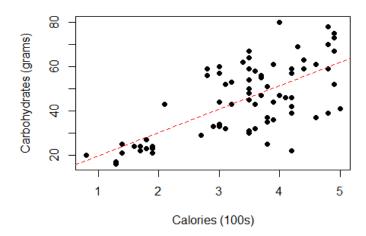
Regression_Basics

```
# Interested in predicting the amount of carbohydrates (in grams) for a menu
item
# based on its calorie content (measured in 100s).
#install readxl package first
library(readx1)
coffee <- read excel("starbucks.xlsx", na="NA", col names = TRUE)</pre>
attach(coffee)
# Descriptive statistics
library(pastecs)
## Warning: package 'pastecs' was built under R version 3.3.3
## Loading required package: boot
stat.desc(calories)
##
        nbr.val
                    nbr.null
                                    nbr.na
                                                    min
                                                                  max
##
     77.0000000
                   0.0000000
                                 0.0000000
                                              0.8000000
                                                           5.0000000
##
                                    median
                                                             SE.mean
          range
                         sum
                                                   mean
      4.2000000 260.9000000
                                              3.3883117
##
                                 3.5000000
                                                           0.1200788
## CI.mean.0.95
                                   std.dev
                                               coef.var
                         var
##
      0.2391576
                   1.1102563
                                 1.0536870
                                              0.3109770
summary(calories)
##
      Min. 1st Qu.
                    Median
                              Mean 3rd Qu.
                                               Max.
##
     0.800
             3.000
                     3.500
                              3.388
                                      4.200
                                              5.000
stat.desc(carb)
##
        nbr.val
                    nbr.null
                                    nbr.na
                                                    min
                                                                  max
##
     77.0000000
                   0.0000000
                                 0.0000000
                                             16.0000000
                                                          80.0000000
##
                                    median
                                                             SE.mean
          range
                                                   mean
                         sum
##
     64.0000000 3455.0000000
                               45.0000000
                                             44.8701299
                                                           1.8862338
## CI.mean.0.95
                                   std.dev
                                               coef.var
                         var
##
      3.7567602 273.9565960
                                              0.3688787
                               16.5516342
summary(carb)
                              Mean 3rd Qu.
##
      Min. 1st Qu.
                    Median
                                               Max.
##
     16.00 31.00
                     45.00
                             44.87 59.00
                                              80.00
```

```
# A.
    # Scatter plot w/ fitted linear regression line
plot(calories, carb, pch = 16, main = "Starbucks", xlab = "Calories (100s)",
ylab = "Carbohydrates (grams)")
abline(lm(carb ~ calories), lty=2, col="red")
```

Starbucks

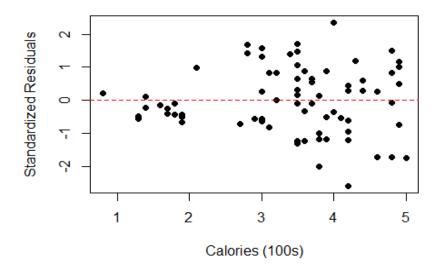


```
# B/C/D/H
  # fit the model
    # linefit1 stores information that can be accessed
linefit1 <- lm(carb ~ calories)</pre>
    # to see an information summary of the fitted model
summary(linefit1)
##
## Call:
## lm(formula = carb ~ calories)
##
## Residuals:
##
       Min
                10 Median
                                3Q
                                       Max
## -31.477 -7.476 -1.029 10.127 28.644
##
## Coefficients:
               Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
                  8.944
                             4.746
                                     1.884
                                             0.0634 .
## calories
                 10.603
                             1.338
                                     7.923 1.67e-11 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 12.29 on 75 degrees of freedom
## Multiple R-squared: 0.4556, Adjusted R-squared: 0.4484
## F-statistic: 62.77 on 1 and 75 DF, p-value: 1.673e-11
      # check on p-value
2* (1 - pt(7.923, 75))
## [1] 1.671818e-11
```

```
# there are also functions for seeing specific features, e.g.,
    # to see the coefficients Beta-hats
coefficients(linefit1)
## (Intercept)
                  calories
       8.94356
                  10.60309
    # to see the coefficient of determination R-squared
summary(linefit1)$r.squared
## [1] 0.4556237
    # standard deviation of the residuals = sqrt(MSE)
summary(linefit1)$sigma
## [1] 12.29325
# E
# ANOVA data for simple linear regression
anova(linefit1)
## Analysis of Variance Table
## Response: carb
             Df Sum Sq Mean Sq F value
## calories 1 9486.4 9486.4 62.772 1.673e-11 ***
## Residuals 75 11334.3 151.1
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# F.
  # Observed residuals, epsilon-hats
resids <- residuals(linefit1)</pre>
resids
##
                                     3
             1
                         2
##
    20.9456291 17.9456291
                             5.5234670 14.1013049 -5.7275758
                                                                -1.1749887
##
                                     9
             7
                         8
                                                10
                                                             11
                                                                         12
##
     3.2822315
                 6.8250113 -9.8131355 -14.4765330
                                                     1.7647024
                                                                 10.1265557
##
            13
                                    15
                        14
                                                 16
                                                             17
                                                                         18
     2.5739686
               -4.3559153 -20.7177685
                                       -4.1146798
                                                    -6.2956064
                                                                  1.9456291
##
            73
##
                        74
                                    75
                                                76
                                                            77
## -7.4765330 -14.2956064
                             3.2471734 16.2471734 19.2471734
  # adding the residuals to the coffee data frame
coffee$resids <- resids</pre>
  # Use the data frame to identify specific residuals
subset(coffee, subset=item=="Apple Bran Muffin", select = c('resids'))
##
       resids
## 2 17.94563
subset(coffee, subset=item=="Apple Fritter", select = c('resids'))
       resids
## 3 5.523467
```

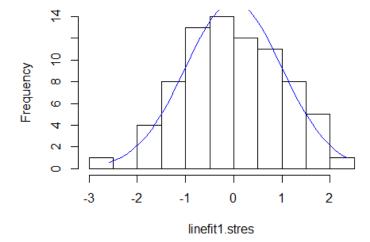
```
# K. Assumption checking
    # standardized residual plot
linefit1.stres <- rstandard(linefit1)
plot(calories, linefit1.stres, pch = 16, main = "Standardized Residual Plot",
xlab = "Calories (100s)", ylab = "Standardized Residuals")
abline(0,0, lty=2, col="red")</pre>
```

Standardized Residual Plot



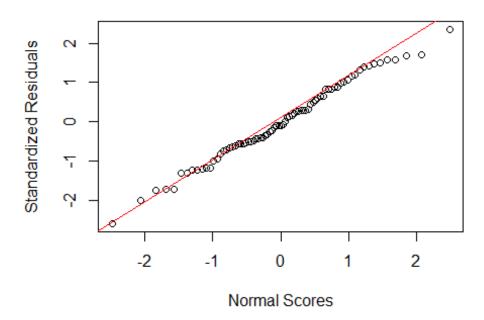
```
# Normality
    # Histogram of standardized residuals with normal curve
h <- hist(linefit1.stres)
x <- linefit1.stres
xfit <- seq(min(x), max(x), length = 40)
yfit <- dnorm(xfit, mean = mean(x), sd = sd(x))
yfit <- yfit*diff(h$mids[1:2])*length(x)
lines(xfit, yfit, col="blue")</pre>
```

Histogram of linefit1.stres



```
# normal probability plot
qqnorm(linefit1.stres, main = "Normal Probability Plot", xlab = "Normal Score
s", ylab = "Standardized Residuals")
qqline(linefit1.stres, col = "red")
```

Normal Probability Plot



```
# hypothesis test
shapiro.test(linefit1.stres)

##

## Shapiro-Wilk normality test
##

## data: linefit1.stres

## W = 0.99032, p-value = 0.832
```

```
# NOTE: Syntax below works if use attach followed by the Lm syntax used abo
ve to create linefit1
    # create data frame with value of calories = 4.5 for which estimates/pred
ictions is desired
newdata <- data.frame(calories = 4.5)</pre>
    # 90% prediction interval for Y
predict(linefit1, newdata, interval="predict", level = .90)
##
          fit
                   lwr
                           upr
## 1 56.65746 35.90302 77.4119
    # for comparison: 90% confidence interval for the mean
predict(linefit1, newdata, interval="confidence", level = .90)
          fit
                   lwr
## 1 56.65746 53.25409 60.06083
 # NOTE: As alternative (without attach) can use:
linefit2 <- lm(carb ~ calories, data = coffee)</pre>
predict(linefit2, newdata, interval="predict", level = .90)
          fit
                   lwr
                           upr
## 1 56.65746 35.90302 77.4119
# Clean up
detach(coffee)
```