

Appendix I: Figure Code

```
library(knitr)
# Set so that long lines in R will be wrapped:
opts_chunk$set(tidy.opts=list(width.cutoff=60),tidy=TRUE)
#-----
#
#   Plots doc
#
#-----

train = data.frame(read.csv("train.csv"))
test = data.frame(read.csv("test.csv"))

#-----
#   Figure 1
#-----
library(ggplot2)
library(dplyr)

train$month = factor(train$month
                     ,levels = c("jan", "feb", 'mar', 'apr', 'may', 'jun'
                                   , 'jul', 'aug','sep', 'oct', 'nov', 'dec'))
train$day = factor(train$day
                   , levels = c('sun','mon','tue','wed','thu','fri','sat'))
df1 = data.frame(train %>% group_by(month) %>% summarize(lmonth = n()))
df2 = data.frame(train %>% group_by(day) %>% summarize(lday = n()))
train$sqISI = sqrt(train$ISI)

p1<-ggplot(data=df1, aes(x=month, y = lmonth))
+ geom_bar(stat="identity", fill="orangered2")
+ theme_minimal()
+ labs(y = "Number of Fires",x = "Month", main = "")

pdf("month_bar.pdf")
p1
dev.off()

p2<-ggplot(data=df2, aes(x=day, y = lday))
+ geom_bar(stat="identity", fill="orangered2")
+ theme_minimal()
+ labs(y = "Number of Fires",x = "Day", main = "")

pdf("day_bar.pdf")
p2
dev.off()

#-----
#   Figure 2
#-----
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p3<-ggplot(data=train, aes(x = "",y=ISI))
+ geom_boxplot(fill="blue", alpha = 0.5)
+ theme_minimal()+ labs(y = "ISI",x = "", main = "")
+ coord_flip()

pdf("ISI_box.pdf")
p3
dev.off()

#-----
#      Figure 3
#-----

p4<-ggplot(data=train, aes(x =FFMC,y=sqISI))
+ geom_point(color="blue",alpha = 0.7)
+ theme_minimal()
+ labs(y = "Square Root ISI",x = "FFMC", main = "")

pdf("FFMC_ISI_scatter.pdf")
p4
dev.off()

#-----
#      Figure 5
#-----

#construct regression equation
f1 = formula(sqISI ~ temp + wind + summer + rainvnrain)
f2 = formula(sqISI ~ temp + wind + summer + rainvnrain + FFMC)

#build model matrix
X1 = model.matrix(f1,train)
X2 = model.matrix(f2,train)
Y = as.matrix(train$sqISI)

fit1 = glmnet::glmnet(X1, Y, alpha = 1)
fit2 = glmnet::glmnet(X2, Y, alpha = 1)

pdf("penalization_plots.pdf")
par(mfrow=c(1,2), mai = c(1, 0.5, 0.1, 0.1))
plot_glmnet(fit2, ylim = c(0,.6))
plot_glmnet(fit1, ylim = c(0,.6))
dev.off()

#-----
#      Figure 6
#-----

train = data.frame(train %>% group_by(tFFMC) %>% mutate(weight = n()))
m1 = lm(sqISI ~temp + wind + summer + rainvnrain, data = train)
m2 = lm(sqISI ~temp + wind + summer + rainvnrain, weights = weight
, data = train)
m3 = lm(sqISI ~ temp + wind + summer + rainvnrain+tFFMC

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      , data = train)
df = data.frame(
  r1 = as.vector(qqnorm(resid(m1), plot=F))
  , r2 = as.vector(qqnorm(resid(m2), plot=F))
  , r3 = as.vector(qqnorm(resid(m3), plot=F)))

library(gridExtra)
library(grid)
library(lattice)

p5 <- ggplot(m1, aes(qqnorm(.stdresid)[[1]], .stdresid))
+ geom_point(na.rm = TRUE, col = "steelblue", alpha = 0.7)
+ geom_abline()+xlab("Theoretical Quantiles")+ylab("Standardized Residuals")
+ ggtitle("No FFMC")+theme_bw() + coord_cartesian(ylim = c(-3,3))

p6 <- ggplot(m2, aes(qqnorm(.stdresid)[[1]], .stdresid))
+ geom_point(na.rm = TRUE, col = "steelblue", alpha = 0.7)
+ geom_abline()+xlab("Theoretical Quantiles")
+ ylab("Standardized Residuals")
+ ggtitle("Weighted FFMC")
+ theme_bw()
+ coord_cartesian(ylim = c(-3,3))

p7 <- ggplot(m2, aes(qqnorm(.stdresid)[[1]], .stdresid))
+ geom_point(na.rm = TRUE, col = "steelblue", alpha = 0.7)
+ geom_abline()+xlab("Theoretical Quantiles")+ylab("Standardized Residuals")
+ ggtitle("Covariate FFMC")
+ theme_bw()
+ coord_cartesian(ylim = c(-3,3))

pdf("FFMC-QQ.pdf")
grid.arrange(p5,p6,p7, nrow = 1, ncol = 3)
dev.off()

#-----
#      Figure 7
#-----

train = data.frame(train %>% group_by(tFFMC) %>% mutate(weight = n()))
m = lm(lgISI ~summer+ wind + temp+ rainvnrain
      ,data = train)

pdf("final_model_diag.pdf")
par(mfrow = c(2,2));plot(m)
dev.off()

pdf("final_avp.pdf")
car::avPlots(m)
dev.off()

#-----
#      Figure 8

```

```

#-----

#build final model
m1 = lm(sqISI ~ summer + wind + temp + rainvnrain
      ,data = train)

#1000 bootstrap samples for each \beta
B <- 1000
ResidualBootstrapM1 <-t(replicate(B, {
  yb <- fitted(m1) + resid(m1)[sample.int(nrow(train), replace = TRUE)]
  boot <- model.matrix(m1)
  coef(lm(yb ~ boot - 1))
}))

#look at beta distributions
hist(ResidualBootstrapM1[,1], xlab = "summer")
hist(ResidualBootstrapM1[,2], xlab = "wind")
hist(ResidualBootstrapM1[,3], xlab = "temp")
hist(ResidualBootstrapM1[,4], xlab = "rainvnrain")
df = data.frame(ResidualBootstrapM1)

p8 = ggplot(df, aes(x = bootsummer1))
+ geom_histogram(fill = "orangered2", color = "steelblue")
+ theme_bw()
+ labs(x = "Summer", y = "", main = "")
p9 = ggplot(df, aes(x = bootwind))
+ geom_histogram(fill = "orangered2", color = "steelblue")
+ theme_bw()
+ labs(x = "Wind", y = "")

p10 = ggplot(df, aes(x = boottemp))
+ geom_histogram(fill = "orangered2", color = "steelblue")
+ theme_bw()
+ labs(x = "Temperature", y = "")

p11 = ggplot(df, aes(x = bootrainvnrain1))
+ geom_histogram(fill = "orangered2", color = "steelblue")
+ theme_bw() + labs(x = "Rain", y = "")

pdf("boot.pdf")
grid.arrange(p8,p9,p10,p11, nrow = 2, ncol = 2)
dev.off()

#-----
#      Figure 9
#-----

#transform ISI
test$sqISI = sqrt(test$ISI)

#cast as factors
test$summer = as.factor(test$summer)

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test$rainvnrain = as.factor(test$rainvnrain)

#final_model
test_mod = lm(sqISI ~ summer + wind + temp + rainvnrain ,data = test)

plotdf <- data.frame(cbind(test$sqISI^2,test_mod$fitted.values^2) )
names(plotdf) <-c("ActualValues","FittedValues")
p12 = ggplot(plotdf, aes(x=FittedValues,y=ActualValues))
+ geom_point(col = "steelblue", alpha = .7)
+ geom_segment(aes(x=0,y=0,xend=15,yend=15),col="black")
+ theme_bw()

pdf("pred_plot.pdf")
p12
dev.off()

pdf("TestSetDiagnostics.pdf")
par(mfrow = c(2,2));plot(test_mod)
dev.off()

```