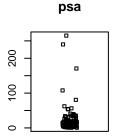
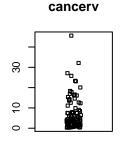
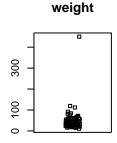
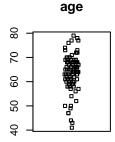
R Notebook

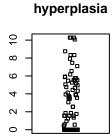
```
library(readxl)
pcancerdf <- read_xlsx("../823data/pcancer.xlsx")</pre>
#change score and seminal to factors
#the levels keep the default names for now...
pcancerdf$score <- factor(pcancerdf$score)</pre>
pcancerdf$seminal <- factor(pcancerdf$seminal)</pre>
str(pcancerdf)
## tibble [97 x 9] (S3: tbl_df/tbl/data.frame)
               : num [1:97] 1 2 3 4 5 6 7 8 9 10 ...
## $ idnum
## $ psa
                : num [1:97] 0.651 0.852 0.852 0.852 1.448 ...
## $ cancerv : num [1:97] 0.56 0.372 0.601 0.301 2.117 ...
               : num [1:97] 16 27.7 14.7 26.6 30.9 ...
## $ weight
## $ age
                 : num [1:97] 50 58 74 58 62 50 64 58 47 63 ...
## $ hyperplasia: num [1:97] 0 0 0 0 0 ...
## $ seminal : Factor w/ 2 levels "0", "1": 1 1 1 1 1 1 1 1 1 1 ...
## $ capsular
                 : num [1:97] 0 0 0 0 0 0 0 0 0 0 ...
## $ score
                 : Factor w/ 3 levels "6","7","8": 1 2 2 1 1 1 1 1 2 1 ...
print("factor levels for score")
## [1] "factor levels for score"
levels(pcancerdf$score)
## [1] "6" "7" "8"
print("factor levels for seminal")
## [1] "factor levels for seminal"
levels(pcancerdf$seminal)
## [1] "0" "1"
par(mfrow = c(2,4))
for(i in c(2,3,4,5,6,8)){ #7 and 9 are now factors - so skip
  stripchart(pcancerdf[,i], main = names(pcancerdf[i]),
             vertical = TRUE,method = "jitter")
}
```

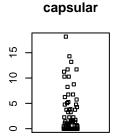












```
#library(epiDisplay)
#library(car)
#summ(pcancerdf)
summary(pcancerdf)
```

```
##
        idnum
                                      cancerv
                                                         weight
                     psa
##
   Min. : 1
                 Min. : 0.651
                                         : 0.2592
                                                     Min. : 10.70
                                   Min.
   1st Qu.:25
                 1st Qu.: 5.641
                                   1st Qu.: 1.6653
                                                     1st Qu.: 29.37
##
##
  Median:49
                 Median : 13.330
                                   Median : 4.2631
                                                     Median : 37.34
##
  Mean
          :49
                 Mean
                       : 23.730
                                   Mean
                                          : 6.9987
                                                     Mean
                                                           : 45.49
                                                     3rd Qu.: 48.42
   3rd Qu.:73
                 3rd Qu.: 21.328
                                   3rd Qu.: 8.4149
##
##
   Max.
           :97
                 Max.
                        :265.072
                                  Max.
                                          :45.6042
                                                     Max.
                                                           :450.34
##
        age
                    hyperplasia
                                     seminal
                                                capsular
                                                               score
          :41.00
                          : 0.000
                                     0:76
                                                    : 0.0000
                                                               6:33
##
  Min.
                   Min.
                                             Min.
   1st Qu.:60.00
                                             1st Qu.: 0.0000
##
                   1st Qu.: 0.000
                                     1:21
                                                               7:43
##
  Median :65.00
                   Median : 1.350
                                             Median : 0.4493
                                                               8:21
##
  Mean
          :63.87
                   Mean
                          : 2.535
                                             Mean
                                                    : 2.2454
                    3rd Qu.: 4.759
##
   3rd Qu.:68.00
                                             3rd Qu.: 3.2544
   Max.
           :79.00
                    Max.
                           :10.278
                                             Max.
                                                    :18.1741
library(leaps)
```

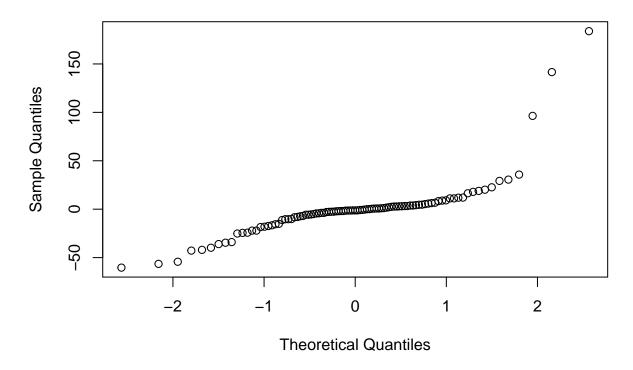
```
## Warning: package 'leaps' was built under R version 4.0.4
regsubsets.model <- regsubsets(psa ~ cancerv + weight + age + hyperplasia + capsular ,data = pcancerdf)
regsubsets.model.summ <- summary(regsubsets.model)</pre>
```

```
regsubsets.model.summ
## Subset selection object
## Call: regsubsets.formula(psa ~ cancerv + weight + age + hyperplasia +
       capsular, data = pcancerdf)
## 5 Variables (and intercept)
##
               Forced in Forced out
## cancerv
                   FALSE
                              FALSE
## weight
                   FALSE
                              FALSE
                   FALSE
                              FALSE
## age
## hyperplasia
                   FALSE
                              FALSE
## capsular
                   FALSE
                              FALSE
## 1 subsets of each size up to 5
## Selection Algorithm: exhaustive
            cancerv weight age hyperplasia capsular
## 1 ( 1 ) "*"
                    11 11
                           \Pi=\Pi=\Pi=\Pi
## 2 (1)"*"
                    11 11
                           \Pi=\Pi=\Pi=\Pi
                                            "*"
## 3 (1)"*"
                           " " "*"
                                            "*"
## 4 ( 1 ) "*"
                    11 11
                           "*" "*"
                                            "*"
## 5 (1)"*"
                    "*"
                           "*" "*"
                                            "*"
print("adjusted $R^{2}$")
## [1] "adjusted $R^{2}$"
regsubsets.model.summ$adjr2
## [1] 0.3831383 0.4040770 0.4020477 0.3983838 0.3917987
print("cp")
## [1] "cp"
regsubsets.model.summ$cp
## [1] 3.352737 1.102335 2.432833 4.003900 6.000000
print("bic")
## [1] "bic"
regsubsets.model.summ$bic
## [1] -38.72801 -38.52950 -34.66247 -30.54388 -25.97332
Look at cancerv and capsular together
lm.psa.1 <- lm(data = pcancerdf, formula = psa ~ cancerv + capsular)</pre>
summary(lm.psa.1)
##
## Call:
## lm(formula = psa ~ cancerv + capsular, data = pcancerdf)
## Residuals:
##
       Min
                1Q Median
                                3Q
                                        Max
## -60.346 -8.324 -1.205 4.159 183.843
## Coefficients:
```

```
##
               Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                 1.3276
                            4.2861
                                     0.310
                                              0.757
## cancerv
                 2.4139
                            0.5655
                                     4.269 4.69e-05 ***
                 2.4533
## capsular
                            1.1779
                                     2.083
                                              0.040 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 31.48 on 94 degrees of freedom
## Multiple R-squared: 0.4165, Adjusted R-squared: 0.4041
## F-statistic: 33.55 on 2 and 94 DF, p-value: 1.01e-11
#plot(psa ~ cancerv + capsular, data = pcancerdf)
cancerv and capsular are both significant.
look at seminal, cancerv
lm.psa.2 <- lm(data = pcancerdf, formula = psa ~ seminal + cancerv)</pre>
summary(lm.psa.2)
##
## Call:
## lm(formula = psa ~ seminal + cancerv, data = pcancerdf)
## Residuals:
##
       Min
                10 Median
                                30
                                       Max
## -55.145 -7.535 -1.129
                             4.256 170.018
## Coefficients:
               Estimate Std. Error t value Pr(>|t|)
##
                             4.231
## (Intercept)
                 1.060
                                    0.251
                                             0.8027
## seminal1
                 24.647
                             9.423
                                     2.616
                                             0.0104 *
## cancerv
                  2.477
                             0.495
                                     5.003 2.62e-06 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 31.09 on 94 degrees of freedom
## Multiple R-squared: 0.431, Adjusted R-squared: 0.4189
## F-statistic: 35.6 on 2 and 94 DF, p-value: 3.098e-12
#plot(psa ~ seminal + cancerv, data = pcancerdf)
seminal and cancerv are both statistically significant in this regression
look at seminal alone and try regression again
lm.psa.2 <- lm(data = pcancerdf, formula = psa ~ seminal)</pre>
summary(lm.psa.2)
##
## Call:
## lm(formula = psa ~ seminal, data = pcancerdf)
##
## Residuals:
##
       Min
                1Q Median
                                3Q
                                       Max
## -55.415 -9.598 -4.918 4.154 200.541
##
## Coefficients:
```

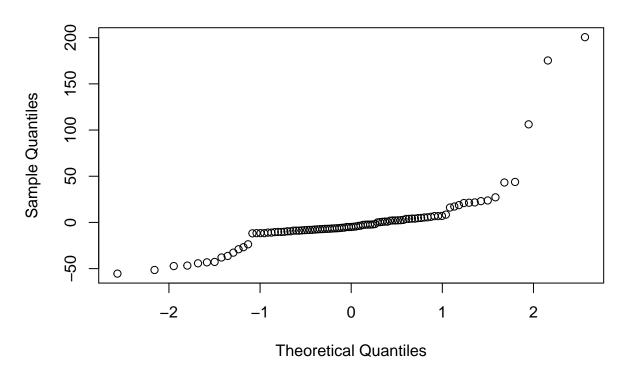
```
Estimate Std. Error t value Pr(>|t|)
                12.456
                            3.992
                                   3.12 0.00239 **
## (Intercept)
## seminal1
                52.075
                            8.579
                                     6.07 2.61e-08 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 34.8 on 95 degrees of freedom
## Multiple R-squared: 0.2794, Adjusted R-squared: 0.2719
## F-statistic: 36.84 on 1 and 95 DF, p-value: 2.614e-08
seminal alone is statistically significant
Look at seminal and score
summary(lm(data = pcancerdf, formula = psa ~ seminal + score))
##
## Call:
## lm(formula = psa ~ seminal + score, data = pcancerdf)
## Residuals:
      Min
               1Q Median
                               3Q
                                      Max
## -67.800 -7.813 -2.581
                            6.136 184.206
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 9.261
                            5.689
                                    1.628
                                             0.107
## seminal1
                39.398
                            8.943
                                    4.406 2.82e-05 ***
                            7.722 -0.302
## score7
                -2.331
                                             0.763
## score8
                32.206
                           10.125
                                    3.181
                                             0.002 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 32.64 on 93 degrees of freedom
## Multiple R-squared: 0.3793, Adjusted R-squared: 0.3593
## F-statistic: 18.95 on 3 and 93 DF, p-value: 1.133e-09
not all factors are statistically significant
qqnorm(residuals(lm.psa.1))
```

Normal Q-Q Plot



The residuals for cancerv and capsular do not look normally distributed qqnorm(residuals(lm.psa.2))

Normal Q-Q Plot



the residuals for seminal doe not look normally distributed

pcancerdf[pcancerdf\$capsular == 0,]

```
## # A tibble: 45 x 9
                                      age hyperplasia seminal capsular score
##
      idnum
              psa cancerv weight
      <dbl> <dbl>
                      <dbl>
                             <dbl> <dbl>
                                                 <dbl> <fct>
                                                                    <dbl> <fct>
##
##
    1
           1 0.651
                      0.560
                              16.0
                                                  0
                                                        0
                                                                        0 6
                                       50
##
    2
           2 0.852
                      0.372
                              27.7
                                       58
                                                  0
                                                        0
                                                                        0 7
           3 0.852
                              14.7
                                       74
                                                                        0 7
##
    3
                      0.600
                                                  0
                                                        0
           4 0.852
                                                        0
                                                                        0 6
##
    4
                      0.301
                              26.6
                                       58
                                                  0
    5
           5 1.45
                              30.9
                                       62
                                                  0
                                                        0
                                                                        0 6
##
                      2.12
##
    6
           6 2.16
                      0.350
                              25.3
                                       50
                                                  0
                                                        0
                                                                        0 6
          7 2.16
                      2.10
                              32.1
                                                  1.86 0
                                                                        0 6
##
    7
                                       64
##
          8 2.34
                      1.99
                              34.5
                                                  4.66 0
                                                                        0 6
    8
                                       58
          9 2.86
                                                                        0 7
##
    9
                      0.458
                               34.5
                                       47
                                                        0
## 10
         10 2.86
                      1.25
                               25.5
                                       63
                                                  0
                                                                        0 6
## # ... with 35 more rows
```

pcancerdf[pcancerdf\$weight > 100,]

```
## # A tibble: 3 x 9
##
     idnum
             psa cancerv weight
                                    age hyperplasia seminal capsular score
##
     <dbl> <dbl>
                    <dbl>
                           <dbl> <dbl>
                                              <dbl> <fct>
                                                                <dbl> <fct>
## 1
        32 7.46
                     1.20
                            450.
                                     65
                                               5.47 0
                                                                0
                                                                       6
## 2
        70 19.5
                     3.29
                            119.
                                     72
                                              10.3 0
                                                                0.449 7
## 3
        89 53.5
                    16.6
                            112.
                                     65
                                               0
                                                     1
                                                               11.7
```

```
pcancerdf[pcancerdf$hyperplasia == 0,]
## # A tibble: 43 x 9
##
      idnum psa cancerv weight
                                    age hyperplasia seminal capsular score
##
      <dbl> <dbl>
                    <dbl>
                            <dbl> <dbl>
                                               <dbl> <fct>
                                                                 <dbl> <fct>
##
    1
          1 0.651
                    0.560
                             16.0
                                     50
                                                   0 0
                                                                       6
##
    2
          2 0.852
                    0.372
                             27.7
                                     58
                                                   0 0
                                                                 0
                                                                       7
                                                   0 0
                                                                 0
                                                                       7
##
   3
          3 0.852
                    0.600
                             14.7
                                     74
          4 0.852
                    0.301
                             26.6
                                                   0 0
                                                                0
                                                                       6
##
   4
                                     58
##
   5
          5 1.45
                    2.12
                             30.9
                                     62
                                                   0 0
                                                                 0
                                                                       6
##
   6
          6 2.16
                    0.350
                             25.3
                                     50
                                                   0 0
                                                                 \cap
                                                                       6
   7
          9 2.86
                    0.458
                             34.5
                                     47
                                                   0 0
                                                                 0
                                                                       7
##
                                                   0 0
         10 2.86
                    1.25
                             25.5
                                                                 0
                                                                       6
##
   8
                                     63
##
   9
         11 3.56
                    1.28
                             36.6
                                     65
                                                   0 0
                                                                 0
                                                                       6
         13 3.56
                    5.00
                             20.5
                                                   0 0
## 10
                                     63
                                                                 0.549 7
## # ... with 33 more rows
creating new columns with 0's removed and a new data frame with the highest weights removed
pcancerdf$hyperplasia.na <- sapply(pcancerdf$hyperplasia,function(x){if (x == 0){return (NA)} else {ret
pcancerdf$capsular.na <- sapply(pcancerdf$capsular,function(x){if (x == 0){return (NA)}} else {return (x
pcancerdf.100 <- pcancerdf[pcancerdf$weight < 100,]</pre>
Check the coefficients for cancerv and capsular with capsular 0's replaced with na
lm.psa.1.1 <- lm(data = pcancerdf, formula = psa ~ cancerv + capsular.na)</pre>
print("coefficients for cancerv and capsular - zeros replaced")
## [1] "coefficients for cancerv and capsular - zeros replaced"
round(summary(lm.psa.1.1)$coefficient,5)
##
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) -2.15983
                            8.95937 -0.24107 0.81051
## cancerv
                2.87308
                            0.98824 2.90726 0.00546
## capsular.na 1.99648
                            1.99710 0.99969 0.32237
print("coefficients for cancerv and capsular - raw data")
## [1] "coefficients for cancerv and capsular - raw data"
round(summary(lm.psa.1)$coefficient,5)
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) 1.32760
                            4.28605 0.30975 0.75744
## cancerv
                2.41388
                            0.56547 4.26884 0.00005
## capsular
                2.45330
                            1.17789 2.08278 0.03999
check hyperplasia again to see if the attribute is more useful with zeros removed
lm.psa.3 <- lm(data = pcancerdf, formula = psa ~ hyperplasia)</pre>
lm.psa.3.1 <- lm(data = pcancerdf, formula = psa ~ hyperplasia.na)</pre>
print("coefficients for seminal - zeros replaced")
## [1] "coefficients for seminal - zeros replaced"
round(summary(lm.psa.3.1)$coefficient,5)
##
                  Estimate Std. Error t value Pr(>|t|)
                              12.60306 2.71078 0.00907
## (Intercept)
                  34.16409
```

```
## hyperplasia.na -1.83426 2.38708 -0.76841 0.44572
print("coefficients for seminal - raw data")
## [1] "coefficients for seminal - raw data"
round(summary(lm.psa.3)$coefficient,5)
##
              Estimate Std. Error t value Pr(>|t|)
                          5.43709 4.46790 0.00002
## (Intercept) 24.29238
## hyperplasia -0.22182
                          1.38021 -0.16071 0.87266
lm.psa.3 <- lm(data = pcancerdf, formula = psa ~ weight)</pre>
lm.psa.3.1 <- lm(data = pcancerdf.100, formula = psa ~ weight)</pre>
print("coefficients for weight - weight > 100 removed")
## [1] "coefficients for weight - weight > 100 removed"
round(summary(lm.psa.3.1)$coefficient,5)
##
              Estimate Std. Error t value Pr(>|t|)
                        11.40328 0.66473 0.50788
## (Intercept) 7.58013
## weight
               0.40440
                          0.26681 1.51567 0.13303
print("coefficients for weight - original data")
## [1] "coefficients for weight - original data"
round(summary(lm.psa.3)$coefficient,5)
              Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 22.66607 5.88626 3.85067 0.00021
## weight
              0.02339 0.09152 0.25558 0.79882
```