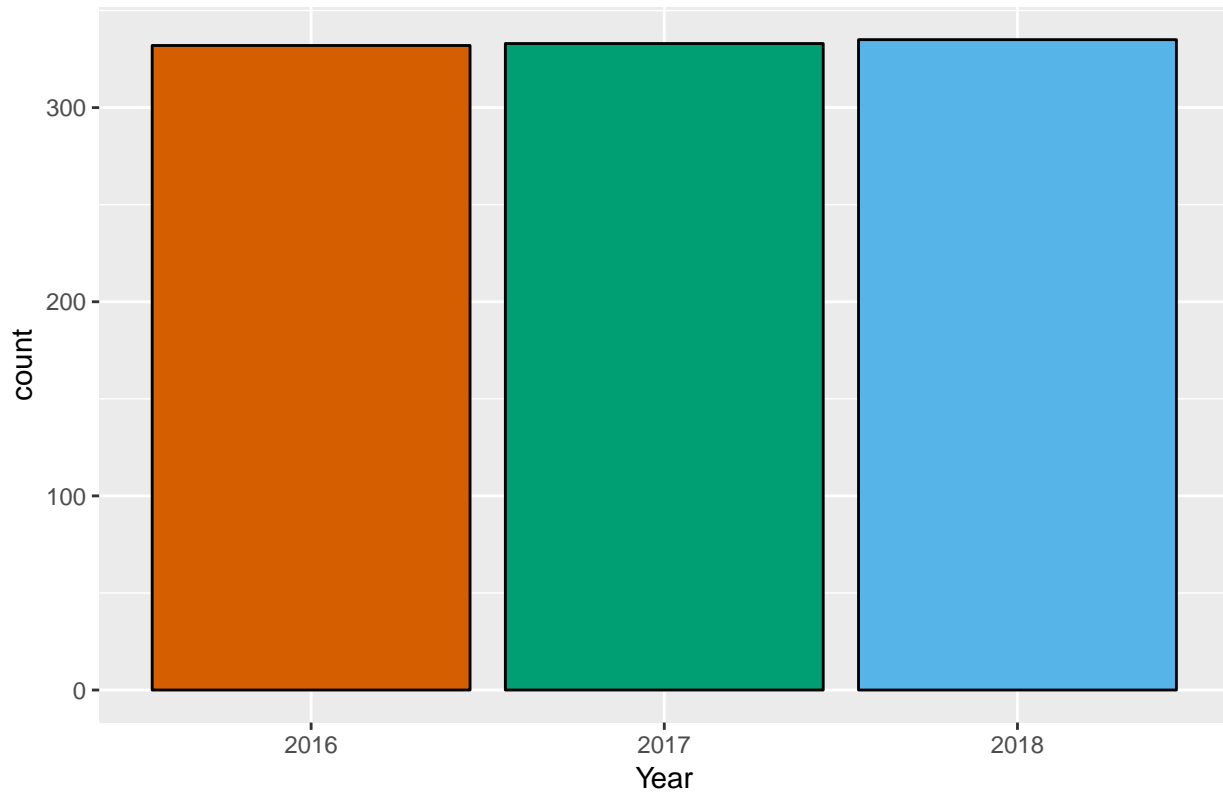
Percents of Sales by Region



Bar chart and pie chart by year

```
ggplot(transactionsDF, aes(x = factor(year))) + geom_bar(fill = colorValuesYears, color = 'black') +  
  ggtitle("Counts of Sales by Year") + xlab("Year") +  
  theme(plot.title = element_text(hjust=0.5))
```

Counts of Sales by Year



Total sales tables

```
tapply(transactionsDF$salesTotal, transactionsDF$salesperson, sum)
```

```
##      Al   Barb  Carol   Dave  
## 178573 229481 192624 182321
```

```
sapply(split(transactionsDF$salesTotal, transactionsDF$salesperson), sum) # alternate base R method
```

```
##      Al   Barb  Carol   Dave  
## 178573 229481 192624 182321
```

```
aggregate(transactionsDF$salesTotal, list(transactionsDF$salesperson), sum) # alternate base R method
```

```
##  Group.1      x  
## 1      Al 178573  
## 2     Barb 229481  
## 3     Carol 192624  
## 4      Dave 182321
```

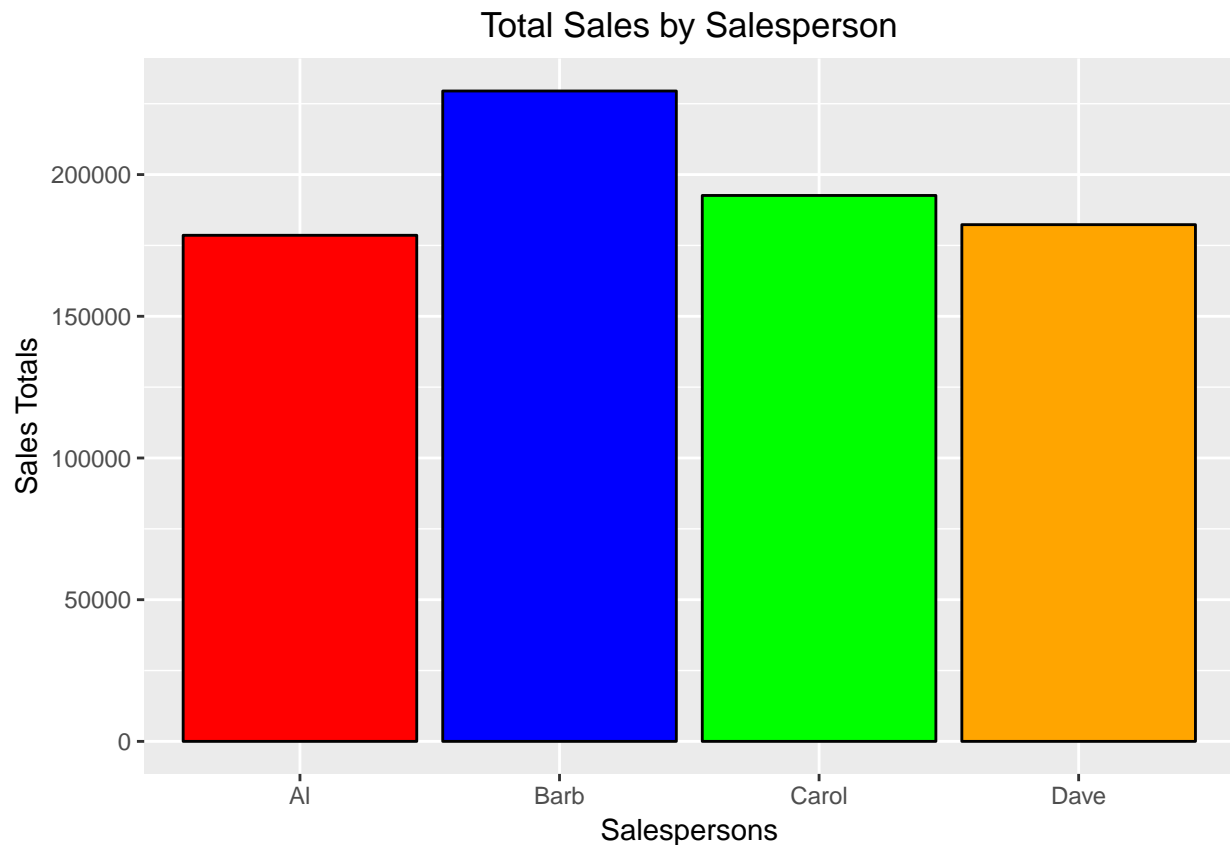
```
transactionsDF %>% group_by(salesperson) %>% summarize(totals = sum(salesTotal)) #dplyr
```

```
## # A tibble: 4 x 2  
##   salesperson totals  
##   <chr>         <dbl>  
## 1 Al           178573  
## 2 Barb         229481  
## 3 Carol        192624  
## 4 Dave         182321
```

```
res = transactionsDF %>% group_by(salesperson) %>% summarize(totals = sum(salesTotal))
res
```

```
## # A tibble: 4 x 2
##   salesperson totals
##   <chr>         <dbl>
## 1 Al           178573
## 2 Barb         229481
## 3 Carol        192624
## 4 Dave         182321
```

```
ggplot(res, aes(x = factor(salesperson), y = totals)) +
  geom_bar(stat = "identity", fill = colorValuesPeople,
           color = 'black') +
  ggtitle("Total Sales by Salesperson") + xlab("Salespersons") + ylab("Sales Totals") +
  theme(plot.title = element_text(hjust=0.5))
```



Ball is not believed to be important, but just a check.
 Ball prices are fixed by the company

```
tapply(transactionsDF$salesTotal, transactionsDF$ball, sum)
```

```
##   baseball  basketball  football soccer ball
##   127260    157584    225315    272840
```

```
transactionsDF %>% group_by(ball) %>% summarize(totals = sum(salesTotal)) #dplyr
```

```
## # A tibble: 4 x 2
```

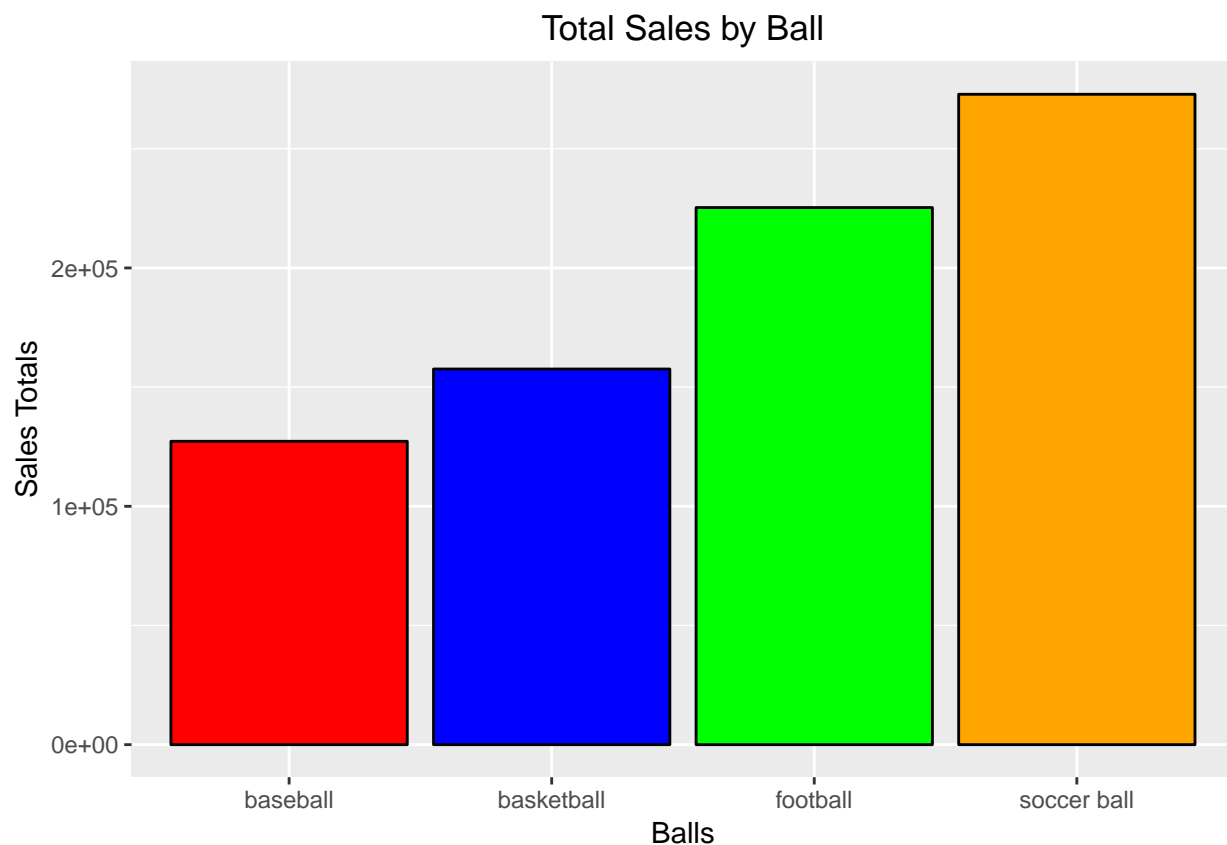


```
##   ball      totals
##   <chr>     <dbl>
## 1 baseball  127260
## 2 basketball 157584
## 3 football  225315
## 4 soccer ball 272840
```

```
res = transactionsDF %>% group_by(ball) %>% summarize(totals = sum(salesTotal)) #dplyr
res
```

```
## # A tibble: 4 x 2
##   ball      totals
##   <chr>     <dbl>
## 1 baseball  127260
## 2 basketball 157584
## 3 football  225315
## 4 soccer ball 272840
```

```
ggplot(res, aes(x = factor(ball), y = totals)) +
  geom_bar(stat = "identity", fill = colorValuesPeople,
           color = 'black') +
  ggtitle("Total Sales by Ball") + xlab("Balls") + ylab("Sales Totals") +
  theme(plot.title = element_text(hjust=0.5))
```

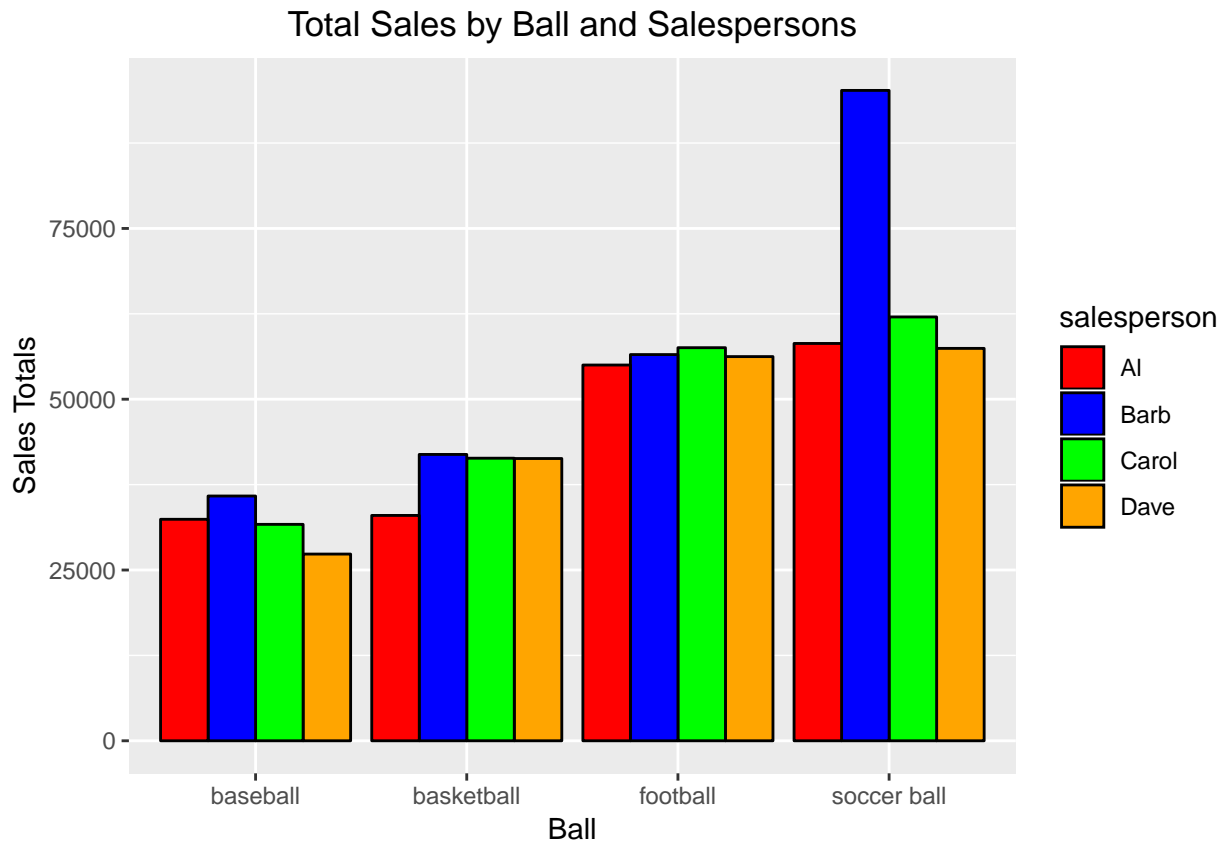


```
res = transactionsDF %>% group_by(ball, salesperson) %>% summarize(totals = sum(salesTotal)) #dplyr
res
```

```
## # A tibble: 16 x 3
```

```
## # Groups:   ball [?]
##   ball      salesperson totals
##   <chr>     <chr>         <dbl>
## 1 baseball  Al             32420
## 2 baseball  Barb           35830
## 3 baseball  Carol          31680
## 4 baseball  Dave           27330
## 5 basketball Al             32988
## 6 basketball Barb           41916
## 7 basketball Carol          41364
## 8 basketball Dave           41316
## 9 football  Al             55005
##10 football  Barb           56535
##11 football  Carol          57540
##12 football  Dave           56235
##13 soccer ball Al             58160
##14 soccer ball Barb           95200
##15 soccer ball Carol          62040
##16 soccer ball Dave           57440
```

```
ggplot(res, aes(x = factor(ball), y = totals, fill = salesperson)) +
  geom_bar(stat = "identity", position = "dodge",
          color = 'black') + scale_fill_manual(values = colorValuesPeople) +
  ggtitle("Total Sales by Ball and Salespersons") + xlab("Ball") + ylab("Sales Totals") +
  theme(plot.title = element_text(hjust=0.5))
```



Averages

```
round(tapply(transactionsDF$itemsSold, list(transactionsDF$ball,transactionsDF$salesperson) , mean),0)
```

```
##           Al Barb Carol Dave
## baseball  56  56   54  55
## basketball 53  58   54  55
## football  54  57   57  56
## soccer ball 55  60   54  54
```

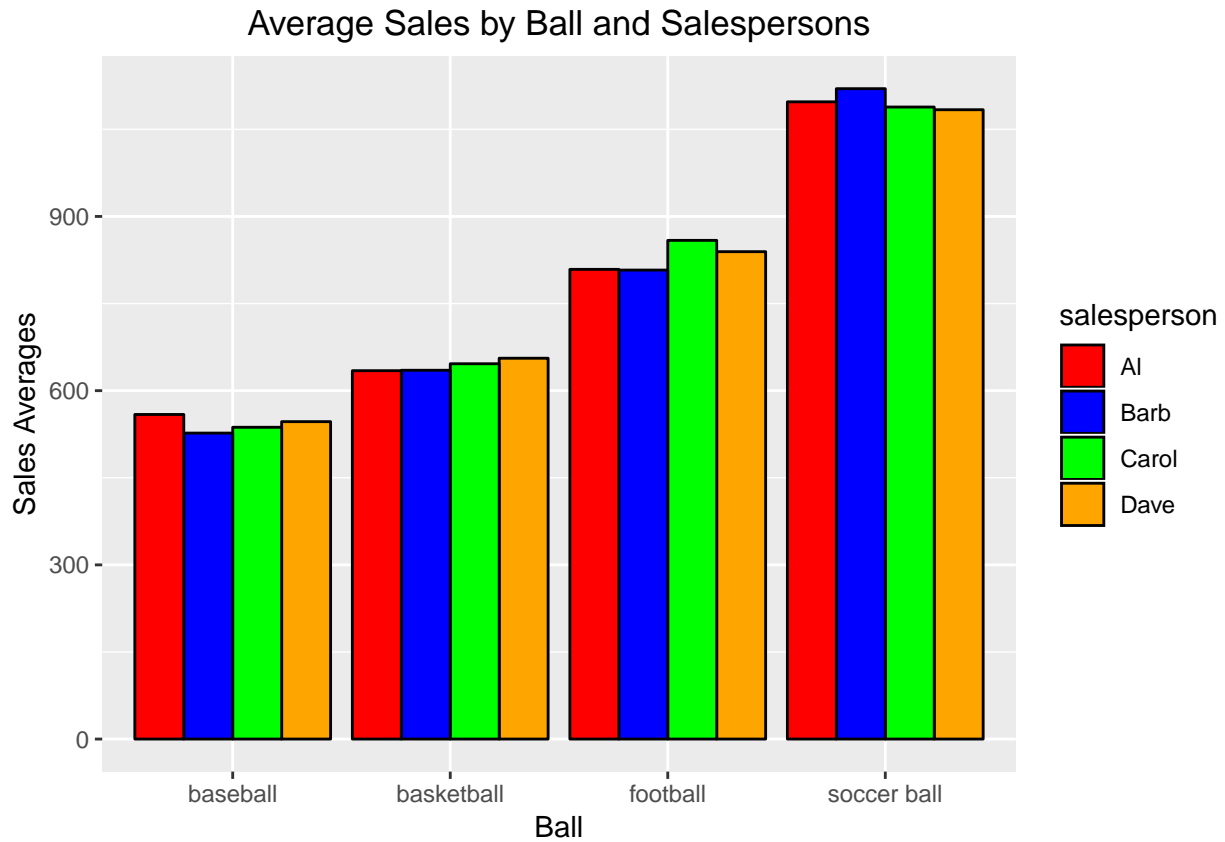
```
transactionsDF %>% group_by(ball, salesperson) %>% summarize(averages = mean(itemsSold)) %>%
  arrange(ball, desc(averages)) %>% print(n = Inf) # dplyr
```

```
## # A tibble: 16 x 3
## # Groups:   ball [4]
##   ball      salesperson averages
##   <chr>    <chr>          <dbl>
## 1 baseball Al              55.9
## 2 baseball Barb             55.8
## 3 baseball Dave             54.7
## 4 baseball Carol            53.7
## 5 basketball Barb            58.3
## 6 basketball Dave            54.7
## 7 basketball Carol           53.9
## 8 basketball Al              52.9
## 9 football Carol            57.3
## 10 football Barb             56.6
## 11 football Dave             56.0
## 12 football Al              53.9
## 13 soccer ball Barb           59.8
## 14 soccer ball Al             54.9
## 15 soccer ball Carol          54.4
## 16 soccer ball Dave           54.2
```

```
res = transactionsDF %>% group_by(ball, salesperson) %>% summarize(averages = mean(salesTotal)) #dplyr
res
```

```
## # A tibble: 16 x 3
## # Groups:   ball [?]
##   ball      salesperson averages
##   <chr>    <chr>          <dbl>
## 1 baseball Al              559.
## 2 baseball Barb             527.
## 3 baseball Carol            537.
## 4 baseball Dave             547.
## 5 basketball Al              634.
## 6 basketball Barb            635.
## 7 basketball Carol           646.
## 8 basketball Dave            656.
## 9 football Al              809.
## 10 football Barb             808.
## 11 football Carol            859.
## 12 football Dave             839.
## 13 soccer ball Al            1097.
## 14 soccer ball Barb           1120.
## 15 soccer ball Carol          1088.
## 16 soccer ball Dave           1084.
```

```
ggplot(res, aes(x = factor(ball), y = averages, fill = salesperson)) +
  geom_bar(stat = "identity", position = "dodge",
          color = 'black') + scale_fill_manual(values = colorValuesPeople) +
  ggtitle("Average Sales by Ball and Salespersons") + xlab("Ball") + ylab("Sales Averages") +
  theme(plot.title = element_text(hjust=0.5))
```



```
# DO THIS GRAPH
transactionsDF %>% group_by(ball, region, salesperson) %>%
  summarize(averages = mean(itemsSold)) %>%
  arrange(ball, region, desc(averages)) %>% print(n = Inf) # dplyr
```

```
## # A tibble: 64 x 4
## # Groups:   ball, region [16]
##   ball      region salesperson averages
##   <chr>    <chr> <chr>         <dbl>
## 1 baseball East   Barb           66.8
## 2 baseball East   Carol           58.5
## 3 baseball East   Al              57.2
## 4 baseball East   Dave            56.7
## 5 baseball North  Al              56.8
## 6 baseball North  Carol           54.4
## 7 baseball North  Barb           53.4
## 8 baseball North  Dave            50.2
## 9 baseball South  Barb           56.1
## 10 baseball South  Al              55.2
## 11 baseball South  Dave            53
```

## 12	baseball	South	Carol	50.7
## 13	baseball	West	Dave	56.2
## 14	baseball	West	Carol	52.1
## 15	baseball	West	Al	51.8
## 16	baseball	West	Barb	50.4
## 17	basketball	East	Barb	59.1
## 18	basketball	East	Dave	56.3
## 19	basketball	East	Carol	52.2
## 20	basketball	East	Al	51.2
## 21	basketball	North	Dave	57.2
## 22	basketball	North	Al	55.2
## 23	basketball	North	Barb	53.8
## 24	basketball	North	Carol	52.8
## 25	basketball	South	Barb	56.9
## 26	basketball	South	Carol	55.6
## 27	basketball	South	Dave	54
## 28	basketball	South	Al	52.4
## 29	basketball	West	Barb	62.5
## 30	basketball	West	Carol	54.8
## 31	basketball	West	Al	51.4
## 32	basketball	West	Dave	50.8
## 33	football	East	Barb	60.4
## 34	football	East	Al	59.7
## 35	football	East	Dave	57.5
## 36	football	East	Carol	55.6
## 37	football	North	Barb	60.0
## 38	football	North	Carol	58.7
## 39	football	North	Dave	56.2
## 40	football	North	Al	54.2
## 41	football	South	Carol	57.9
## 42	football	South	Dave	56.3
## 43	football	South	Al	52.2
## 44	football	South	Barb	49.7
## 45	football	West	Carol	57.4
## 46	football	West	Barb	54.8
## 47	football	West	Dave	53.9
## 48	football	West	Al	51.9
## 49	soccer ball	East	Barb	61.3
## 50	soccer ball	East	Carol	57.1
## 51	soccer ball	East	Al	53.9
## 52	soccer ball	East	Dave	53.8
## 53	soccer ball	North	Barb	59.5
## 54	soccer ball	North	Dave	56.2
## 55	soccer ball	North	Carol	52.4
## 56	soccer ball	North	Al	51.6
## 57	soccer ball	South	Barb	60.3
## 58	soccer ball	South	Carol	55.4
## 59	soccer ball	South	Al	54.7
## 60	soccer ball	South	Dave	49.7
## 61	soccer ball	West	Al	59.2
## 62	soccer ball	West	Barb	58.1
## 63	soccer ball	West	Dave	57.7
## 64	soccer ball	West	Carol	53.7

Medians

```
transactionsDF %>% group_by(ball, salesperson) %>% summarize(medians = median(itemsSold)) %>%  
  arrange(ball, desc(medians)) %>% print(n = Inf) # dplyr
```

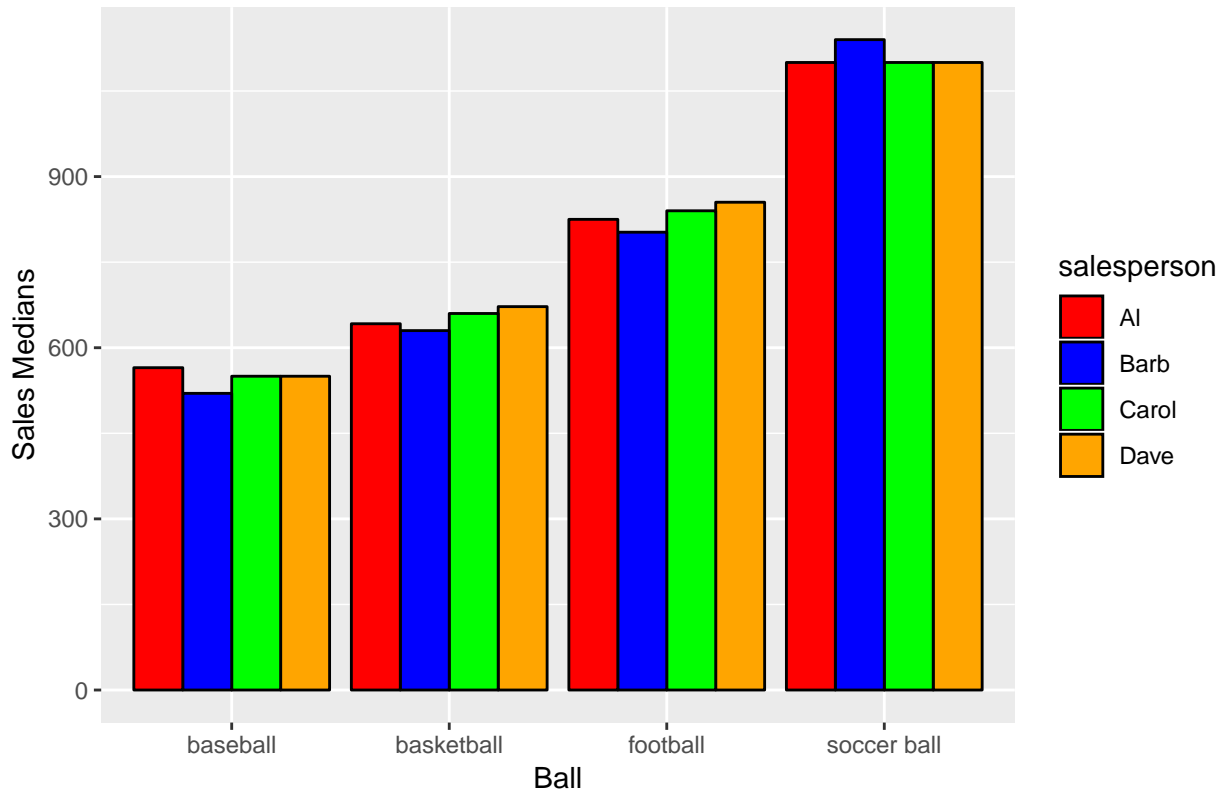
```
## # A tibble: 16 x 3  
## # Groups:   ball [4]  
##   ball      salesperson medians  
##   <chr>      <chr>          <dbl>  
## 1 baseball   Al              56.5  
## 2 baseball   Carol           55  
## 3 baseball   Dave            55  
## 4 baseball   Barb            53  
## 5 basketball Dave            56  
## 6 basketball Barb            55  
## 7 basketball Carol           55  
## 8 basketball Al              53.5  
## 9 football   Dave            57  
## 10 football  Carol           56  
## 11 football  Al              55  
## 12 football  Barb            55  
## 13 soccer ball Barb            57  
## 14 soccer ball Al              55  
## 15 soccer ball Carol           55  
## 16 soccer ball Dave            55
```

```
res = transactionsDF %>% group_by(ball, salesperson) %>% summarize(medians = median(salesTotal)) #dplyr  
res
```

```
## # A tibble: 16 x 3  
## # Groups:   ball [?]  
##   ball      salesperson medians  
##   <chr>      <chr>          <dbl>  
## 1 baseball   Al              565  
## 2 baseball   Barb            520  
## 3 baseball   Carol           550  
## 4 baseball   Dave            550  
## 5 basketball Al              642  
## 6 basketball Barb            630  
## 7 basketball Carol           660  
## 8 basketball Dave            672  
## 9 football   Al              825  
## 10 football  Barb            802.  
## 11 football  Carol           840  
## 12 football  Dave            855  
## 13 soccer ball Al              1100  
## 14 soccer ball Barb            1140  
## 15 soccer ball Carol           1100  
## 16 soccer ball Dave            1100
```

```
ggplot(res, aes(x = factor(ball), y = medians, fill = salesperson)) +  
  geom_bar(stat = "identity", position = "dodge",  
           color = 'black') + scale_fill_manual(values = colorValuesPeople) +  
  ggtitle("Median Sales by Ball and Salespersons") + xlab("Ball") + ylab("Sales Medians") +  
  theme(plot.title = element_text(hjust=0.5))
```

Median Sales by Ball and Salespersons



```
transactionsDF %>% group_by(ball, region, salesperson) %>%
  summarize(medians = median(itemsSold)) %>%
  arrange(ball, region, desc(medians)) %>% print(n = Inf) # dplyr
```

```
## # A tibble: 64 x 4
## # Groups:   ball, region [16]
##   ball      region salesperson medians
##   <chr>    <chr> <chr>         <dbl>
## 1 baseball East   Barb           64
## 2 baseball East   Dave           60
## 3 baseball East   Al             58
## 4 baseball East   Carol          57
## 5 baseball North  Al             58
## 6 baseball North  Carol          57
## 7 baseball North  Dave          53.5
## 8 baseball North  Barb          51.5
## 9 baseball South  Al             55
## 10 baseball South  Dave          53.5
## 11 baseball South  Barb           53
## 12 baseball South  Carol          49
## 13 baseball West   Dave           57
## 14 baseball West   Carol          53
## 15 baseball West   Al             51
## 16 baseball West   Barb           48
## 17 basketball East   Dave          57.5
## 18 basketball East   Al             53
```

```

## 19 basketball East Barb 53
## 20 basketball East Carol 52.5
## 21 basketball North Al 56.5
## 22 basketball North Dave 56
## 23 basketball North Carol 55
## 24 basketball North Barb 49
## 25 basketball South Barb 56
## 26 basketball South Carol 56
## 27 basketball South Dave 55
## 28 basketball South Al 51.5
## 29 basketball West Barb 56
## 30 basketball West Carol 55
## 31 basketball West Al 54
## 32 basketball West Dave 53
## 33 football East Al 61
## 34 football East Barb 58
## 35 football East Dave 57
## 36 football East Carol 54.5
## 37 football North Dave 58.5
## 38 football North Barb 58
## 39 football North Al 56.5
## 40 football North Carol 55
## 41 football South Carol 59
## 42 football South Dave 57
## 43 football South Al 51.5
## 44 football South Barb 50
## 45 football West Carol 57
## 46 football West Dave 54
## 47 football West Al 52
## 48 football West Barb 52
## 49 soccer ball East Carol 57.5
## 50 soccer ball East Barb 56.5
## 51 soccer ball East Dave 53.5
## 52 soccer ball East Al 52
## 53 soccer ball North Carol 57
## 54 soccer ball North Barb 56
## 55 soccer ball North Dave 56
## 56 soccer ball North Al 53.5
## 57 soccer ball South Barb 57.5
## 58 soccer ball South Carol 55
## 59 soccer ball South Al 54.5
## 60 soccer ball South Dave 46
## 61 soccer ball West Dave 58.5
## 62 soccer ball West Al 57.5
## 63 soccer ball West Barb 57.5
## 64 soccer ball West Carol 53

```

```

lm.fit1 = lm(itemsSold ~ salesperson , data = transactionsDF)
summary(lm.fit1)

```

```

##
## Call:
## lm(formula = itemsSold ~ salesperson, data = transactionsDF)
##
## Residuals:

```



```
##      Min      1Q  Median      3Q      Max
## -39.716 -7.870 -0.557   6.284  42.284
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    54.3983    0.7795  69.790 < 2e-16 ***
## salespersonBarb  3.3180    1.0455   3.173  0.00155 **
## salespersonCarol  0.4722    1.0843   0.435  0.66332
## salespersonDave  0.5245    1.0999   0.477  0.63359
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 11.85 on 996 degrees of freedom
## Multiple R-squared:  0.01318,    Adjusted R-squared:  0.0102
## F-statistic: 4.433 on 3 and 996 DF,  p-value: 0.004192
lm.fit2 = lm(itemsSold ~ salesperson + ball, data = transactionsDF)
summary(lm.fit2)
```

```
##
## Call:
## lm(formula = itemsSold ~ salesperson + ball, data = transactionsDF)
##
## Residuals:
##      Min      1Q  Median      3Q      Max
## -40.135 -7.883 -0.329   6.585  42.819
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    53.84709    1.02353  52.609 <2e-16 ***
## salespersonBarb  3.29846    1.04803   3.147  0.0017 **
## salespersonCarol  0.49237    1.08541   0.454  0.6502
## salespersonDave  0.53177    1.10148   0.483  0.6294
## ballbasketball   0.03572    1.08330   0.033  0.9737
## ballfootball     0.98927    1.05624   0.937  0.3492
## ballsoccer ball  1.09800    1.08016   1.017  0.3096
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 11.85 on 993 degrees of freedom
## Multiple R-squared:  0.01503,    Adjusted R-squared:  0.009078
## F-statistic: 2.525 on 6 and 993 DF,  p-value: 0.01974
```

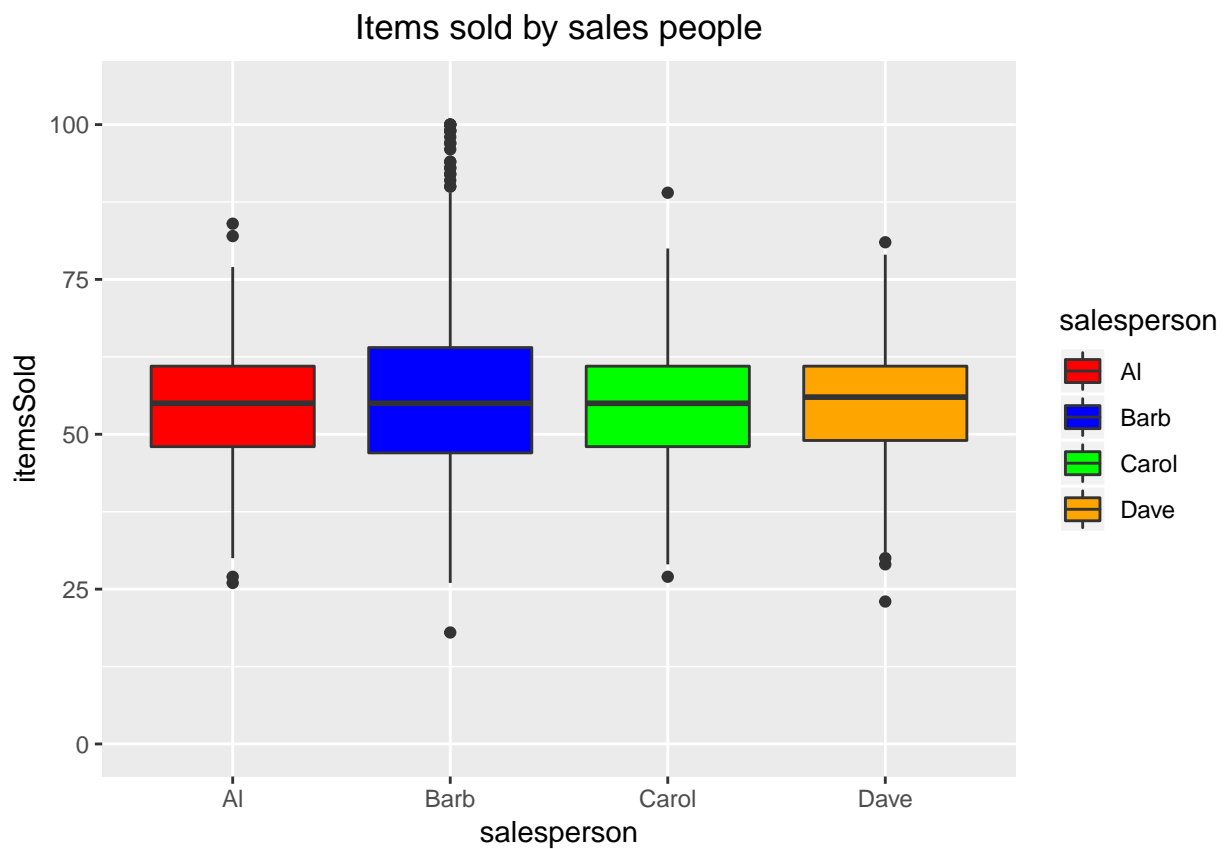
```
lm.fit3 = lm(itemsSold ~ salesperson + ball + region, data = transactionsDF)
summary(lm.fit3)
```

```
##
## Call:
## lm(formula = itemsSold ~ salesperson + ball + region, data = transactionsDF)
##
## Residuals:
##      Min      1Q  Median      3Q      Max
## -39.152 -7.608 -0.221   6.622  41.799
##
## Coefficients:
```

```
##           Estimate Std. Error t value Pr(>|t|)
## (Intercept)  55.6484    1.2086  46.044 < 2e-16 ***
## salespersonBarb  3.3003    1.0478   3.150  0.00168 **
## salespersonCarol  0.4842    1.0838   0.447  0.65513
## salespersonDave  0.4239    1.0999   0.385  0.70002
## ballbasketball  0.1456    1.0813   0.135  0.89293
## ballfootball    1.0727    1.0536   1.018  0.30886
## ballsoccer ball  1.1353    1.0776   1.054  0.29236
## regionNorth    -1.8930    1.0584  -1.788  0.07400 .
## regionSouth    -2.8697    1.0580  -2.712  0.00679 **
## regionWest     -2.5703    1.0600  -2.425  0.01550 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 11.82 on 990 degrees of freedom
## Multiple R-squared:  0.0238, Adjusted R-squared:  0.01493
## F-statistic: 2.682 on 9 and 990 DF,  p-value: 0.004411
```

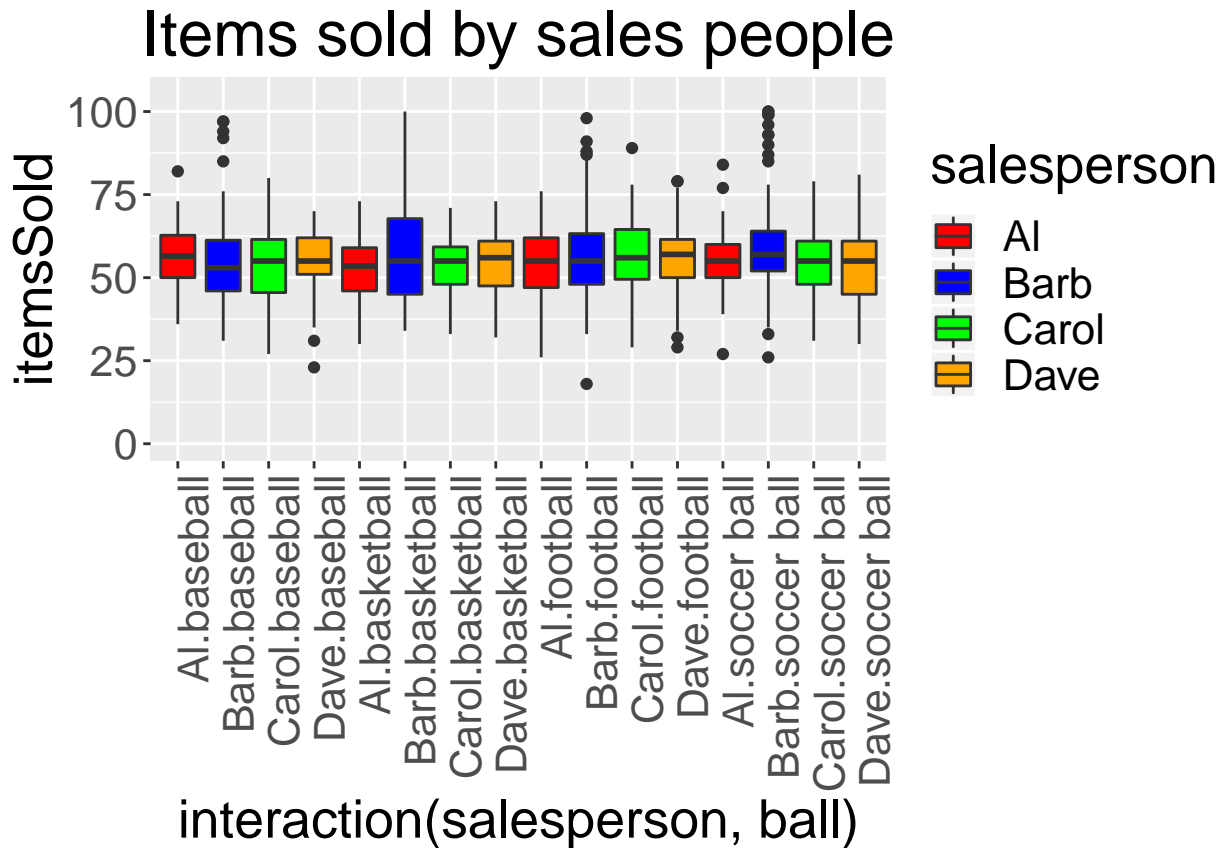
Boxplots of Counts

```
ggplot(transactionsDF, aes(x = salesperson, y = itemsSold)) +
  geom_boxplot(aes(fill=salesperson)) +
  scale_fill_manual(values = colorValuesPeople) + ylim( 0, max(transactionsDF$itemsSold) + 5) +
  ggtitle("Items sold by sales people") + theme(plot.title = element_text(hjust=0.5))
```



```
ggplot(transactionsDF, aes(x = interaction(salesperson, ball), y = itemsSold)) + geom_boxplot(aes(fill=
  scale_fill_manual(values = colorValuesPeople) + ylim( 0, max(transactionsDF$itemsSold) + 5) +
```

```
ggtitle("Items sold by sales people") + theme(plot.title = element_text(hjust=0.5)) +
theme(text = element_text(size=20),
axis.text.x = element_text(angle=90, hjust=1))
```



Scatterplot with jittering

```
p = ggplot(transactionsDF, aes(x = salesperson, y = itemsSold, color = salesperson, shape = ball)) +
  geom_point(alpha = 0.01) + geom_hline(yintercept = 80) +
  geom_jitter() + scale_color_manual(values = colorValuesPeople) +
  ggtitle("Items sold by salesperson") + theme(plot.title = element_text(hjust=0.5))

p + annotate("text", 3.3, y = 95, label = "Barb gets the positive outliers")
```

Items sold by salesperson

