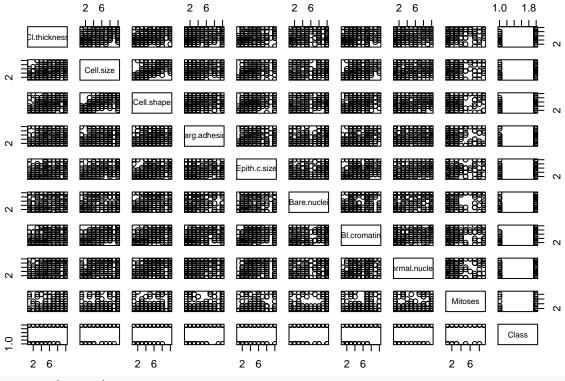
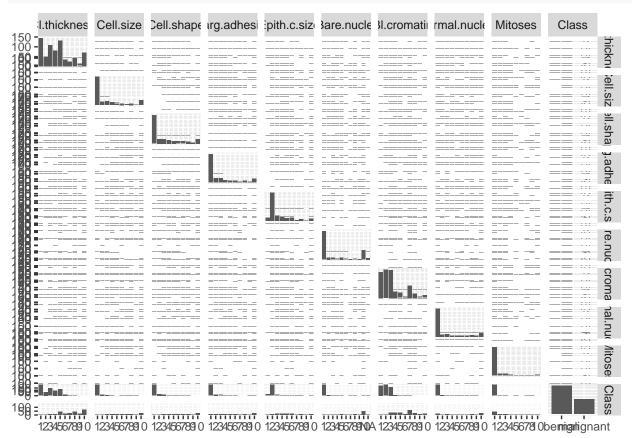
KaitlinRMD

M. de Ferrante, K. Maciejewski, P. Batten April 26, 2018

```
### Summary stuff for DS2 final project
library(mlbench)
data(BreastCancer)
attach(BreastCancer)
library(dplyr)
BreastCancer <- BreastCancer[,-1] # remove ID column</pre>
summary(BreastCancer) # note that everything is factor
     Cl.thickness
                                                  Marg.adhesion Epith.c.size
##
                      Cell.size
                                     Cell.shape
    1
##
            :145
                   1
                           :384
                                           :353
                                                          :407
                                                                 2
                                                                         :386
                                   1
                                                  1
##
    5
            :130
                   10
                           : 67
                                   2
                                           : 59
                                                  2
                                                          : 58
                                                                 3
                                                                         : 72
##
    3
            :108
                   3
                           : 52
                                   10
                                           : 58
                                                  3
                                                          : 58
                                                                 4
                                                                          : 48
##
    4
            : 80
                   2
                           : 45
                                   3
                                           : 56
                                                  10
                                                          : 55
                                                                 1
                                                                          : 47
##
    10
            : 69
                   4
                           : 40
                                   4
                                           : 44
                                                  4
                                                          : 33
                                                                 6
                                                                         : 41
##
            : 50
                   5
                           : 30
                                   5
                                           : 34
                                                          : 25
                                                                         : 39
                                                                  (Other): 66
##
    (Other):117
                    (Other): 81
                                   (Other): 95
                                                  (Other): 63
##
     Bare.nuclei
                    Bl.cromatin Normal.nucleoli
                                                       Mitoses
                                                                          Class
            :402
                   2
                                           :443
##
    1
                           :166
                                   1
                                                    1
                                                            :579
                                                                    benign
                                                                              :458
##
    10
            :132
                   3
                           :165
                                   10
                                           : 61
                                                    2
                                                            : 35
                                                                    malignant:241
##
    2
            : 30
                           :152
                                   3
                                           : 44
                                                            : 33
                   1
                                                    3
            : 30
##
                   7
                           : 73
                                   2
                                           : 36
                                                    10
                                                            : 14
    5
              28
                                           : 24
##
    3
                   4
                           : 40
                                   8
                                                    4
                                                            : 12
                           : 34
                                          : 22
##
    (Other): 61
                   5
                                   6
                                                    7
                                                            : 9
                                                    (Other): 17
    NA's
           : 16
                    (Other): 69
                                   (Other): 69
plot(BreastCancer)
```

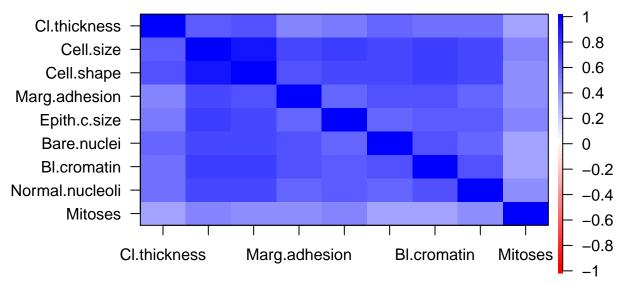


library(GGally)
ggpairs(BreastCancer) # note all are factors



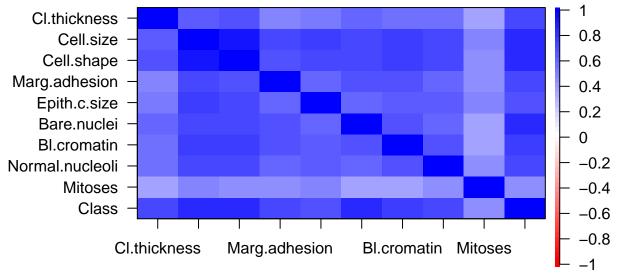
```
BreastCancer = BreastCancer %>%
  mutate(Cl.thickness=as.numeric(Cl.thickness)) %>%
  mutate(Cell.size=as.numeric(Cell.size)) %>%
  mutate(Cell.shape=as.numeric(Cell.shape)) %>%
  mutate(Marg.adhesion=as.numeric(Marg.adhesion)) %>%
  mutate(Epith.c.size=as.numeric(Epith.c.size)) %>%
  mutate(Bare.nuclei=as.numeric(Bare.nuclei)) %>%
  mutate(Bl.cromatin=as.numeric(Bl.cromatin)) %>%
  mutate(Normal.nucleoli=as.numeric(Normal.nucleoli)) %>%
  mutate(Mitoses=as.numeric(Mitoses)) %>% na.omit()
ggpairs(BreastCancer) # all but response are numeric
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
                    Cell.shape rg.adhes pith.c.siz Bare.nucle Bl.cromatil
                                                                     Mitoses
                                                                              Class
    I.thicknes Cell.size
                                                             rmal.nucle
0.15
0.10
0.05
0.00
             Corr:
                     Corr:
                              Corr:
                                      Corr:
                                              Corr:
                                                      Corr:
                                                              Corr:
                                                                      Corri
                                     0.524
                                             0.593
                                                      0.554
                                                              0.534
             0.642
                             0.488
1Q.Q
                                              Corr:
                     Corr:
                             Corr:
                                    Corr:
                                                     Corr:
                                                             Corr:
                                                                     Corri
                                     0.754
                                                              0.719
                     0.907
                             0.707
                                             0.692
                                                      0.756
                                                                      0.465
10.0
                                     Corr:
                                              Corr:
                                                    Corr:
                                                             Corr:
                                                                     Corri
                              Corr:
                                             0.714
                                                              0.718
                               .686
                                     0.722
                                                      0.735
1Q.Q
                                                              Corr:
                                      Corr:
                                              Corr:
                                                      Corr:
                                                                      Corr
                                     0.595
                                                              0.603
                                                                      0.425
                                             0.671
                                                      0.669
19.0
                                              Corr:
                                                      Corr:
                                                              Corr:
                                                                     Corr
                                              0.586
                                                      0.618
                                                      Corr:
                                                              Corr:
                                                                      Corri
                                                      0.681
                                                              0.584
                                                                      0.349
10.0
7.5
5.0
2.5
                                                              Corr:
                                                                      Corri
                                                              0.666
                                                                      0.354
10.0
                                                                      Corr
                                                                      0.437
                                                                                     Class
                                                     Ш
                                            many appropria
    library(psych)
cor.plot(BreastCancer[,-10]) # correlation not including response
```

Correlation plot

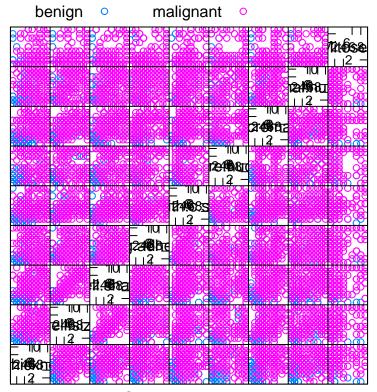


```
BreastCancer_num <- BreastCancer %>%
  mutate(Class = as.numeric(Class)-1) # numeric response
cor.plot(BreastCancer_num[,])
```

Correlation plot

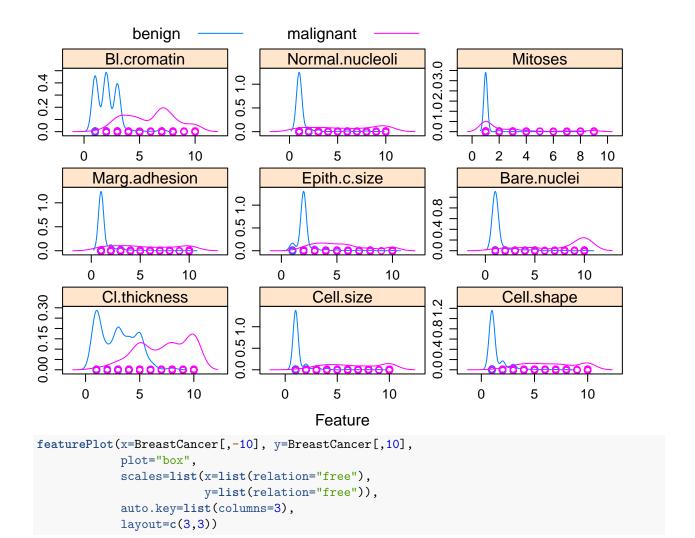


Warning in draw.key(simpleKey(...), draw = FALSE): not enough rows for
columns



Scatter Plot Matrix

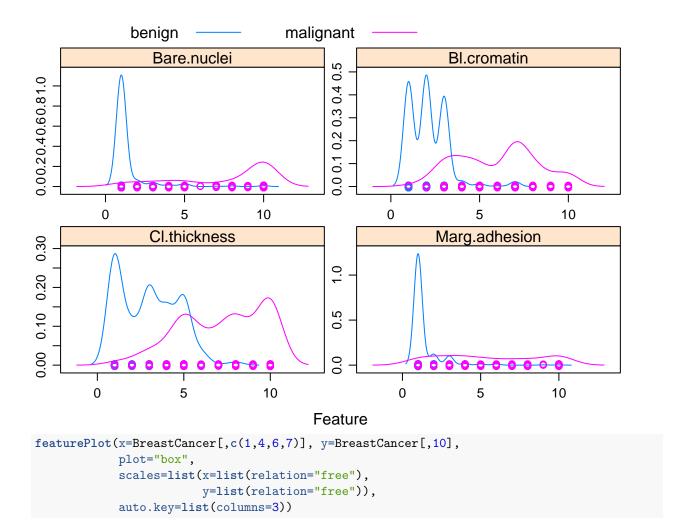
Warning in draw.key(simpleKey(...), draw = FALSE): not enough rows for
columns

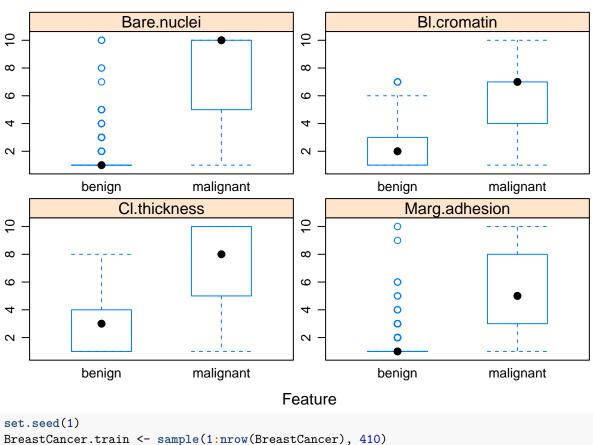


```
Bl.cromatin
                                      Normal.nucleoli
                                                                        Mitoses
10
                              9
                                                            ω
ω
                              \infty
                                                            9
9
                              9
                                                                      O
                                                            4
4
                              4
\alpha
                              \sim
                                                                    benign
       benign
                 malignant
                                     benign
                                               malignant
                                                                              malignant
        Marg.adhesion
                                        Epith.c.size
                                                                      Bare.nuclei
                              19
                                                            10
          8
\infty
                              ω
                                                            ω
                                                                      8
9
                              9
                                                            9
4
                              4
                                                            4
\alpha
       benign
                 malignant
                                                                    benign
                                                                              malignant
                                     benign
                                               malignant
                                                                       Cell.shape
          Cl.thickness
                                          Cell.size
10
                              9
                                                            9
\infty
                              \infty
                                                            ω
9
                              9
                                                            9
                                                            4
4
                              4
\sim
                              \sim
                                                            \alpha
       benign
                 malignant
                                     benign
                                                malignant
                                                                    benign
                                                                              malignant
                                          Feature
glm1 = glm(Class ~., data=BreastCancer,family=binomial)
summary(glm1)
##
## Call:
  glm(formula = Class ~ ., family = binomial, data = BreastCancer)
##
## Deviance Residuals:
##
       Min
                  1Q
                       Median
                                     3Q
                                             Max
## -3.4855 -0.1152 -0.0619
                                 0.0222
                                          2.4702
##
## Coefficients:
##
                      Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                    -10.110096
                                 1.173774
                                           -8.613 < 2e-16 ***
## Cl.thickness
                      0.535256
                                 0.141938
                                             3.771 0.000163 ***
## Cell.size
                     -0.005943
                                 0.209158 -0.028 0.977332
## Cell.shape
                      0.322136
                                 0.230644
                                             1.397 0.162510
## Marg.adhesion
                      0.330694
                                 0.123462
                                             2.679 0.007395 **
## Epith.c.size
                      0.096797
                                 0.156568
                                             0.618 0.536415
## Bare.nuclei
                                 0.093865
                                             4.080 4.49e-05 ***
                      0.383015
## Bl.cromatin
                      0.447401
                                 0.171392
                                             2.610 0.009044 **
                                 0.112894
                                             1.887 0.059109 .
## Normal.nucleoli
                      0.213074
## Mitoses
                      0.538551
                                 0.325615
                                             1.654 0.098138 .
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
```

```
Null deviance: 884.35 on 682 degrees of freedom
## Residual deviance: 102.90 on 673 degrees of freedom
## AIC: 122.9
##
## Number of Fisher Scoring iterations: 8
At \alpha = 0.05 the following appear significant:
    Cl.thickness Marg.adhesion Bare.nuclei Bl.cromatin
glm2 = glm(Class ~ Cl.thickness + Marg.adhesion +
             Bare.nuclei + Bl.cromatin,
           data=BreastCancer,family=binomial)
summary(glm2)
##
## Call:
## glm(formula = Class ~ Cl.thickness + Marg.adhesion + Bare.nuclei +
       Bl.cromatin, family = binomial, data = BreastCancer)
##
## Deviance Residuals:
##
      Min
               1Q
                     Median
                                   3Q
                                           Max
## -3.6964 -0.1451 -0.0609
                              0.0232
                                        2.4476
##
## Coefficients:
                 Estimate Std. Error z value Pr(>|z|)
##
## (Intercept)
                -10.11370
                             1.03264 -9.794 < 2e-16 ***
## Cl.thickness 0.81166
                              0.12585 6.450 1.12e-10 ***
## Marg.adhesion 0.43412
                              0.11403 3.807 0.000141 ***
## Bare.nuclei
                  0.48136
                              0.08816
                                       5.460 4.76e-08 ***
## Bl.cromatin
                                      4.616 3.90e-06 ***
                  0.70154
                              0.15196
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
       Null deviance: 884.35 on 682 degrees of freedom
## Residual deviance: 125.77 on 678 degrees of freedom
## AIC: 135.77
##
## Number of Fisher Scoring iterations: 8
library(caret)
featurePlot(x=BreastCancer[,c(1,4,6,7)], y=BreastCancer[,10],
            plot="density",
            scales=list(x=list(relation="free"),
                        y=list(relation="free")),
            auto.key=list(columns=3))
## Warning in draw.key(simpleKey(...), draw = FALSE): not enough rows for
```

columns





```
BreastCancer.test=BreastCancer[-BreastCancer.train,] # test
dim(BreastCancer.test)
## [1] 273 10
Class.test=BreastCancer$Class[-BreastCancer.train]
glm.fits=glm(Class ~ Cl.thickness + Marg.adhesion +
             Bare.nuclei + Bl.cromatin,
           data=BreastCancer,family=binomial, subset=BreastCancer.train)
glm.probs = predict(glm.fits, BreastCancer.test, type = "response")
glm.pred=rep("benign",273)
glm.pred[glm.probs >.5]="malignant"
table(glm.pred, Class.test)
##
              Class.test
## glm.pred
               benign malignant
                  176
##
    benign
     malignant
                             84
```

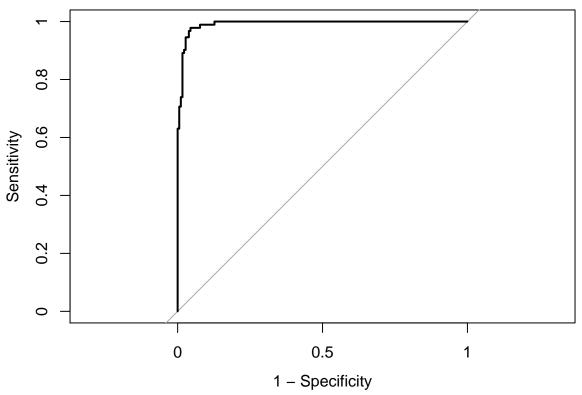
[1] 0.04761905

[1] 0.952381

mean(glm.pred == Class.test)

mean(glm.pred != Class.test)

```
library(pROC)
```



auc(roc.glm.train)

Area under the curve: 0.9917

Logistic has 95% correct response for test