# IS5 in R: Scatterplots, Association, and Correlation (Chapter 6)

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# Introduction and background

This document is intended to help describe how to undertake analyses introduced as examples in the Fifth Edition of *Intro Stats* (2018) by De Veaux, Velleman, and Bock. More information about the book can be found at http://wps.aw.com/aw\_deveaux\_stats\_series. This file as well as the associated R Markdown reproducible analysis source file used to create it can be found at http://nhorton.people.amherst.edu/is5.

This work leverages initiatives undertaken by Project MOSAIC (http://www.mosaic-web.org), an NSF-funded effort to improve the teaching of statistics, calculus, science and computing in the undergraduate curriculum. In particular, we utilize the mosaic package, which was written to simplify the use of R for introductory statistics courses. A short summary of the R needed to teach introductory statistics can be found in the mosaic package vignettes (http://cran.r-project.org/web/packages/mosaic). A paper describing the mosaic approach was published in the R Journal: https://journal.r-project.org/archive/2017/RJ-2017-024.

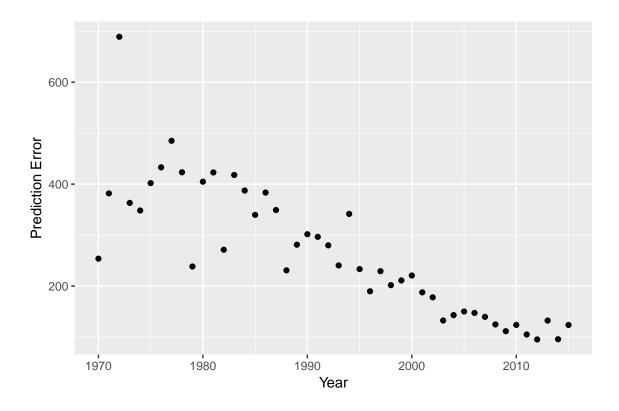
# Chapter 6: Scatterplots, Association, and Correlation

```
library(mosaic)
library(janitor)
Hurricanes <- read_csv("http://nhorton.people.amherst.edu/is5/data/Tracking_hurricanes_2015.csv")

## Parsed with column specification:
## cols(
## Year = col_integer(),
## Error_24h = col_double(),
## Error_48h = col_double(),
## Error_72h = col_double()
## ## )</pre>
```

By default, read\_csv() prints the variable names. These messages can be suppressed using the message=FALSE code chunk option to save space and improve readability.

```
# Figure 6.1, page 164
gf_point(Error_72h ~ Year, data = Hurricanes, ylab = "Prediction Error")
```



## Section 6.1: Scatterplots

See dots on pages 164-165.

#### Example 6.1: Comparing Prices Worldwide

```
Prices <- read_csv("http://nhorton.people.amherst.edu/is5/data/Prices_and_Earnings.csv") %>%
    clean_names()
```

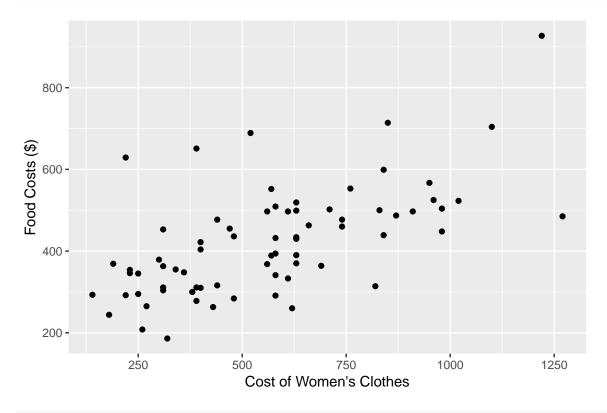
```
## Parsed with column specification:
## cols(
##
     .default = col_double(),
##
     City = col_character(),
##
     `Food Costs($)` = col_integer(),
##
     `Womens Clothing($)` = col_integer(),
##
     `Mens Clothing($)` = col_integer(),
##
     `Hours Worked` = col_integer(),
     `Vacation Days` = col_integer(),
##
     `Big Mac(min)` = col_integer(),
##
##
     `Bread(kg in min)` = col_integer(),
     `Rice(kg in min)` = col_integer(),
##
##
     `Goods and Services($)` = col_integer()
## )
\mbox{\tt \#\#} See spec(...) for full column specifications.
```

## names(Prices)

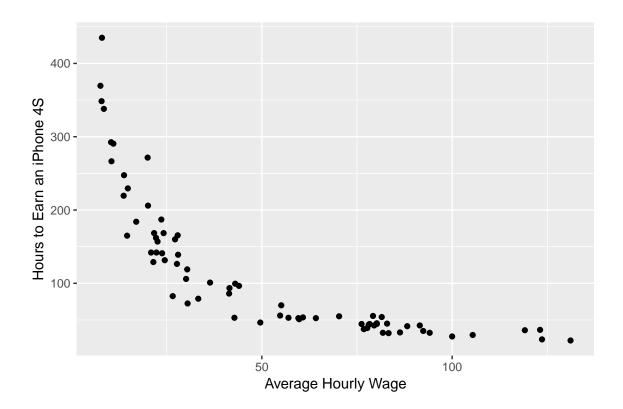
```
##
    [1] "city"
                                   "food_costs"
                                   "mens_clothing"
    [3] "womens_clothing"
##
    [5] "i_phone_4s_hr"
                                   "clothing_index"
##
    [7] "hours_worked"
                                   "wage_gross"
   [9] "wage_net"
                                   "vacation_days"
##
##
  [11] "col_excl_rent"
                                   "col_incl_rent"
                                   "pur_power_net"
  [13] "pur_power_gross"
  [15] "pur_power_annual"
                                   "big_mac_min"
   [17] "bread_kg_in_min"
                                   "rice_kg_in_min"
   [19] "goods_and_services"
                                   "good_and_services_index"
   [21] "food_index"
```

Here we use the clean\_names() function from the janitor package to sanitize the names of the columns (which would otherwise contain special characters or whitespace).

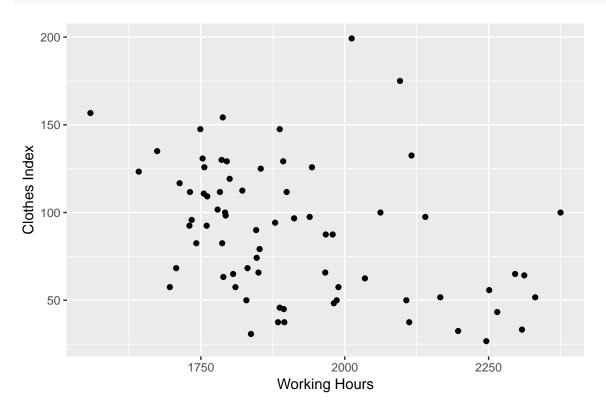
gf\_point(food\_costs ~ womens\_clothing, data = Prices, xlab = "Cost of Women's Clothes", ylab = "Food Co



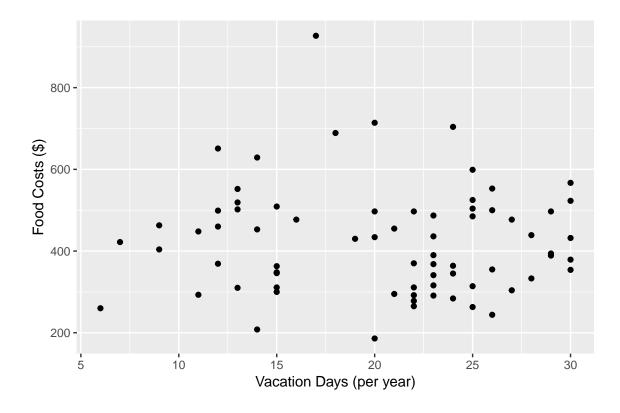
gf\_point(i\_phone\_4s\_hr ~ wage\_gross, data = Prices, xlab = "Average Hourly Wage", ylab = "Hours to Earn



gf\_point(clothing\_index ~ hours\_worked, data = Prices, xlab = "Working Hours", ylab = "Clothes Index")



gf\_point(food\_costs ~ vacation\_days, data = Prices, xlab = "Vacation Days (per year)", ylab = "Food Cos"



#### Roles for Variables

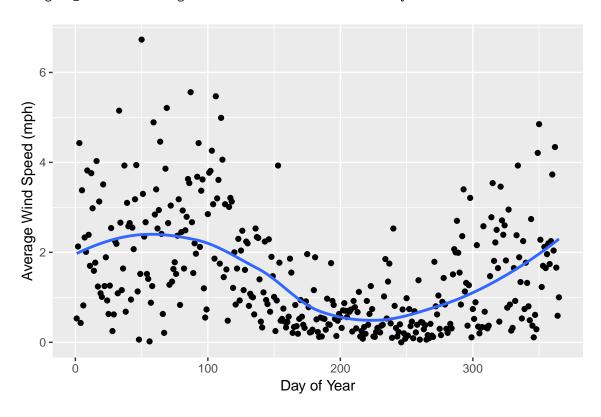
#### **Smoothing Scatterplots**

```
HopkinsForest <- read_csv("http://nhorton.people.amherst.edu/is5/data/Hopkins_Forest.csv") %%</pre>
  clean_names()
## Parsed with column specification:
## cols(
     .default = col_double(),
##
##
     Date = col_character(),
##
     Year = col_integer(),
     Month = col_integer(),
##
##
     Day = col_integer(),
     `Day of Year` = col_integer(),
##
##
     `Max Sol Rad (w/m^2)` = col_integer(),
     `Min Sol Rad (w/m^2)` = col_integer(),
##
##
     `Total Sol Rad (w/m^2)` = col_integer(),
     `Min Wind (mph)` = col_integer(),
     `Max Barom (mb)` = col_integer(),
##
##
     `Min Barom (mb)` = col_integer()
## )
## See spec(...) for full column specifications.
# Figure 6.2, page 168
```

gf\_smooth(se = FALSE, xlab = "Day of Year", ylab = "Average Wind Speed (mph)")

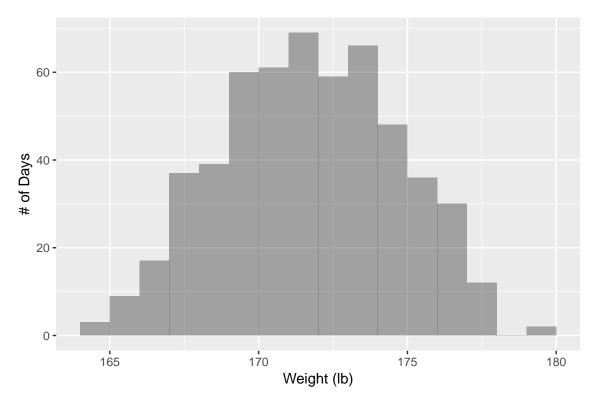
gf\_point(avg\_wind\_mph ~ day\_of\_year, data = HopkinsForest) %>%

##  $geom_smooth()$  using method = 'loess' and formula 'y ~ x'



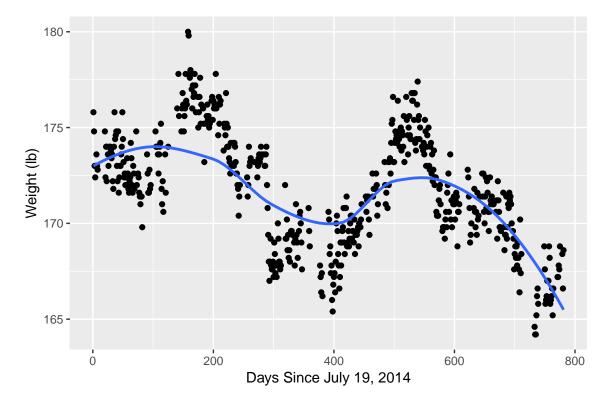
## Example 6.2: Smoothing Timeplots

## Warning: Removed 70 rows containing non-finite values (stat\_bin).

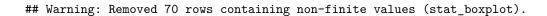


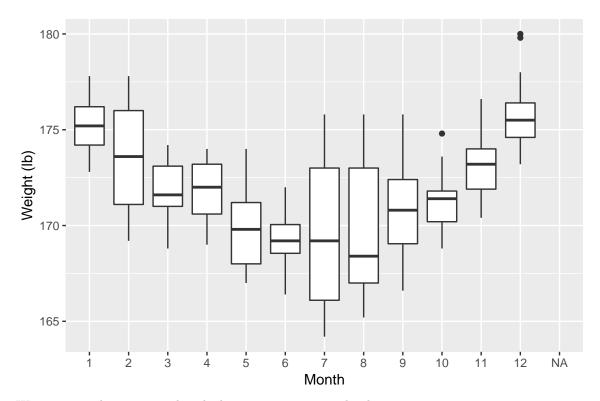
```
gf_point(weight ~ days_since_july_19_2014, data = Fitness) %>%
gf_smooth(se = FALSE, xlab = "Days Since July 19, 2014", ylab = "Weight (lb)")
```

- ## Warning: Removed 70 rows containing non-finite values (stat\_smooth).
- ## Warning: Removed 70 rows containing missing values (geom\_point).



gf\_boxplot(weight ~ as.factor(month), data = Fitness, xlab = "Month", ylab = "Weight (1b)")





Warnings can be suppressed with the warnings=FALSE chunk option.

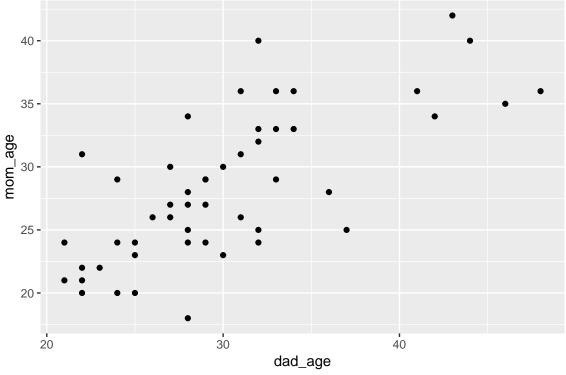
#### Section 6.2: Correlation

## cols(

```
HeightsWeights <- read_csv("http://nhorton.people.amherst.edu/is5/data/Heights_and_weights.csv")</pre>
## Parsed with column specification:
## cols(
     Weight = col_integer(),
     Height = col_double()
##
## )
# Figure 6.3, page 170
gf_point(Weight ~ Height, data = HeightsWeights, xlab = "Height (in.)", ylab = "Weight (lb)")
   250 -
   200 -
Weight (lb)
   150 -
   100 -
                                                  70
                                                                         75
                            65
                                         Height (in.)
cor(Weight ~ Height, data = HeightsWeights)
## [1] 0.6440311
See displays on pages 170 - 171.
Step-by-Step Example: Looking at Association
Framingham <- read_csv("http://nhorton.people.amherst.edu/is5/data/Framingham.csv")</pre>
## Parsed with column specification:
```

```
Cholesterol = col_integer(),
##
     Age = col_integer(),
##
     Sex = col_character(),
##
##
     SBP = col_integer(),
##
     DBP = col_integer(),
##
     CIG = col_integer()
## )
## Warning in rbind(names(probs), probs_f): number of columns of result is not
## a multiple of vector length (arg 2)
## Warning: 1 parsing failure.
## row # A tibble: 1 x 5 col
                                  row col
                                             expected
                                                        actual file
gf_point(SBP ~ DBP, data = Framingham, xlab = "Diastolic BP (mm Hg)", ylab = "Systolic BP (mm Hg)")
   300 -
   250 -
Systolic BP (mm Hg)
   200 -
   150
   100 -
                                                      120
                                                                                160
                             80
                                   Diastolic BP (mm Hg)
cor(SBP ~ DBP, data = Framingham)
## [1] 0.7924792
Random Matters: Correlations Vary
LiveBirths <- read_csv("http://nhorton.people.amherst.edu/is5/data/Babysamp_98.csv") %>%
  clean_names()
## Parsed with column specification:
## cols(
```

```
MomAge = col_integer(),
##
##
     DadAge = col_integer(),
##
     MomEduc = col_integer(),
##
     MomMarital = col_integer(),
##
     numlive = col_integer(),
##
     dobmm = col_integer(),
##
     gestation = col_integer(),
##
     sex = col_character(),
##
     weight = col_integer(),
##
     prenatalstart = col_integer(),
     orig.id = col_integer(),
     preemie = col_logical()
##
## )
LiveBirths <- LiveBirths %>%
  filter(dad_age != "NA")
set.seed(14513) # For reproducibility
numsim <- 10000 # Number of samples
gf_point(mom_age ~ dad_age, data = sample(LiveBirths, 50))
```



```
# Graph will look different for different samples
cor(mom_age ~ dad_age, data = LiveBirths)
```

```
## [1] 0.7516507
```

```
# What does do() do?
cor(mom_age ~ dad_age, data = sample(LiveBirths, 50)) # Correlation of one random sample
```

## [1] 0.7619002

```
cor(mom_age ~ dad_age, data = sample(LiveBirths, 50)) # Correlation of another random sample
## [1] 0.7767026

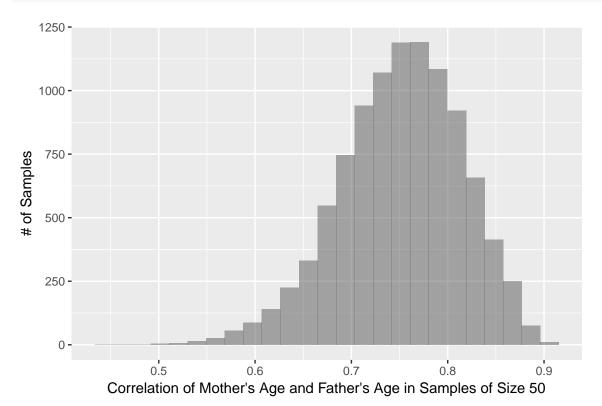
do(2) * cor(mom_age ~ dad_age, data = sample(LiveBirths, 50)) # Finds the correlation twice

## cor
## 1 0.7067583
## 2 0.7401397

# For the visualization, we need 10,000 correlations
LiveCorr <- do(numsim) * cor(mom_age ~ dad_age, data = sample(LiveBirths, 50))</pre>
```

The do() function runs, 10,000 times, the correlation and sampling functions on a random sample of 50.

```
gf_histogram(~ cor, data = LiveCorr,
    xlab = "Correlation of Mother's Age and Father's Age in Samples of Size 50",
    ylab = "# of Samples")
```

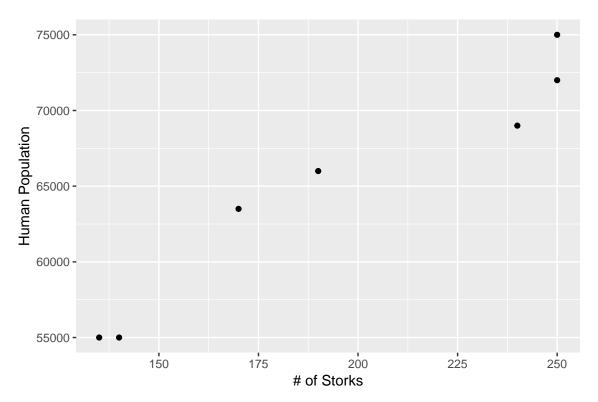


Section 6.3: Warning: Correlation  $\neq$  Causation

```
Storks <- read_csv("http://nhorton.people.amherst.edu/is5/data/Storks.csv")</pre>
```

```
## Parsed with column specification:
## cols(
## Storks = col_integer(),
## Population = col_integer()
## )

# Figure 6.9
gf_point(Population ~ Storks, data = Storks, xlab = "# of Storks", ylab = "Human Population")
```



### **Correlation Tables**

```
Companies <- read_csv("http://nhorton.people.amherst.edu/is5/data/Companies.csv") %>%
  clean_names()
```

```
## Parsed with column specification:
## cols(
##
     Company = col_character(),
##
     Assets = col_integer(),
     Sales = col_integer(),
##
     `Market Value` = col_integer(),
##
     Profits = col_double(),
##
     `Cash Flow` = col_double(),
##
     Employees = col_double(),
##
     sector = col_character(),
##
     Banks = col_integer()
##
## )
```

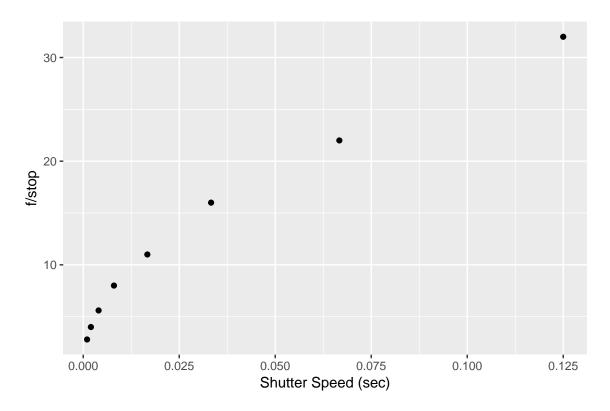
```
Companies %>%
  select(assets, sales, market_value, profits, cash_flow, employees) %>%
  cor()
##
                    assets
                                sales market_value
                                                      profits cash_flow
## assets
               ## sales 0.7464649 1.0000000 0.8788920 0.8137758 0.8549172 
## market_value 0.6822122 0.8788920 1.0000000 0.9681987 0.9702851 
## profits 0.6016986 0.8137758 0.9681987 1.0000000 0.9887795
## cash_flow
                 0.6409018 0.8549172 0.9702851 0.9887795 1.0000000
## employees 0.5943581 0.9240429 0.8182161 0.7621057 0.7866148
                employees
## assets
               0.5943581
## sales
               0.9240429
## market_value 0.8182161
## profits 0.7621057
## cash flow
                 0.7866148
## employees
                1.0000000
```

# Section 6.4: Straightening Scatterplots

```
FStops <- read_csv("http://nhorton.people.amherst.edu/is5/data/F-stops.csv") %>%
    clean_names()

## Parsed with column specification:
## cols(
## `F-stop` = col_double(),
## ShutterSpeed = col_double()
## )

# Figure 6.10, page 179
gf_point(f_stop ~ shutter_speed, data = FStops, xlab = "Shutter Speed (sec)", ylab = "f/stop")
```



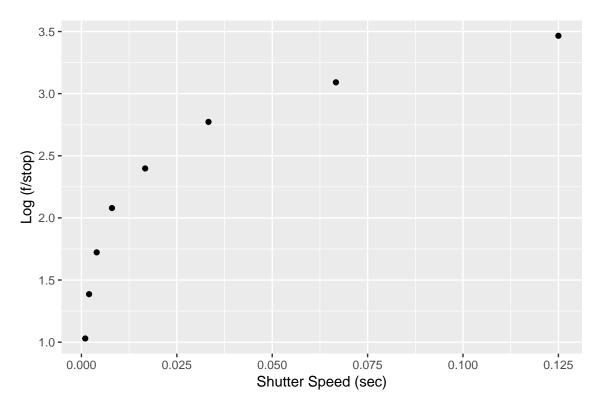
cor(f\_stop ~ shutter\_speed, data = FStops)

## [1] 0.9786716

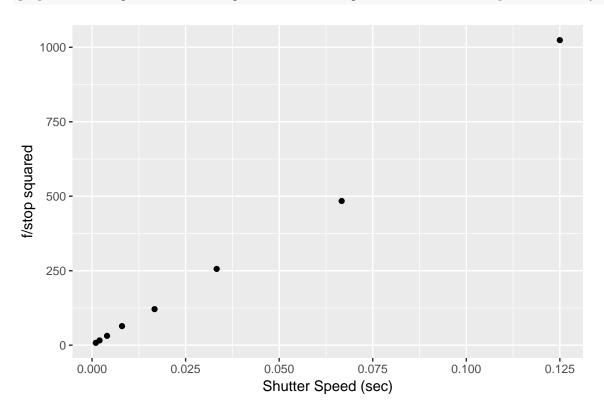
The Ladder of Powers

f/Stops Again

```
# Figure 6.11, page 181
gf_point(log(f_stop) ~ shutter_speed, data = FStops, xlab = "Shutter Speed (sec)", ylab = "Log (f/stop)
```



# Figure 6.12
gf\_point((f\_stop)^2 ~ shutter\_speed, data = FStops, xlab = "Shutter Speed (sec)", ylab = "f/stop square"



See displays in "What Can Go Wrong?" on pages 181-183.