R code for "Modelling mosquito population in Alachua County"

Webscraping temperature

Webscraping precipitation

```
> #THE FOLLOWING SCRIPT TAKES RAINFALL DATA FROM WUNDERGROUND
> #THE NAs SHOW UP BECAUSE OF THIS MYSTERIOUS T
> library(pingr)
> #Establish start and end dates
> startDate <- "2008-03-01"
> nDays <- 2200
> #Set up URL
> linkPart1 <- "http://www.wunderground.com/history/airport/KGNV/"
> linkPart3 <- "/DailyHistory.html"</pre>
> ts <- as.data.frame(c(as.Date(startDate, format="%Y-%m-%d"),
                         as.Date(startDate, format="%Y-%m-%d")+1:(nDays-1)))
> colnames(ts) <- "date"
> ts$dateRec <- format(ts$date, format="%Y/%m/%d")</pre>
> #RAINFALL DATA
> ts$pui <- NA
> for (i in 1:nrow(ts)){
   linkPart2 <- ts$dateRec[i]</pre>
    link <- paste0(linkPart1, linkPart2, linkPart3)</pre>
   webPage <- readLines(link)</pre>
   webPage <- webPage[grep1(" <span class=\"nobr\"><span class=\"b\">", webPage) &
                      grepl("</span>&nbsp;in</span>", webPage)][1]
   ts$pui[i] <- as.numeric(gsub(paste0(" <span class=\"nobr\"><span class=\"b\">",
                                         "|", "</span>&nbsp;in</span>"),
                                  "".
                                  webPage))
+ }
> ts$rain <- ts$pui
> ts$pui <- NULL
> ts$rain[is.na(ts$rain)] <- 0</pre>
> #write.csv(ts, "C:/Users/BrewJR/Desktop/mosquito/rainFall2013/rain2008-2013.csv")
>
> ping(8)
> ######NOW FOR TEMPERATURE DATA
> #TEMPERATURE DATA (TAKES FOREVER)
> ts$temp <- NA
> for (i in 1:nrow(ts)){
    linkPart2 <- ts$dateRec[i]</pre>
   link <- pasteO(linkPart1, linkPart2, linkPart3)</pre>
   webPage <- readLines(link)</pre>
   webPage <- webPage[grep1(" <span class=\"nobr\"><span class=\"b\">", webPage) &
                          grepl("</span>&nbsp", webPage)][1]
   ts$temp <- as.numeric(gsub(paste0(" <span class=\"nobr\"><span class=\"b\">",
                                       "|", "</span>&nbsp;&deg;F</span>"), "", webPage))
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+ }
> ts$heat[is.na(ts$heat)] <- 0</pre>
> write.csv(ts, "E:/workingdirectory/mosquito/rainAndTemp/a_rain2008-2013.csv")
> ping(8)
> #BEGIN THE RAIN ANALYSIS MULTIYEAR FILE (RUNNING TOGETHER OVER WEEKEND)
> library(pingr)
> #READ IN THE RAIN TIME SERIES DATA [CREATED FROM WEBSCRAPING WUNDERGROUND]
> #READ IN MOSQUITO TIME SERIES DATA [CREATED FROM 2013 MOSQ SEASON SURVEIL]
> tsRain <- read.csv("C:/Users/BrewJR/Desktop/mosquito/rainFall2013/rain2008-2013.csv")
> tsMosq <- read.csv("C:/Users/BrewJR/Desktop/mosquito/simple.csv")
> tsTemp <- read.csv("C:/Users/BrewJR/Desktop/mosquito/rainFall2013/rainAndTemp2008-2013.csv
> #CONVERT DATES INTO R DATE OBJECTS
> tsRain$date <- as.Date(tsRain$date, format="%Y-%m-%d")
> tsMosq$date <- as.Date(tsMosq$date, format="%m/%d/%Y")</pre>
> tsTemp$date <- as.Date(tsTemp$date, format="%m/%d/%Y")
> #ADD MOSQUITOES (TOTAL AND VECTOR) TO RAINFALL
> tsRain$total <- NA
> for (i in tsMosq$date){
   tsRain$total[which(tsRain$date == i)] <-
    tsMosq$total[which(tsMosq$date == i)]
+ }
> tsRain$vector <- NA
> for (i in tsMosq$date){
   tsRain$vector[which(tsRain$date == i)] <-
    tsMosq$vector[which(tsMosq$date == i)]
+ }
> #ADD DAILY MEDIAN TEMPERATURE TO tsRain
> tsRain$temp <- NA
> for (i in tsRain$date){
   tsRain$temp[which(tsRain$date == i)] <-
    tsTemp$temp[which(tsTemp$date == i)]
```

```
> #ADD RAINFALL RANGES
> #Make columns for a range of 5-20 days old, plus 5-20 days older than that
> for (j in 5:20){
   for (k in 5:20){
     tsRain[,paste0("rain", j, ".", j+k)] <- NA
   }
+ }
> #Add rainfall for each of the columns
> for (j in colnames(tsRain)[grepl("rain", colnames(tsRain))][-1]){
   for (i in 30:nrow(tsRain)){
     tsRain[i,j] <-
       sum(tsRain$rain[which(tsRain$date <=</pre>
                            tsRain$date[i-min(as.numeric(unlist(strsplit(gsub("rain", "
                            tsRain$date[i-max(as.numeric(unlist(strsplit(gsub("rain", "'
+ }
> #ADD TEMPERATURE RANGES
> #Make columns for a range of 5-20 days old, plus 5-20 days older than that
> for (j in 5:20){
   for (k in 5:20){
     tsRain[,paste0("temp", j, ".", j+k)] <- NA
+ }
> #Add rainfall for each of the columns
> for (j in colnames(tsRain)[grepl("temp", colnames(tsRain))][-1]){
   for (i in 30:nrow(tsRain)){
     tsRain[i, i] <-
       sum(tsRain$temp[which(tsRain$date <=</pre>
                            tsRain$date[i-min(as.numeric(unlist(strsplit(gsub("temp", "
                            tsRain$date >=
                            tsRain$date[i-max(as.numeric(unlist(strsplit(gsub("temp", "'
   }
+ }
> #Test the r-squared for each column (RAIN ONLY)
> #Create a dataframe with the R-squared and correlation coefficient for each range
> pred <- as.data.frame(colnames(tsRain)[grepl("rain", colnames(tsRain))][-1])</pre>
> colnames(pred) <- "range"</pre>
> for (i in pred$range){
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mylm <- summary(lm(tsRain[,"total"] ~ tsRain[,i]))</pre>
  mycor <- cor(tsRain[,i], tsRain[,"total"], use="complete.obs")</pre>
  pred$r.squared[which(pred$range == i)] <- mylm$r.squared</pre>
  pred$cor[which(pred$range == i)] <- mycor</pre>
+ }
> pred <- pred[order(pred$r.squared),]</pre>
> #Select best predicition model
> best <- as.character(pred$range[which(pred$r.squared == max(pred$r.squared))])</pre>
> #Save it for use in Sweave (RDATA FILE)
> #save.image("C:/Users/BrewJR/Desktop/mosquito/rainFall2013/rainAndHeat2008-2013.RData")
> ping(8)
```

Merging rain/precip data and calculating date range values

```
> #THE FOLLOWING TAKES ABOUT 6 HOURS TO RUN.
> #NO NEED TO RUN AGAIN... OUTPUT INTO :
> #write.csv(ts2, "E:/workingdirectory/mosquito/rainAndTemp/rainAndTemp.csv")
> #save.image("E:/workingdirectory/mosquito/rainAndTemp/rainAndTemp.RData")
> library(pingr)
> #READ IN THE RAIN TIME SERIES DATA [CREATED FROM WEBSCRAPING WUNDERGROUND]
> #READ IN MOSQUITO TIME SERIES DATA [CREATED FROM 2013 MOSQ SEASON SURVEIL]
> tsRain <- read.csv("E:/workingdirectory/mosquito/rainAndTemp/a_rain2008-2013.csv")
> tsMosq <- read.csv("E:/workingdirectory/mosquito/simple.csv")
> tsTemp <- read.csv("E:/workingdirectory/mosquito/rainAndTemp/a_tsTemp2008-2013.csv")
> #CONVERT DATES INTO R DATE OBJECTS
> tsRain$date <- as.Date(tsRain$date, format="%Y-%m-%d")
> tsMosg$date <- as.Date(tsMosg$date, format="%m/%d/%Y")</pre>
> tsTemp$date <- as.Date(tsTemp$date, format="%Y-%m-%d")
> #CREATE A MASTER TS
> ts <- as.data.frame(tsRain$date)</pre>
> colnames(ts) <- "date"
> #ADD RAIN TO TS
> ts$rain <- tsRain$rain
> #ADD MOSQUITOES (TOTAL AND VECTOR) TO TS
> # (NOTE, THESE ARE MOSQUITOES PER TRAP)
> ts$total <- NA
> for (i in tsMosq$date){
   ts$total[which(ts$date == i)] <-
    tsMosq$total[which(tsMosq$date == i)]
+ }
> ts$vector <- NA
> for (i in tsMosq$date){
   ts$vector[which(ts$date == i)] <-
    tsMosq$vector[which(tsMosq$date == i)]
+ }
```

> #ADD MINIMUM TEMP TO TS

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> ts$minTemp <- NA
> for (i in ts$date){
   ts$minTemp[which(ts$date == i)] <-
    tsTemp$MinTemp[which(tsTemp$date == i)]
> ts$minTemp[which(ts$minTemp < -100)] <- NA
> #ADD MAXIMUM TEMP TO TS
> ts$maxTemp <- NA
> for (i in ts$date){
  ts$maxTemp[which(ts$date == i)] <-</pre>
    tsTemp$MaxTemp[which(tsTemp$date == i)]
+ }
> #ADD COLUMNS FOR RAIN AND MINTEMP RANGES
> ts2 <- ts
> #Make columns for a range of 5-20 days old, plus 5-20 days older than that
> for (j in 5:20){
  for (k in 5:20){
    ts2[,paste0("rain", j, ".", j+k)] <- NA
    ts2[,paste0("minTemp", j, ".", j+k)] <- NA
   }
+ }
> #ADD CUMULATIVE RAINFALL TO CORRESPONDING COLUMNS
> for (j in colnames(ts2)[grep1("rain", colnames(ts2))][-1]){
  for (i in 30:nrow(ts2)){
    ts2[i,j] <-
     sum(ts2$rain[which(ts2$date <=</pre>
                     ts2$date[i-min(as.numeric(unlist(strsplit(gsub("rain", "", j),
                     ts2$date[i-max(as.numeric(unlist(strsplit(gsub("rain", "", j),
+ }
> #write.csv(ts2, "E:/workingdirectory/mosquito/rainAndTemp/rainOnly.csv")
> #ADD MINIMUM MINTEMP FOR EACH MINTEMP COLUMN COLUMN
```

Linear modelling

```
> library(pingr)
> # READ IN DATA FOR TEMP AND RAINFALL FOR LAST 6 YEARS
> # THIS DATA ALREADY HAS RANGES CALCULATED INTO IT (SEE COMBINERAINANDTEMP.R)
> ts <- read.csv("E:/workingdirectory/mosquito/rainAndTemp/b_rainAndTemp.csv")
> #### CREATE A VECTOR OF ALL THE POSSIBLE COMBINATIONS
> #OF MIN TEMP RANGES AND RAINFALL RANGES
> rainPosibs <- rep(colnames(ts)[grepl("rain", colnames(ts))][-1],</pre>
              length(colnames(ts)[grepl("minTemp", colnames(ts))][-1]))
> minTempPosibs <- sort(rep(colnames(ts)[grep1("minTemp", colnames(ts))][-1],
                 length(colnames(ts)[grepl("rain", colnames(ts))][-1])))
> posibs <- paste0(rainPosibs, "AND", minTempPosibs)</pre>
> #CREATE A DATA FRAME FROM MY POSIBS VECTOR
> # THIS IS WHERE I'LL PUT MY MODEL QUALITY INDICATORS
> pred <- as.data.frame(posibs)</pre>
> #Test the r-squared for each column (RAIN ONLY)
> pred$r.squared <- NA
> for (i in 1:length(pred$posibs)){
  mylm <- summary(lm(ts[,"total"] ~</pre>
                  ts[,unlist(strsplit(posibs, "AND")[i])[1]] +
                  ts[,unlist(strsplit(posibs, "AND")[i])[2]]
  pred$r.squared[i] <- mylm$r.squared</pre>
> #Select best predicition model
> pred <- pred[rev(order(pred$r.squared)),]</pre>
> best <- as.character(pred$posibs[which(pred$r.squared == max(pred$r.squared))])
> myModel <- lm(ts$total ~ ts[, unlist(strsplit(best, "AND"))[1]] +
             ts[,unlist(strsplit(best, "AND"))[2]])
> summary(myModel)
> # USING BEST MODEL, MAKE A PREDICTED COLUMN IN TS
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```
> ts$predicted <- -234.105 + (ts$rain16.36*53.74) + (ts$minTemp16.31*3.496)
```

 $[\]verb|> save.image("E:/workingdirectory/mosquito/rainAndTemp/c_rainAndTempDone.Rdata")| \\$

> write.csv(pred, "E:/workingdirectory/mosquito/rainAndTemp/c_rainAndTempDone.csv")

> ping(2)

Log-linear modelling

```
> library(pingr)
> # READ IN DATA FOR TEMP AND RAINFALL FOR LAST 6 YEARS
> ts <- read.csv("E:/workingdirectory/mosquito/rainAndTemp/b_rainAndTemp.csv")
> #LOAD THE MODEL VARIATIONS WITH THEIR R-SQUARED VALUES
> pred <- read.csv("E:/workingdirectory/mosquito/rainAndTemp/c_rainAndTempDone.csv")
> #Select best predicition model
> best <- as.character(pred$posibs[which(pred$r.squared == max(pred$r.squared))])</pre>
> #GET MODEL DETAILS
> bestModel <- lm(ts$total ~ ts$rain16.36 + ts$minTemp16.31)
> summary(bestModel)
> # USING BEST MODEL, MAKE A PREDICTED COLUMN IN TS
> ts$predicted <- -234.105 + (ts$rain16.36*53.74) + (ts$minTemp16.31*3.496)
> #PLAY AROUND WITH A FEW ALTERNATIVE MODELS
> #SQRT
> sqrtModel <- lm(sqrt(ts$total) ~ ts$rain16.36 + ts$minTemp16.31)
> summary(sqrtModel) #R.squared == 0.5094
> logModel <- lm(log(ts$total) ~ ts$rain16.36 + ts$minTemp16.31)</pre>
> summary(logModel) #R.squared == 0.5325
> #ALTMODEL
> plot(seq(6.3,6.5,0.01), seq(6.3,6.5,0.01)/6.5, type="n", ylim=c(0,1))
> for (i in seq(6.3,6.5,0.01)){}
  altModel <- summary(lm((ts$total)^(1/i) ~ ts$rain16.36 + ts$minTemp16.31))
  #summary(altModel) #R.squared == 0.5094
  bla <- cbind(i, altModel$r.squared)</pre>
  points(i, altModel$r.squared, pch=".")
  print(unlist(bla))
+ } #THIS FINDS BEST R-SQUARED USING ts$total^(1/6.4)
> altModel <- lm((ts$total)^(1/6.4) ~ ts$rain16.36 + ts$minTemp16.31)
> summary(altModel) #R.squared == 0.5408
> # Though the 6.4 model is slightly better, I'm sticking with log
> # But if taking the log of total works best,
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> # maybe other predictors would have done a better job?
> # Time to re-run the 65536 simulations, this time taking the log of total
> ########## CREATING LOG MODEL
> #### CREATE A VECTOR OF ALL THE POSSIBLE COMBINATIONS
> #OF MIN TEMP RANGES AND RAINFALL RANGES
> rainPosibs <- rep(colnames(ts)[grepl("rain", colnames(ts))][-1],</pre>
                length(colnames(ts)[grepl("minTemp", colnames(ts))][-1]))
> minTempPosibs <- sort(rep(colnames(ts)[grepl("minTemp", colnames(ts))][-1],
                      length(colnames(ts)[grepl("rain", colnames(ts))][-1])))
> posibs <- pasteO(rainPosibs, "AND", minTempPosibs)</pre>
> #CREATE A DATA FRAME FROM MY POSIBS VECTOR
> # THIS IS WHERE I'LL PUT MY MODEL QUALITY INDICATORS
> predLog <- as.data.frame(posibs)</pre>
> #Test the r-squared for each column (RAIN ONLY)
> predLog$r.squared <- NA
> for (i in 1:length(predLog$posibs)){
   mylm <- summary(lm(log(ts[,"total"]) ~</pre>
                    ts[,unlist(strsplit(posibs, "AND")[i])[1]] +
                   ts[,unlist(strsplit(posibs, "AND")[i])[2]]
   ))
   predLog$r.squared[i] <- mylm$r.squared</pre>
+ }
> #Select best predicition model
> predLog <- predLog[rev(order(predLog$r.squared)),]</pre>
> bestLog <- as.character(predLog$posibs[which(predLog$r.squared == max(predLog$r.squared))]
> bestModelLog <- lm(log(ts$total) ~ ts[, unlist(strsplit(bestLog, "AND"))[1]] +
              ts[,unlist(strsplit(bestLog, "AND"))[2]])
> summary(bestModelLog)
> summary(lm(log(ts$total)~
            ts$rain17.37 +
            ts$minTemp14.32))
> # USING BEST LOG MODEL, MAKE A PREDICTEDLOG COLUMN IN TS
```

Visuals

```
> library(pingr)
> # READ IN DATA FOR TEMP AND RAINFALL FOR LAST 6 YEARS
> ts <- read.csv("E:/workingdirectory/mosquito/rainAndTemp/b_rainAndTemp.csv")
> #LOAD THE MODEL VARIATIONS WITH THEIR R-SQUARED VALUES
> pred <- read.csv("E:/workingdirectory/mosquito/rainAndTemp/c_rainAndTempDone.csv")
> # PLOT DISTRIBUTION OF ALL MODELS' R-SQUARED
> hist(pred$r.squared, col="darkgrey",
     xlab="R-squared", main=NA, breaks=300, border="darkgrey")
> #Select best predicition model
> best <- as.character(pred$posibs[which(pred$r.squared == max(pred$r.squared))])</pre>
> #GET BEST MODEL DETAILS
> bestModel <- lm(ts$total ~ ts$rain16.36 + ts$minTemp16.31)</pre>
> summary(bestModel)
> #PLOT INDIVIDUAL PREDICTORS AGAINT OUTCOME
> #rain
> plot(ts$rain16.36, ts$total,
     xlab="Cumulative rainfall 16-36 days prior",
     ylab="Mosquitoes per trap",
     pch=16, col=adjustcolor("darkred", alpha.f=0.4))
> abline(lm(ts$total ~ ts$rain16.36), col=adjustcolor("black", alpha.f=0.6), lwd=2)
> summary(lm(ts$total ~ ts$rain16.36)) # good = RAIN IS LINEAR
> #rain, log total
> plot(ts$rain16.36, log(ts$total))
> abline(lm(log(ts$total) ~ ts$rain16.36), col="red")
> summary(lm(log(ts$total) ~ ts$rain16.36)) # bad = RAIN IS NOT LOG
> #minTemp
> plot(ts$minTemp16.31, ts$total)
> abline(lm(ts$total ~ ts$minTemp16.31), col="red")
> summary(lm(ts$total ~ ts$minTemp16.31)) # bad = TEMP IS NOT LINEAR
> #mintemp, log total
> plot(ts$minTemp16.31, log(ts$total),
     xlab="Minimum temperature 16-31 days prior",
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ylab="Mosquitoes per trap", yaxt="n",
     pch=16, col=adjustcolor("darkred", alpha.f=0.4))
> axis(side=2, at=as.numeric(quantile(log(ts$total), na.rm=TRUE)),
     labels=as.numeric(quantile(ts$total, na.rm=TRUE)))
> abline(lm(log(ts$total) ~ ts$minTemp16.31),
       col=adjustcolor("black", alpha.f=0.6), 1wd=2)
> summary(lm(log(ts$total) ~ ts$minTemp16.31)) # good = TEMP IS LOG
> #SO, WHAT'S BETTER, LOG()ING THE TEMP OR LOGGING THE total?
> bestModel <- lm(ts$total ~ ts$rain16.36 + ts$minTemp16.31)
> summary(bestModel) #R.squared == 0.4305
> logModel <- lm(log(ts$total) ~ ts$rain16.36 + ts$minTemp16.31)</pre>
> summary(logModel) #R.squared == 0.5325
> #logTemp
> logTempModel <- lm(ts$total ~ ts$rain16.36 + log(ts$minTemp16.31))</pre>
> summary(logTempModel) #R.squared == 0.4284
> #expTemp, no transformations for anything else
> expTempModel <- lm(ts$total ~ ts$rain16.36 + exp(ts$minTemp16.31))</pre>
> summary(logTempModel) #R.squared ==
> #ANSWER - LOGGING THE TOTAL
> # USING BEST MODEL, MAKE A PREDICTED COLUMN IN TS
> ts$predicted <- -234.105 + (ts$rain16.36*53.74) + (ts$minTemp16.31*3.496)
> #PLOT PREDICTED VS OBSERVED
> plot(ts$predicted, ts$total,
     xlab="Predicted", ylab="Observed", pch=16,
      col=adjustcolor("darkblue", alpha.f=0.4))
> plot(ts$predicted, ts$total^(1/2),
     xlab="Predicted", ylab="Observed", pch=16,
      col=adjustcolor("darkblue", alpha.f=0.4))
> #WRONG WAY - ARBITRARILY SORTS, NOT MATCHING [originally appeared in article this way]
> plot(sort(ts$predicted[which(is.na(ts$total) == FALSE)]),
      (sort(ts$total[which(is.na(ts$total) == FALSE)])),
     xlab="Predicted", ylab="Observed", pch=16,
      col=adjustcolor("darkblue", alpha.f=0.4))
> #PLOT OBSERVED MOSQUITO NUMBERS
> par(mar=c(4,4,2,1))
> par(oma=c(0,0,0,0))
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```
> par(mfrow=c(1,1))
> plot(ts$date, ts$total, type="n", xaxt="n", col="white", type="n")
> axis(side=1, at=ts$date[seg(1,2100,100)], label=ts$date[seg(1,2100,100)],
     las=3, cex.axis=0.65, line=-0.85, tick=FALSE)
> #POLYGON OF OBSERVED
> polygon(c(ts$date[which(is.na(ts$total) == FALSE)],
        rev(ts$date[which(is.na(ts$total) == FALSE)])),
       c(ts$total[which(is.na(ts$total) == FALSE)],
        rep(0, length(ts$date[which(is.na(ts$total) == FALSE)]))),
       col= adjustcolor("darkred", alpha.f=0.6), border=NA)
> #LINES OF PREDICTED (ALL DATES)
> lines(ts$date,
     ts$predicted,
      col=adjustcolor("darkblue", alpha.f=0.6), lwd=2)
> #LINES OF OBSERVED
> lines(ts$date[which(is.na(ts$total) == FALSE)],
      ts$total[which(is.na(ts$total) == FALSE)],
      col=adjustcolor("darkred", alpha.f=0.6), lwd=2)
> #POLYGON OF PREDICTED
> polygon(c(ts$date[which(is.na(ts$total) == FALSE)],
        rev(ts$date[which(is.na(ts$total) == FALSE)])),
       c(ts$predicted[which(is.na(ts$total) == FALSE)],
        rep(0, length(ts$date[which(is.na(ts$total) == FALSE)]))),
       col= "red", border=NA)
> #LINES OF PREDICTED (ONLY FOR COLLECTION DATES)
> lines(ts$date[which(is.na(ts$total) == FALSE)],
      ts$predicted[which(is.na(ts$total) == FALSE)],
      col=adjustcolor("darkblue", alpha.f=0.6), lwd=2)
> #IDENTICAL, BUT USING LOG OF TOTAL
> #PLOT OBSERVED MOSQUITO NUMBERS
> par(mar=c(4,4,2,1))
> par(oma=c(0,0,0,0))
> par(mfrow=c(1,1))
> plot(ts$date, log(ts$total), type="n", xaxt="n", col="white", type="n")
```

```
> axis(side=1, at=ts$date[seq(1,2100,100)], label=ts$date[seq(1,2100,100)],
     las=3, cex.axis=0.65, line=-0.85, tick=FALSE)
> #POLYGON OF OBSERVED
> polygon(c(ts$date[which(is.na(log(ts$total)) == FALSE)],
          rev(ts$date[which(is.na(log(ts$total)) == FALSE)])),
        c(log(ts$total)[which(is.na(log(ts$total)) == FALSE)],
          rep(0, length(ts$date[which(is.na(log(ts$total)) == FALSE)]))),
        col= adjustcolor("darkred", alpha.f=0.6), border=NA)
> #LINES OF PREDICTED (ALL DATES)
> library(splines)
> ts$predicted2 <- log(ts$predicted)</pre>
> ts$predicted2[which(is.na(ts$predicted2)==TRUE)] <- 0</pre>
> lines(ts$date,
      ts$predicted2,
      col=adjustcolor("darkblue", alpha.f=0.6),
      1wd=3)
> #ONLY USING TRAP DATES
> lines(ts$date[which(is.na(ts$total) == FALSE)],
      ts$predicted2[which(is.na(ts$total) == FALSE)],
      col=adjustcolor("darkblue", alpha.f=0.6), lwd=2)
```