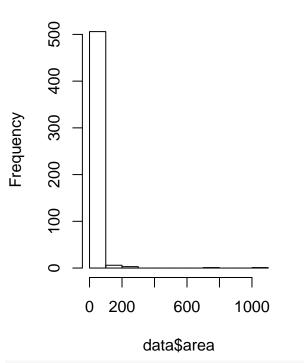
# Forest Fire Project Part 1

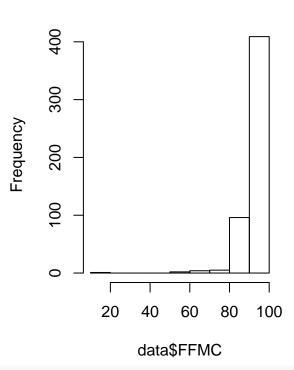
Shi Fan Jin, Esther Law, Changning Liu November 23, 2018

```
#clean dataset
par(mfrow=c(1,2))
hist(data$area)
hist(data$FFMC)
```

## Histogram of data\$area

# Histogram of data\$FFMC



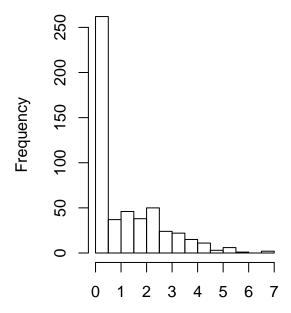


```
data$area=log(data$area+1)
hist(data$area)
data$FFMC=data$FFMC^13
data=data[-which.max(data$ISI),]
data=data[,-12]
summary(data)
```

```
##
          X
                                       month
                                                            day
##
           :1.000
                            :2.0
                                   Length:516
                                                       Length:516
    Min.
                     Min.
    1st Qu.:3.000
##
                     1st Qu.:4.0
                                   Class : character
                                                        Class : character
                                   Mode :character
                                                       Mode :character
##
    Median :4.000
                     Median:4.0
##
    Mean
           :4.665
                     Mean
                            :4.3
    3rd Qu.:7.000
                     3rd Qu.:5.0
##
           :9.000
                            :9.0
##
    Max.
                     Max.
         FFMC
                              DMC
                                                 DC
                                                                 ISI
##
##
           :3.419e+16
                                                     7.9
                                                                   : 0.000
   Min.
                         Min.
                                : 1.10
                                           Min.
                                                            Min.
    1st Qu.:2.616e+25
                         1st Qu.: 67.03
                                           1st Qu.:440.1
                                                            1st Qu.: 6.475
   Median :3.196e+25
                         Median :108.30
                                           Median :664.2
                                                            Median : 8.400
```

```
##
    Mean
            :3.178e+25
                         Mean
                                 :110.90
                                            Mean
                                                    :548.6
                                                             Mean
                                                                     : 8.930
    3rd Qu.:3.839e+25
##
                          3rd Qu.:142.40
                                            3rd Qu.:713.9
                                                             3rd Qu.:10.725
            :6.043e+25
##
    Max.
                         Max.
                                 :291.30
                                            Max.
                                                    :860.6
                                                             Max.
                                                                     :22.700
                           RH
                                             wind
##
         temp
                                                              area
##
    Min.
           : 2.20
                     Min.
                             : 15.00
                                       Min.
                                               :0.400
                                                         Min.
                                                                 :0.0000
                     1st Qu.: 32.75
##
    1st Qu.:15.50
                                        1st Qu.:2.700
                                                         1st Qu.:0.0000
    Median :19.30
                     Median: 41.50
                                        Median :4.000
                                                         Median: 0.4252
           :18.89
                            : 44.29
                                               :4.017
                                                                 :1.1132
##
    Mean
                     Mean
                                        Mean
                                                         Mean
    3rd Qu.:22.80
                     3rd Qu.: 53.00
                                        3rd Qu.:4.900
                                                         3rd Qu.:2.0245
##
    Max.
            :33.30
                     Max.
                             :100.00
                                        Max.
                                               :9.400
                                                                 :6.9956
                                                         Max.
```

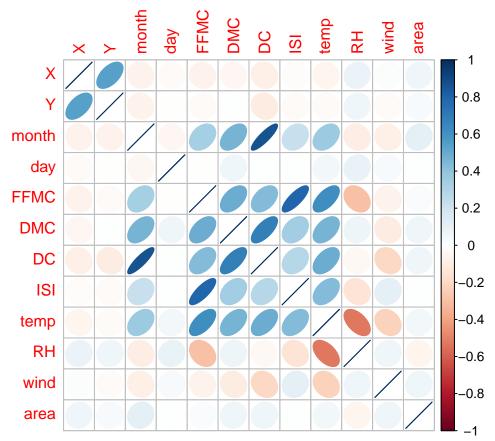
#### Histogram of data\$area



#### data\$area

```
#give numbers to categorical variables
num.data=data
num.data$month=gsub('jan', 1, num.data$month)
num.data$month=gsub('feb', 2, num.data$month)
num.data$month=gsub('mar', 3, num.data$month)
num.data$month=gsub('apr', 4, num.data$month)
num.data$month=gsub('may', 5, num.data$month)
num.data$month=gsub('jun', 6, num.data$month)
num.data$month=gsub('jul', 7, num.data$month)
num.data$month=gsub('aug', 8, num.data$month)
num.data$month=gsub('sep', 9, num.data$month)
num.data$month=gsub('oct', 10, num.data$month)
num.data$month=gsub('nov', 11, num.data$month)
num.data$month=gsub('dec', 12, num.data$month)
num.data$day=gsub('mon', 1, num.data$day)
num.data$day=gsub('tue', 2, num.data$day)
num.data$day=gsub('wed', 3, num.data$day)
num.data$day=gsub('thu', 4, num.data$day)
num.data$day=gsub('fri', 5, num.data$day)
```

```
num.data$day=gsub('sat', 6, num.data$day)
num.data$day=gsub('sun', 7, num.data$day)
num.data$day=as.numeric(num.data$day)
num.data$month=as.numeric(num.data$month)
num.cor=cor(num.data)
corrplot(num.cor, method = 'ellipse')
```



pairs(num.data)

```
2 6
                                    0 250
                                                 0 15
                                                               20 100
                                                                            0 4
                        day
                              FFMC
                                     DMC
                                                         temp
                                                                       wind
                                                                             area
                 2 8
   2 8
                            0e+00
                                                         5 25
                                           0
                                             800
                                                                      2 8
#make binary variables for categorical data
jan=rep(0,516)
feb=rep(0,516)
mar=rep(0,516)
apr=rep(0,516)
may=rep(0,516)
jun=rep(0,516)
jul=rep(0,516)
```

```
aug=rep(0,516)
sep=rep(0,516)
oct=rep(0,516)
nov=rep(0,516)
dec=rep(0,516)
for(i in 1:516){
  if(data$month[i] == 'jan'){jan[i]=1}
  else if(data$month[i] == 'feb'){feb[i] =1}
  else if(data$month[i] == 'mar') {mar[i] = 1}
  else if(data$month[i]=='apr'){apr[i]=1}
  else if(data$month[i] == 'may') {may[i] =1}
  else if(data$month[i]=='jun'){jun[i]=1}
  else if(data$month[i]=='jul'){jul[i]=1}
  else if(data$month[i] == 'aug'){aug[i] = 1}
  else if(data$month[i]=='sep'){sep[i]=1}
  else if(data$month[i] == 'oct') {oct[i] = 1}
  else if(data$month[i] == 'nov') {nov[i] = 1}
  else if(data$month[i] == 'dec') {dec[i] =1}
}
mon=rep(0,516)
tue=rep(0,516)
```

```
wed=rep(0,516)
thu=rep(0,516)
fri=rep(0,516)
sat=rep(0,516)
sun=rep(0,516)
for(i in 1:516){
 if (data$day[i] == 'mon') {mon[i] =1}
 else if(data$day[i]=='tue'){tue[i]=1}
 else if(data$day[i] == 'wed') {wed[i] =1}
 else if(data$day[i]=='thu'){thu[i]=1}
 else if(data$day[i]=='fri'){fri[i]=1}
 else if(data$day[i]=='sat'){sat[i]=1}
 else if(data$day[i]=='sun'){sun[i]=1}
data=data[,-(3:4)]
data=data.frame(data[,1:10], jan,feb,mar,apr,may,jun,jul,aug,sep,oct,nov,dec,mon,tue,wed,thu,fri,sat,su
train=sample(1:516,344)
#try model selection methods
min.model=glm(area~1, data=data[train,])
biggest=formula(glm(area~., data=data[train,]))
fwd.model=step(min.model, direction = 'forward', scope=biggest)
## Start: AIC=1194.97
## area ~ 1
##
##
         Df Deviance
                       ATC
## + dec
         1 629.17 1189.9
## + DC
          1 636.23 1193.8
## + DMC 1 637.21 1194.3
## + X
          1 637.88 1194.7
## + sep 1 637.97 1194.7
## <none>
              642.20 1195.0
## + jun
         1 638.55 1195.0
          1 638.95 1195.2
## + mar
          1 639.89 1195.7
## + jan
## + Y
          1 640.06 1195.8
## + temp 1 640.43 1196.0
## + wind 1
              640.67 1196.2
          1
## + may
              641.01 1196.3
## + FFMC 1
              641.31 1196.5
## + apr 1
             641.38 1196.5
         1 641.62 1196.7
## + oct
## + thu 1 641.66 1196.7
## + jul 1 641.71 1196.7
## + RH
          1 641.85 1196.8
## + wed 1
             641.86 1196.8
## + tue 1 641.90 1196.8
## + feb 1 641.91 1196.8
## + sat 1 641.98 1196.8
## + aug 1 642.01 1196.9
```

```
1 642.13 1196.9
## + sun
## + ISI
        1 642.14 1196.9
## + fri 1 642.19 1197.0
## + mon
          1 642.20 1197.0
##
## Step: AIC=1189.92
## area ~ dec
##
##
         Df Deviance
                       AIC
## + DMC
             620.98 1187.4
         1
## + DC
          1
              621.27 1187.6
              622.75 1188.4
## + temp 1
          1
              623.55 1188.8
## + sep
              625.27 1189.8
## + X
          1
## <none>
              629.17 1189.9
              625.83 1190.1
## + jun
          1
## + FFMC 1
              626.11 1190.2
## + mar
              626.45 1190.4
          1
## + jan
              626.97 1190.7
          1
              627.70 1191.1
## + Y
          1
## + may
          1
              627.91 1191.2
## + thu
              628.35 1191.5
## + apr
              628.43 1191.5
          1
              628.47 1191.5
## + oct
          1
## + wed
          1 628.65 1191.6
## + jul
         1
             628.82 1191.7
## + feb
             628.97 1191.8
          1
## + tue
         1
              628.98 1191.8
## + RH
             628.99 1191.8
          1
## + ISI
             629.07 1191.9
         1
          1 629.07 1191.9
## + mon
## + sat
          1
             629.09 1191.9
## + sun
             629.10 1191.9
          1
## + fri
              629.10 1191.9
          1
## + wind 1
              629.15 1191.9
## + aug
          1
              629.16 1191.9
##
## Step: AIC=1187.42
## area ~ dec + DMC
##
##
         Df Deviance
## + X
         1 616.32 1186.8
             616.94 1187.2
## + sep
              620.98 1187.4
## <none>
## + jun
              618.09 1187.8
          1
              618.41 1188.0
## + aug
          1
              618.69 1188.1
## + temp 1
## + may
              618.93 1188.3
          1
              619.07 1188.3
## + oct
          1
## + Y
              619.20 1188.4
          1
## + DC
          1
              619.60 1188.7
## + jan
              619.75 1188.7
         1
## + wed 1
              620.24 1189.0
## + thu 1 620.43 1189.1
```

```
## + RH
              620.57 1189.2
## + ISI
          1
              620.64 1189.2
## + tue
             620.70 1189.3
## + FFMC 1
              620.71 1189.3
## + mar
          1
              620.80 1189.3
## + feb
          1
              620.80 1189.3
## + jul
         1
              620.83 1189.3
## + sun
              620.84 1189.3
          1
## + apr
          1
              620.84 1189.3
## + wind 1
             620.92 1189.4
## + fri
          1
             620.94 1189.4
## + sat
              620.95 1189.4
          1
## + mon
              620.98 1189.4
##
## Step: AIC=1186.83
## area ~ dec + DMC + X
##
##
         Df Deviance
                        AIC
## + sep 1
            612.00 1186.4
              612.47 1186.7
## + jun
## <none>
              616.32 1186.8
## + temp 1
              613.65 1187.3
              614.08 1187.6
## + aug
          1
              614.31 1187.7
## + may
          1
         1 614.67 1187.9
## + oct
## + DC
          1 614.75 1188.0
## + wed
         1 615.28 1188.2
## + jan
              615.37 1188.3
          1
## + RH
              615.60 1188.4
          1
## + FFMC 1
              615.78 1188.5
## + thu
          1 615.86 1188.6
## + tue
          1
              615.92 1188.6
## + ISI
             616.08 1188.7
## + jul
             616.11 1188.7
          1
              616.14 1188.7
## + apr
          1
## + fri
          1
              616.20 1188.8
## + mar
          1
              616.24 1188.8
## + wind 1
              616.25 1188.8
              616.25 1188.8
## + sun
          1
## + mon
          1 616.26 1188.8
## + feb
          1
              616.28 1188.8
              616.29 1188.8
## + sat
          1
## + Y
          1
              616.29 1188.8
##
## Step: AIC=1186.4
## area ~ dec + DMC + X + sep
##
##
         Df Deviance
                        AIC
## <none>
              612.00 1186.4
## + jun
              609.07 1186.8
          1
## + temp 1
              609.35 1186.9
## + may
              609.73 1187.1
          1
## + oct
          1
              609.79 1187.2
## + jan 1 611.19 1188.0
```

```
611.23 1188.0
## + wed
          1
## + tue
          1
             611.40 1188.1
             611.44 1188.1
## + RH
## + FFMC 1 611.46 1188.1
## + thu
              611.55 1188.2
## + wind 1
             611.70 1188.2
## + Y
             611.82 1188.3
          1
## + feb
          1 611.83 1188.3
## + mon
          1 611.87 1188.3
## + apr
          1 611.89 1188.3
## + ISI
         1 611.91 1188.4
## + sun
          1 611.96 1188.4
## + mar
         1
             611.97 1188.4
## + jul
         1
             611.99 1188.4
## + aug
             611.99 1188.4
          1
## + fri
          1
              611.99 1188.4
## + sat
              612.00 1188.4
          1
## + DC
              612.00 1188.4
summary(fwd.model)
##
## Call:
## glm(formula = area ~ dec + DMC + X + sep, data = data[train,
      ])
##
## Deviance Residuals:
      Min
               1Q
                    Median
                                  30
## -1.7275 -1.0296 -0.6187
                            0.7914
                                      5.2285
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
                                    2.134
## (Intercept) 0.463222
                        0.217028
                                           0.0335 *
              1.880864
                        0.614836
                                    3.059
                                          0.0024 **
## dec
                                    2.007 0.0456 *
## DMC
              0.002302
                        0.001147
## X
              0.051585
                                    1.655
                                           0.0989 .
                         0.031172
              0.241941
                         0.156250
                                    1.548
                                           0.1225
## sep
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for gaussian family taken to be 1.805297)
      Null deviance: 642.2 on 343 degrees of freedom
## Residual deviance: 612.0 on 339 degrees of freedom
## AIC: 1186.4
## Number of Fisher Scoring iterations: 2
full.model=glm(area~.,data=data[train,])
back.model=step(full.model, direction='backward', trace=T)
## Start: AIC=1216.56
## area ~ X + Y + FFMC + DMC + DC + ISI + temp + RH + wind + jan +
##
      feb + mar + apr + may + jun + jul + aug + sep + oct + nov +
##
      dec + mon + tue + wed + thu + fri + sat + sun
```

```
##
##
## Step: AIC=1216.56
## area \sim X + Y + FFMC + DMC + DC + ISI + temp + RH + wind + jan +
      feb + mar + apr + may + jun + jul + aug + sep + oct + nov +
##
       dec + mon + tue + wed + thu + fri + sat
##
##
## Step: AIC=1216.56
  area ~ X + Y + FFMC + DMC + DC + ISI + temp + RH + wind + jan +
      feb + mar + apr + may + jun + jul + aug + sep + oct + nov +
##
      mon + tue + wed + thu + fri + sat
##
##
## Step: AIC=1216.56
## area \sim X + Y + FFMC + DMC + DC + ISI + temp + RH + wind + jan +
##
      feb + mar + apr + may + jun + jul + aug + sep + oct + mon +
##
      tue + wed + thu + fri + sat
##
##
         Df Deviance
                         AIC
## - sat
           1
              591.29 1214.6
## - mon
           1
               591.30 1214.6
               591.36 1214.6
## - fri
           1
## - Y
           1
               591.41 1214.6
## - FFMC 1
               591.47 1214.7
## - wed
           1
               591.51 1214.7
## - wind 1
               591.85 1214.9
               591.99 1215.0
## - tue
           1
## - thu
               592.02 1215.0
         1
## - ISI
         1
               592.04 1215.0
               593.73 1216.0
## - RH
           1
## - DC
           1
               593.76 1216.0
## - oct
           1
              593.95 1216.1
## - X
              594.41 1216.4
           1
## <none>
               591.29 1216.6
               595.39 1216.9
## - may
           1
## - DMC
           1
               596.60 1217.6
               596.72 1217.7
## - sep
           1
          1
               597.28 1218.0
## - temp
               602.41 1221.0
## - jan
           1
## - aug
               602.48 1221.0
           1
## - apr
               604.46 1222.1
           1
## - feb
          1
               605.28 1222.6
## - jul
         1
               608.04 1224.2
## - mar
               609.67 1225.1
         1
               614.50 1227.8
## - jun
           1
##
## Step: AIC=1214.56
## area \sim X + Y + FFMC + DMC + DC + ISI + temp + RH + wind + jan +
##
      feb + mar + apr + may + jun + jul + aug + sep + oct + mon +
##
      tue + wed + thu + fri
##
         Df Deviance
##
                         ATC
## - mon 1 591.31 1212.6
```

```
591.37 1212.6
## - fri
           1
## - Y
           1
               591.41 1212.6
## - FFMC
          1
               591.47 1212.7
               591.56 1212.7
## - wed
           1
## - wind 1
               591.85 1212.9
## - ISI
               592.04 1213.0
           1
## - tue
           1
               592.13 1213.0
## - thu
               592.18 1213.1
           1
## - RH
           1
               593.73 1214.0
## - DC
           1
               593.76 1214.0
## - oct
           1
               593.95 1214.1
               594.43 1214.4
## - X
           1
## <none>
               591.29 1214.6
               595.41 1215.0
## - may
           1
## - DMC
               596.60 1215.6
           1
## - sep
           1
               596.72 1215.7
               597.28 1216.0
## - temp
           1
## - jan
           1
               602.44 1219.0
## - aug
               602.48 1219.0
           1
## - apr
           1
               604.47 1220.1
               605.30 1220.6
## - feb
           1
## - jul
           1
               608.08 1222.2
## - mar
               609.75 1223.1
           1
## - jun
           1
               614.50 1225.8
##
## Step: AIC=1212.57
## area \sim X + Y + FFMC + DMC + DC + ISI + temp + RH + wind + jan +
      feb + mar + apr + may + jun + jul + aug + sep + oct + tue +
##
       wed + thu + fri
##
##
          Df Deviance
                         AIC
## - fri
           1
               591.38 1210.6
## - Y
           1
               591.43 1210.6
## - FFMC
               591.50 1210.7
          1
## - wed
           1
               591.63 1210.8
## - wind 1
               591.85 1210.9
## - ISI
           1
               592.07 1211.0
## - tue
           1
               592.15 1211.1
## - thu
           1
               592.20 1211.1
## - RH
               593.73 1212.0
           1
## - DC
               593.77 1212.0
           1
## - oct
               594.02 1212.2
           1
               594.51 1212.4
## - X
## <none>
               591.31 1212.6
## - may
               595.45 1213.0
           1
               596.60 1213.6
## - DMC
           1
               596.81 1213.8
## - sep
           1
               597.30 1214.0
## - temp
           1
## - jan
           1
               602.58 1217.1
## - aug
           1
               602.63 1217.1
## - apr
               604.55 1218.2
           1
## - feb
           1
               605.31 1218.6
## - jul
           1
               608.18 1220.2
               609.77 1221.2
## - mar
           1
```

```
## - jun 1 614.57 1223.8
##
## Step: AIC=1210.61
## area \sim X + Y + FFMC + DMC + DC + ISI + temp + RH + wind + jan +
       feb + mar + apr + may + jun + jul + aug + sep + oct + tue +
##
       wed + thu
##
          Df Deviance
##
                         AIC
## - Y
           1
               591.50 1208.7
## - FFMC
          1
               591.57 1208.7
## - wed
           1
               591.78 1208.8
## - wind 1
               591.95 1208.9
## - ISI
           1
               592.10 1209.0
## - tue
           1
               592.15 1209.1
## - thu
           1
               592.20 1209.1
## - RH
           1
               593.78 1210.0
## - DC
           1
               593.81 1210.0
## - oct
           1
               594.10 1210.2
## - X
               594.54 1210.5
           1
## <none>
               591.38 1210.6
## - may
           1
               595.45 1211.0
## - DMC
           1
               596.69 1211.7
               596.84 1211.8
## - sep
           1
           1
               597.33 1212.1
## - temp
## - jan
               602.62 1215.1
           1
## - aug
           1
               602.68 1215.1
## - apr
               604.55 1216.2
           1
               605.32 1216.6
## - feb
           1
## - jul
           1
               608.18 1218.2
               609.77 1219.2
## - mar
           1
## - jun
           1
               614.57 1221.8
##
## Step: AIC=1208.68
## area \sim X + FFMC + DMC + DC + ISI + temp + RH + wind + jan + feb +
##
       mar + apr + may + jun + jul + aug + sep + oct + tue + wed +
##
       thu
##
##
          Df Deviance
                         AIC
## - FFMC 1
               591.69 1206.8
## - wed
           1
               591.87 1206.9
## - wind 1
               592.03 1207.0
## - ISI
           1
               592.21 1207.1
               592.26 1207.1
## - tue
           1
## - thu
           1
               592.32 1207.2
## - RH
               593.98 1208.1
           1
## - DC
               594.07 1208.2
           1
               594.30 1208.3
## - oct
           1
               591.50 1208.7
## <none>
## - may
           1
               595.81 1209.2
## - DMC
           1
               597.02 1209.9
## - X
           1
               597.05 1209.9
## - sep
           1
               597.09 1209.9
## - temp
           1
               597.63 1210.2
## - jan
           1
               602.91 1213.3
```

```
603.08 1213.3
## - aug
           1
               605.15 1214.5
## - apr
           1
## - feb
           1
               605.87 1214.9
               608.79 1216.6
## - jul
           1
## - mar
           1
               610.51 1217.6
           1
               615.45 1220.3
## - jun
## Step: AIC=1206.8
## area ~ X + DMC + DC + ISI + temp + RH + wind + jan + feb + mar +
##
       apr + may + jun + jul + aug + sep + oct + tue + wed + thu
##
##
          Df Deviance
                         AIC
               592.07 1205.0
## - wed
           1
               592.16 1205.1
## - wind
          1
## - ISI
           1
               592.26 1205.1
## - tue
           1
               592.45 1205.2
           1
               592.64 1205.3
## - thu
## - RH
               594.12 1206.2
## - DC
               594.31 1206.3
           1
               594.41 1206.4
## - oct
## <none>
               591.69 1206.8
## - may
               596.04 1207.3
               597.13 1207.9
## - X
           1
           1
               597.24 1208.0
## - sep
               597.80 1208.3
## - DMC
           1
## - temp
           1
               598.77 1208.9
## - aug
               603.28 1211.5
           1
               603.32 1211.5
## - jan
           1
               605.80 1212.9
## - apr
           1
## - feb
           1
               606.45 1213.3
## - jul
           1
               609.14 1214.8
## - mar
           1
               610.70 1215.7
## - jun
           1
               615.84 1218.5
##
## Step: AIC=1205.02
## area ~ X + DMC + DC + ISI + temp + RH + wind + jan + feb + mar +
##
       apr + may + jun + jul + aug + sep + oct + tue + thu
##
##
          Df Deviance
               592.58 1203.3
## - wind 1
## - ISI
               592.76 1203.4
           1
## - tue
               593.02 1203.6
           1
               593.23 1203.7
## - thu
           1
## - RH
           1
               594.47 1204.4
## - oct
               594.70 1204.5
           1
               594.77 1204.6
## - DC
           1
               592.07 1205.0
## <none>
## - may
               596.32 1205.5
           1
## - X
           1
               597.33 1206.1
## - sep
           1
               597.42 1206.1
## - DMC
           1
               598.33 1206.6
## - temp
           1
               599.08 1207.1
## - aug
           1
               603.45 1209.6
## - jan
           1
               603.56 1209.6
```

```
606.01 1211.0
## - apr
           1
## - feb
               606.64 1211.4
           1
               609.26 1212.9
## - jul
## - mar
               610.89 1213.8
           1
## - jun
           1
               616.02 1216.7
##
## Step: AIC=1203.31
## area ~ X + DMC + DC + ISI + temp + RH + jan + feb + mar + apr +
##
       may + jun + jul + aug + sep + oct + tue + thu
##
##
          Df Deviance
                         AIC
               593.01 1201.6
## - ISI
           1
               593.59 1201.9
## - tue
           1
## - thu
               593.71 1202.0
           1
## - RH
           1
               595.12 1202.8
## - DC
           1
               595.46 1203.0
## - oct
               595.72 1203.1
           1
## <none>
               592.58 1203.3
## - may
               597.44 1204.1
           1
## - X
           1
               597.79 1204.3
## - sep
           1
               598.88 1205.0
## - DMC
               599.15 1205.1
               599.33 1205.2
## - temp
           1
           1
               605.72 1208.9
## - aug
               606.20 1209.1
## - jan
           1
## - apr
           1
               608.30 1210.3
## - feb
               609.66 1211.1
           1
               612.82 1212.9
## - jul
          1
## - mar
          1
               613.99 1213.5
               620.03 1216.9
## - jun
           1
##
## Step: AIC=1201.56
## area \sim X + DMC + DC + temp + RH + jan + feb + mar + apr + may +
##
       jun + jul + aug + sep + oct + tue + thu
##
##
          Df Deviance
                         AIC
## - tue
           1
               593.97 1200.1
## - thu
           1
               594.19 1200.2
## - DC
           1
               595.64 1201.1
## - RH
               595.69 1201.1
           1
## <none>
               593.01 1201.6
## - oct
               596.54 1201.6
           1
               597.77 1202.3
## - may
           1
## - X
               598.20 1202.6
           1
## - DMC
               599.31 1203.2
           1
               599.56 1203.3
## - temp
           1
               600.06 1203.6
## - sep
           1
               606.37 1207.2
## - jan
           1
## - aug
           1
               607.64 1208.0
               608.51 1208.4
## - apr
           1
## - feb
               609.74 1209.1
           1
## - jul
           1
               613.98 1211.5
## - mar
           1
               614.34 1211.7
               621.10 1215.5
## - jun
           1
```

```
##
## Step: AIC=1200.12
## area ~ X + DMC + DC + temp + RH + jan + feb + mar + apr + may +
       jun + jul + aug + sep + oct + thu
##
          Df Deviance
##
                         AIC
## - thu
              594.89 1198.7
## - RH
               596.49 1199.6
           1
## - DC
               596.55 1199.6
## <none>
               593.97 1200.1
## - oct
           1
               597.53 1200.2
               598.76 1200.9
## - may
           1
## - X
           1
               598.99 1201.0
               600.01 1201.6
## - DMC
           1
## - temp
           1
               600.26 1201.7
## - sep
           1
               601.01 1202.2
               607.45 1205.8
## - jan
           1
## - aug
           1
               608.39 1206.4
## - apr
               609.58 1207.0
           1
## - feb
          1
               610.50 1207.6
## - jul
         1
               614.60 1209.9
## - mar
         1
               615.26 1210.2
               622.10 1214.0
## - jun
           1
##
## Step: AIC=1198.65
## area ~ X + DMC + DC + temp + RH + jan + feb + mar + apr + may +
##
       jun + jul + aug + sep + oct
##
          Df Deviance
##
                         AIC
## - RH
               597.04 1197.9
           1
               597.41 1198.1
## - DC
           1
## <none>
               594.89 1198.7
               598.40 1198.7
## - oct
           1
               599.50 1199.3
## - may
           1
## - X
           1
               600.10 1199.7
## - temp 1
               600.83 1200.1
## - DMC
               601.19 1200.3
## - sep
           1
               601.69 1200.6
## - jan
           1
               608.02 1204.2
               608.90 1204.7
## - aug
           1
## - apr
               609.96 1205.3
           1
## - feb
               610.95 1205.8
          1
          1
               615.07 1208.1
## - jul
## - mar
         1
               615.68 1208.5
## - jun
          1
               622.36 1212.2
##
## Step: AIC=1197.89
## area ~ X + DMC + DC + temp + jan + feb + mar + apr + may + jun +
##
       jul + aug + sep + oct
##
##
          Df Deviance
                         AIC
## - DC
           1 599.40 1197.2
## - oct
           1
               599.50 1197.3
## - may
         1
               600.08 1197.6
```

```
597.04 1197.9
## <none>
## - temp 1
             601.31 1198.3
## - sep
              602.15 1198.8
## - X
              602.67 1199.1
           1
## - DMC
           1
              605.16 1200.5
              608.07 1202.2
## - jan
           1
## - aug
              608.90 1202.7
           1
              610.27 1203.4
## - apr
           1
## - feb
          1
              610.97 1203.8
## - jul
         1
              615.60 1206.4
## - mar
         1
              615.88 1206.6
              622.95 1210.5
## - jun
          1
##
## Step: AIC=1197.25
## area ~ X + DMC + temp + jan + feb + mar + apr + may + jun + jul +
##
      aug + sep + oct
##
##
          Df Deviance
                        AIC
## - may
           1 601.02 1196.2
              599.40 1197.2
## <none>
## - temp 1
              603.69 1197.7
## - X
           1
              604.72 1198.3
## - DMC
              605.27 1198.6
           1
## - jan
          1
              608.24 1200.3
              608.45 1200.4
## - oct
          1
## - apr
          1
              610.35 1201.5
## - feb
              611.51 1202.1
          1
              616.19 1204.8
## - sep
         1
## - mar
         1
              617.58 1205.5
              618.25 1205.9
## - jul
         1
## - aug
          1
              620.20 1207.0
## - jun
           1
              623.22 1208.7
##
## Step: AIC=1196.18
## area ~ X + DMC + temp + jan + feb + mar + apr + jun + jul + aug +
##
      sep + oct
##
##
          Df Deviance
                        AIC
## <none>
              601.02 1196.2
## - temp 1
              604.67 1196.3
## - X
           1
              606.33 1197.2
## - DMC
              606.88 1197.5
           1
         1
              608.45 1198.4
## - jan
              608.46 1198.4
## - oct
         1
## - apr
              610.35 1199.5
          1
              611.62 1200.2
## - feb
           1
              617.18 1203.3
## - sep
           1
              618.75 1204.2
## - mar
           1
## - jul
           1
              619.20 1204.4
               621.67 1205.8
## - aug
           1
           1
              624.43 1207.3
## - jun
summary(back.model)
```

##

```
## Call:
## glm(formula = area ~ X + DMC + temp + jan + feb + mar + apr +
     jun + jul + aug + sep + oct, data = data[train, ])
##
## Deviance Residuals:
                 Median
##
     Min
             1Q
                             3Q
                                    Max
## -2.5710 -1.0110 -0.5401 0.8511
                                 5.0487
##
## Coefficients:
             Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 1.899020 0.553211 3.433 0.000673 ***
             ## X
## DMC
            0.002904 0.001616 1.797 0.073318 .
## temp
            0.023329 0.016461 1.417 0.157368
            -2.191979 1.084102 -2.022 0.043988 *
## jan
            -1.580064   0.654024   -2.416   0.016237 *
## feb
            ## mar
## apr
            -1.927354   0.850269   -2.267   0.024050 *
            ## jun
            -2.018529   0.637968   -3.164   0.001700 **
## jul
            ## aug
            ## sep
            ## oct
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for gaussian family taken to be 1.815776)
##
##
     Null deviance: 642.20 on 343 degrees of freedom
## Residual deviance: 601.02 on 331 degrees of freedom
## AIC: 1196.2
##
## Number of Fisher Scoring iterations: 2
#original MSE
test=data[-train,]
fwd.pred=predict(fwd.model, newdata=test)
fwd.mse=mean((fwd.pred-test$area)^2)
fwd.mse
## [1] 2.067513
back.pred=predict(back.model, newdata=test)
back.mse=mean((back.pred-test$area)^2)
back.mse
## [1] 2.134971
#k-fold cross validation
glm.fit.1=glm(area~dec+DMC+X+sep, data=data)
cv.err.1=cv.glm(data,glm.fit.1)
cv.err.1
## $call
## cv.glm(data = data, glmfit = glm.fit.1)
##
## $K
```

```
## [1] 516
##
   $delta
   [1] 1.904671 1.904640
##
##
   $seed
##
     [1]
                  403
                              344
                                   1654269195 -1877109783
                                                             -961256264
##
     [6]
          1403523942
                        124639233
                                    261424787
                                                1836448066
                                                             1034917620
##
    [11]
           -13630729
                        468718317
                                   1694379396
                                                1559298986
                                                             1935866133
##
    [16] -1450855505
                       2105396150
                                   1802260960
                                                1077391651
                                                              539731521
    [21]
           122505520
                        230898510 -1940184647
                                                1223031755
                                                           -1597886342
##
    [26] -1854140036 -1783225921
                                   1484611221
                                                1365746860
                                                            -346485118
##
          1206044253
                      1201793367
                                    956757054
                                                 350214264 -1324711077
    [31]
##
    [36] -1071776071 -1831283960
                                  1862871478
                                                1826141937
                                                              268853539
##
    [41]
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                                                -346768547
                                                             -463801004
##
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                                   -280700897
                                                 422985638
                                                             732086576
##
    [51]
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                       1128169969 -1024391392 -1032957506
                                                             -353082935
                                                              247650405
##
    [56] -1139485317
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##
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                                   -423589651 -1999189721
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##
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                                                           -1099348090
##
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                                                 269218004
                                                             1210153431
##
    [76]
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                                   -472446134
                                                 -15672651
                                                             -538858993
##
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                                                             -109108336
##
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                                   -195336533
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##
    [91]
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                                                 985204258
                                                              613283965
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##
          1188944360
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                                   1578975869
                                                -305972364
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                                   2043531000 -1557378522 -2033982655
   [136] -1166473005 -1243272062
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                                                 519478839
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##
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   [151] -1514890119 -1503646709 -1385642694
                                                 530830396 -1346935937
  [156]
##
          1552658645
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   [161]
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##
          1197209982
                                                             1482522568
##
   [166]
          1344742390
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## [226] -1013984872
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## [231] -1075363102
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## [236] -797919760 1826465220
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                                                 479382394
                                                            -180521552
```

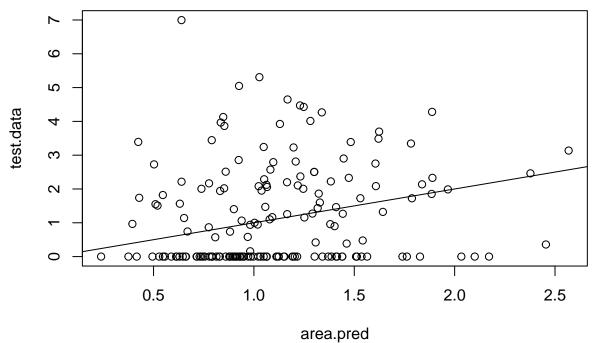
```
## [241]
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##
  Г246]
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##
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##
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                                                             774509986
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##
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##
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   [336]
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                       246260604
                                  1132269844 -1594365630
                                                             343599360
##
   [341] -1585484356
                       763185488 -1647048414
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cv.err.2=cv.glm(data,glm.fit.2)
cv.err.2
## $call
## cv.glm(data = data, glmfit = glm.fit.2)
##
## $K
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bag.area=randomForest(area~., data=data[train,], mtry=6, importance=TRUE)
area.pred=predict(bag.area, newdata=data[-train,])
test.data=data[-train,]$area
plot(area.pred, test.data)
abline(0,1)
```



mean((area.pred-test.data)^2) #1.943381 in the same range as before

```
## [1] 2.116
```

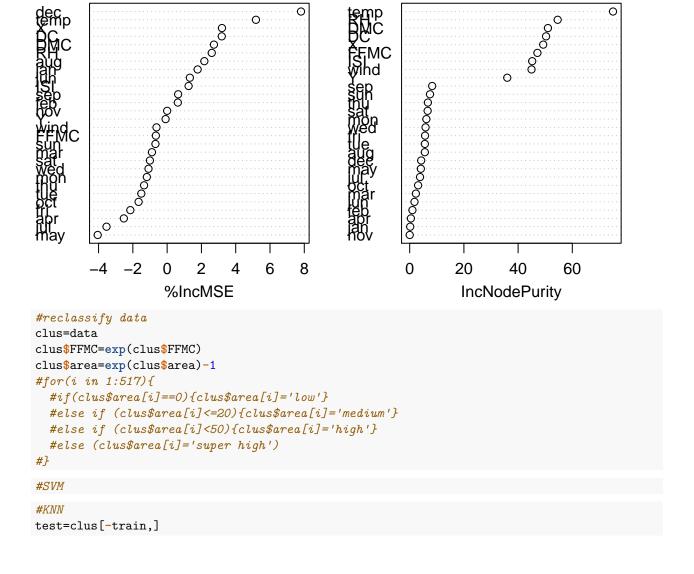
importance(bag.area)

#my models so far are crap. again lol.

## %IncMSE IncNodePurity ## X 3.19806573 49.2712713 ## Y -0.08928522 36.0009894 ## FFMC -0.65755976 47.1248016 ## DMC 2.72976225 51.0142787 ## DC 3.18589339 50.3125974 ## ISI 1.25127371 45.2035645 5.18021014 75.0268518 ## temp ## RH 2.60253154 54.6005124 ## wind -0.62013637 44.9548646 ## jan 1.77981456 0.1793389 ## feb 0.62355874 1.0006808 -0.88516752 2.2787578 ## mar -2.52477342 0.4332846 ## apr ## may -4.05006674 4.1118277 jun 1.32664757 1.7688555 ## jul -3.53558455 3.8122397

```
2.17042565
                         5.5823438
## aug
## sep
                         8.3010496
         0.64267700
        -1.66423243
                         3.1047610
  oct
         0.0000000
                         0.0000000
## nov
##
  dec
         7.80880209
                         4.2325123
        -1.18319622
                         6.1466122
## mon
        -1.50600633
                         5.5894805
## tue
        -1.08631231
                         5.8528253
##
  wed
##
  thu
        -1.34477981
                         6.7086144
        -2.14661875
                         5.6637627
## fri
## sat
        -1.00513486
                         6.6211796
        -0.68218425
                         7.4799297
## sun
varImpPlot(bag.area)
```

### bag.area



```
folds=function(x){
  knn.fire=knn(clus[train,c(4,5)], test[,c(4,5)], clus[train,]$area, k=x)
  least=mean(knn.fire==test$area)
  knn.fire=knn(clus[train,c(4,7)], test[,c(4,7)], clus[train,]$area, k=x)
  a=mean(knn.fire==test$area)
  if(a>least){least=a}
  knn.fire=knn(clus[train,c(4,8)], test[,c(4,8)], clus[train,] area, k=x)
  a=mean(knn.fire==test$area)
  if(a>least){least=a}
  knn.fire=knn(clus[train,c(4,19)], test[,c(4,19)], clus[train,]$area, k=x)
  a=mean(knn.fire==test$area)
  if(a>least){least=a}
  knn.fire=knn(clus[train,c(4,22)], test[,c(4,22)], clus[train,]$area, k=x)
  a=mean(knn.fire==test$area)
  if(a>least){least=a}
  knn.fire=knn(clus[train,c(5,7)], test[,c(5,7)], clus[train,]$area, k=x)
  a=mean(knn.fire==test$area)
  if(a>least){least=a}
  knn.fire=knn(clus[train,c(5,8)], test[,c(5,8)], clus[train,]$area, k=x)
  a=mean(knn.fire==test$area)
  if(a>least){least=a}
  knn.fire=knn(clus[train,c(5,19)], test[,c(5,19)], clus[train,]$area, k=x)
  a=mean(knn.fire==test$area)
  if(a>least){least=a}
  knn.fire=knn(clus[train,c(5,22)], test[,c(5,22)], clus[train,]$area, k=x)
  a=mean(knn.fire==test$area)
  if(a>least){least=a}
  knn.fire=knn(clus[train,c(7,8)], test[,c(7,8)], clus[train,]$area, k=x)
  a=mean(knn.fire==test$area)
  if(a>least){least=a}
  knn.fire=knn(clus[train,c(7,19)], test[,c(7,19)], clus[train,]$area, k=x)
  a=mean(knn.fire==test$area)
  if(a>least){least=a}
  knn.fire=knn(clus[train,c(7,22)], test[,c(7,22)], clus[train,]$area, k=x)
  a=mean(knn.fire==test$area)
  if(a>least){least=a}
  knn.fire=knn(clus[train,c(8,19)], test[,c(8,19)], clus[train,]$area, k=x)
  a=mean(knn.fire==test$area)
  if(a>least){least=a}
  knn.fire=knn(clus[train,c(8,22)], test[,c(8,22)], clus[train,]$area, k=x)
```

```
a=mean(knn.fire==test$area)
    if(a>least){least=a}
    knn.fire=knn(clus[train,c(19,22)], test[,c(19,22)], clus[train,]$area, k=x)
    a=mean(knn.fire==test$area)
    if(a>least){least=a}
    return(least)
}
sapply(1:20, folds)
## [1] 0.4651163 0.4651163 0.4651163 0.4651163 0.4651163 0.4651163 0.4651163 0.4651163 0.4651163 O.4651163 O.4651160 O.4651160
## [8] 0.4651163 0.4651163 0.4651163 0.4651163 0.4651163 0.4651163 0.4651163
## [15] 0.4651163 0.4651163 0.4651163 0.4651163 0.4651163
#which combo of variables?
x = 18
knn.fire=knn(clus[train,c(4,5)], test[,c(4,5)], clus[train,]$area, k=x)
mean(knn.fire==test$area)
## [1] 0.4651163
knn.fire=knn(clus[train,c(4,7)], test[,c(4,7)], clus[train,]$area, k=x)
mean(knn.fire==test$area)
## [1] 0.4651163
knn.fire=knn(clus[train,c(4,8)], test[,c(4,8)], clus[train,]$area, k=x)
mean(knn.fire==test$area)
## [1] 0.4651163
knn.fire=knn(clus[train,c(4,19)], test[,c(4,19)], clus[train,]$area, k=x)
mean(knn.fire==test$area)
## [1] 0.4651163
knn.fire=knn(clus[train,c(4,22)], test[,c(4,22)], clus[train,]$area, k=x)
mean(knn.fire==test$area)
## [1] 0.4651163
knn.fire=knn(clus[train,c(5,7)], test[,c(5,7)], clus[train,]$area, k=x)
mean(knn.fire==test$area)
## [1] 0.4651163
knn.fire=knn(clus[train,c(5,8)], test[,c(5,8)], clus[train,]$area, k=x)
mean(knn.fire==test$area)
## [1] 0.4651163
knn.fire=knn(clus[train,c(5,19)], test[,c(5,19)], clus[train,]$area, k=x)
mean(knn.fire==test$area)
## [1] 0.4651163
knn.fire=knn(clus[train,c(5,22)], test[,c(5,22)], clus[train,]$area, k=x)
mean(knn.fire==test$area)
```

```
## [1] 0.4651163
knn.fire=knn(clus[train,c(7,8)], test[,c(7,8)], clus[train,]$area, k=x)
mean(knn.fire==test$area)
## [1] 0.4651163
knn.fire=knn(clus[train,c(7,19)], test[,c(7,19)], clus[train,] area, k=x)
mean(knn.fire==test$area)
## [1] 0.4651163
knn.fire=knn(clus[train,c(7,22)], test[,c(7,22)], clus[train,]$area, k=x)
mean(knn.fire==test$area)
## [1] 0.4651163
knn.fire=knn(clus[train,c(8,19)], test[,c(8,19)], clus[train,]$area, k=x)
mean(knn.fire==test$area)
## [1] 0.4651163
knn.fire=knn(clus[train,c(8,22)], test[,c(8,22)], clus[train,]$area, k=x)
mean(knn.fire==test$area)
## [1] 0.4651163
knn.fire=knn(clus[train,c(19,22)], test[,c(19,22)], clus[train,]$area, k=x)
mean(knn.fire==test$area)
## [1] 0.4651163
```