

UWPCE DataScience3 KaggleWNVP Project Report

Kaggle Team 3

2 June 2015

Background

WNVP: “West Nile Virus Prediction”

[URL of Kaggle Competition.](#)

Goal of Competition: “Predict West Nile virus in mosquitos across the city of Chicago”

Team Goals:

1. Experiment with modelling alternative on a real-world dataset.
2. Learn how to participate in a Kaggle competition.
3. Non-Goal: win the competition, or even score highly.

Team Members

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Data Preparation

Obtain Original Datasets from Kaggle Website

Download the training, test, spray, and weather data from the Kaggle web site page for West Nile Virus Prediction.

Please see Appendix for R (and Python) code that:

- General Setup: Clears environment, sets working directory, loads libraries, define utility functions
- Downloads the data from the Kaggle site and unzips them.

```
stopifnot(allKaggleFilesArePresent())  
print("All unzipped Kaggle datasets found in PWD. Proceeding.")
```

```
## [1] "All unzipped Kaggle datasets found in PWD. Proceeding."
```

Create train and test datasets compatible with Weka (ARFF) and each other (same attributes)

- Read in test and train csv-format files into data frames.
- Make the train and test datasets have the same attributes:
 - Train: Convert the WnvPresent column from numeric to factor with levels “Yes” and “No”.
 - Test: Remove Id attribute.
 - Test: Add a NumMosquitos integer column, all 0.
 - Test: Add a WnvPresent factor column, all with “No” level.
- Combine train and test into a single data frame and transform all as follows:
 - Remove the block attributes of little use:
 - * Address, Block, Street, AddressNumberAndStreet, AddressAccuracy.
 - Convert the Species factor into bit vectors (a new column for each of the factor levels, with a zero or 1 value)
 - Convert date into date format, add “Year” and “Month” attributes.

```
train_df <- read.csv(paste0(dataSubDir, "/", wnvTrainFilename))
stopifnot(nrow(train_df) == wnvTrainFileNRecs)
train_df$WnvPresent <- as.factor(train_df$WnvPresent)
levels(train_df$WnvPresent) <- c("No", "Yes")

test_df <- read.csv(paste0(dataSubDir, "/", wnvTestFilename))
# Quick sanity check: got right number of records?
stopifnot(nrow(test_df) == wnvTestFileNRecs)
test_df$Id <- NULL
test_df <- cbind(NumMosquitos=0, test_df)
WnvPresent <- factor("No", levels=c("No", "Yes"))
test_df <- cbind(test_df, WnvPresent)

combined <- rbind(train_df, test_df)

attrsToRemove <- c("Address", "Block", "Street", "AddressNumberAndStreet", "AddressAccuracy")
combined <- combined[,!names(combined) %in% attrsToRemove]

# Convert Species into a bit vector, one column for each factor level
combined <- with(combined, cbind(model.matrix( ~ 0 + Species, combined), combined))

# Tries %Y-%m-%d by default, but what the heck, explicitly state the format.
combined$Date <- as.Date(combined$Date, format="%Y-%m-%d")
Year <- format(combined$Date, "%Y")
Month <- format(combined$Date, "%m")
# Prepend year and month, leaving classification attribute in last column
combined <- cbind(Year, Month, combined)
# Move Date to first column, near Year and Month.
combined <- combined[,c(11,1,2,3,4,5,6,7,8,9,10,12,13,14,15,16,17)]
# Remove the Species attribute - replaced by bit vectors.
combined$Species <- NULL
```

Distance of Trap from the Two Weather Stations

- Calculate the distance (using lat/long) of the trap from the two weather stations, adding attributes with the value in kilometers. Patience: This takes a while (~5 minutes).
- Add a nearest weather station attribute.

Using function *distCosine* in [R Geosphere Package](#) to calculate distance on a sphere.

```
# Station 1: O'Hare
station1LongLat <- c(-87.933, 41.995)

# Station 2: Midway
station2LongLat <- c(-87.752, 41.786)

# Patience. This takes a while (~5 minutes)
for (i in 1:nrow(combined)) {
  combined$Station1DistKm[i] <- distCosine(c(combined$Longitude[i], combined$Latitude[i]), station1LongLat)
  combined$Station2DistKm[i] <- distCosine(c(combined$Longitude[i], combined$Latitude[i]), station2LongLat)
}
combined$NearestStation <- ifelse(combined$Station1DistKm <= combined$Station2DistKm, 1, 2)
```

- Merge in min, max, and average temperature from nearest station on that date.

```
weather_df <- read.csv(paste0(dataSubDir, "/", wnvWeatherFilename))
colsToKeep <- c("Station", "Date", "Tmax", "Tmin", "Tavg")
minmaxavgTemps <- weather_df[,names(weather_df) %in% colsToKeep]
minmaxavgTemps$Tavg <- as.integer(minmaxavgTemps$Tavg)
minmaxavgTemps$Date <- as.Date(minmaxavgTemps$Date, format="%Y-%m-%d")

combinedWithTemps <- merge(combined, minmaxavgTemps, by.x=c("Date", "NearestStation"), by.y=c("Date", "Station"))

combinedMaster <- moveColToLast(combinedWithTemps, "WnvPresent")
stopifnot(nrow(combinedMaster) == (wnvpTrainFileNRecs + wnvTestFileNRecs))
```

Write files: complete (all attributes) to CSV, latest model inputs to ARFF.

- Write the combined “master” (all attributes) file out in two subsets (train and test), as CSV.

```
curMasterIdx = "02" # Bump as more attributes are added
nTrainingRecs = nrow(train_df)
nTotalRecs = wnvTrainFileNRecs + wnvTestFileNRecs
stopifnot(nrow(combinedMaster) == nTotalRecs)

trainRecs <- combinedMaster[1:nTrainingRecs,]
stopifnot(nTrainingRecs == wnvTrainFileNRecs)
write.csv(trainRecs,
          paste0(workingSubDir, "/", "train", curMasterIdx, ".csv"),
          eol = '\n')
str(trainRecs)
```

```
## 'data.frame':    10506 obs. of  22 variables:
## $ Date           : Date, format: "2007-05-29" "2007-05-29" ...
## $ NearestStation : num  1 1 1 1 1 1 1 2 2 2 ...
## $ Year           : Factor w/  8 levels "2007","2008",...: 1 1 1 1 1 1 1 1 1 1 ...
## $ Month          : Factor w/  6 levels "05","06","07",...: 1 1 1 1 1 1 1 1 1 1 ...
## $ SpeciesCULEX ERRATICUS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS   : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS/RESTUANS: num  1 0 0 1 0 1 1 0 1 0 ...
## $ SpeciesCULEX RESTUANS  : num  0 1 1 0 1 0 0 1 0 1 ...
## $ SpeciesCULEX SALINARIUS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX TARSALIS  : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX TERRITANS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesUNSPECIFIED CULEX : num  0 0 0 0 0 0 0 0 0 0 ...
## $ Trap             : Factor w/ 149 levels "T001","T002",...: 2 2 7 14 14 95 90 34
## $ Latitude         : num  42 42 42 42 42 ...
## $ Longitude        : num -87.8 -87.8 -87.8 -87.8 -87.8 ...
## $ NumMosquitos     : num  1 1 1 1 4 1 1 1 1 2 ...
## $ Station1DistKm   : num  11.81 11.81 13.55 9.25 9.25 ...
## $ Station2DistKm   : num  19.2 19.2 23.3 21.8 21.8 ...
## $ Tmax             : int   88 88 88 88 88 88 88 88 88 88 ...
## $ Tmin             : int   60 60 60 60 60 60 60 65 65 65 ...
## $ Tavg             : int   39 39 39 39 39 39 39 42 42 42 ...
## $ WnvPresent       : Factor w/  2 levels "No","Yes": 1 1 1 1 1 1 1 1 1 1 ...
```

```
testRecs <- combinedMaster[(nTrainingRecs+1):nTotalRecs,]
stopifnot(nrow(testRecs) == wnvTestFileNRecs)
write.csv(testRecs,
          paste0(workingSubDir, "/", "test", curMasterIdx, ".csv"),
          eol = '\n')
str(testRecs)
```

```
## 'data.frame':    116293 obs. of  22 variables:
## $ Date           : Date, format: "2008-07-11" "2008-07-11" ...
## $ NearestStation : num  2 2 2 2 2 2 2 2 2 2 ...
## $ Year           : Factor w/  8 levels "2007","2008",...: 2 2 2 2 2 2 2 2 2 2 ...
## $ Month          : Factor w/  6 levels "05","06","07",...: 3 3 3 3 3 3 3 3 3 3 ...
## $ SpeciesCULEX ERRATICUS : num  0 1 0 0 0 1 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS   : num  0 0 0 0 0 0 0 0 1 0 ...
## $ SpeciesCULEX PIPIENS/RESTUANS: num  0 0 0 0 0 0 1 0 0 0 ...
## $ SpeciesCULEX RESTUANS  : num  0 0 0 0 0 0 0 1 0 0 ...
## $ SpeciesCULEX SALINARIUS : num  0 0 1 0 0 0 0 0 0 1 ...
## $ SpeciesCULEX TARSALIS  : num  0 0 0 1 0 0 0 0 0 0 ...
## $ SpeciesCULEX TERRITANS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesUNSPECIFIED CULEX : num  1 0 0 0 1 0 0 0 0 0 ...
## $ Trap             : Factor w/ 149 levels "T001","T002",...: 94 94 107 49 49 49 50
## $ Latitude         : num  41.9 41.9 41.9 41.8 41.8 ...
## $ Longitude        : num -87.7 -87.7 -87.7 -87.7 -87.7 ...
## $ NumMosquitos     : num  0 0 0 0 0 0 0 0 0 0 ...
## $ Station1DistKm   : num  20.5 20.5 22.7 32.9 32.9 ...
## $ Station2DistKm   : num  16.8 16.8 14.1 6.4 6.4 ...
## $ Tmax             : int   89 89 89 89 89 89 89 89 89 89 ...
## $ Tmin             : int   64 64 64 64 64 64 64 64 64 64 ...
```

```
## $ Tavg : int 42 42 42 42 42 42 42 42 42 42 ...
## $ WnvPresent : Factor w/ 2 levels "No","Yes": 1 1 1 1 1 1 1 1 1 1 ...
```

Write the combined master - train and test - as a CSV file.

Good starting point for future experiments.

```
write.csv(combinedMaster,
          paste0(workingSubDir, "/", "trainAndTest", curMasterIdx, ".csv"),
          eol = '\n')
str(combinedMaster)
```

```
## 'data.frame': 126799 obs. of 22 variables:
## $ Date : Date, format: "2007-05-29" "2007-05-29" ...
## $ NearestStation : num 1 1 1 1 1 1 1 2 2 2 ...
## $ Year : Factor w/ 8 levels "2007","2008",...: 1 1 1 1 1 1 1 1 1 1 ...
## $ Month : Factor w/ 6 levels "05","06","07",...: 1 1 1 1 1 1 1 1 1 1 ...
## $ SpeciesCULEX ERRATICUS : num 0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS : num 0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS/RESTUANS : num 1 0 0 1 0 1 1 0 1 0 ...
## $ SpeciesCULEX RESTUANS : num 0 1 1 0 1 0 0 1 0 1 ...
## $ SpeciesCULEX SALINARIUS : num 0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX TARSALIS : num 0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX TERRITANS : num 0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesUNSPECIFIED CULEX : num 0 0 0 0 0 0 0 0 0 0 ...
## $ Trap : Factor w/ 149 levels "T001","T002",...: 2 2 7 14 14 95 90 34
## $ Latitude : num 42 42 42 42 42 ...
## $ Longitude : num -87.8 -87.8 -87.8 -87.8 -87.8 ...
## $ NumMosquitos : num 1 1 1 1 4 1 1 1 1 2 ...
## $ Station1DistKm : num 11.81 11.81 13.55 9.25 9.25 ...
## $ Station2DistKm : num 19.2 19.2 23.3 21.8 21.8 ...
## $ Tmax : int 88 88 88 88 88 88 88 88 88 88 ...
## $ Tmin : int 60 60 60 60 60 60 60 65 65 65 ...
## $ Tavg : int 39 39 39 39 39 39 39 42 42 42 ...
## $ WnvPresent : Factor w/ 2 levels "No","Yes": 1 1 1 1 1 1 1 1 1 1 ...
```

- Write the combined “master” (all records, some attributes, both train and test records) file out in two subsets (train and test), with both files in ARFF format with same ARFF header.

Perform any subsetting here so that train and test formats look the same to Weka.

Reproduction of May 17 Submittal by Pat Leahy

```
colsToKeep=c("Latitude", "Longitude", "Month", "Tmin", "Tmax", "Tavg", "WnvPresent")
combinedForModeling <- combinedMaster[,names(combinedMaster) %in% colsToKeep]
stopifnot(nrow(combinedForModeling) == (wnvpTrainFileNRecs + wnvpTestFileNRecs))
```

```
trainRecs <- combinedForModeling[1:nTrainingRecs,]
```

Oversample: use all the WnvPresent==True samples. Randomly select an equal number of False samples. Use that for the test data set.

```

oversample_df <- trainRecs[trainRecs$WnvPresent=="Yes",]
nFalseObservationsToUse <- nrow(oversample_df)
wnvNotPresent <- trainRecs[trainRecs$WnvPresent=="No",]
oversample_df <- rbind(oversample_df, wnvNotPresent[sample(nrow(wnvNotPresent), nFalseObservationsToUse),])

write.arff(oversample_df,
            paste0(workingSubDir, "/", "train", curMasterIdx, ".arff"),
            eol = '\n', relation="WNVPTTrainDataset")
str(oversample_df)

```

```

## 'data.frame':    472 obs. of  7 variables:
## $ Month      : Factor w/ 6 levels "05","06","07",...: 3 3 3 3 3 3 4 4 4 4 ...
## $ Latitude   : num  41.7 41.7 41.7 41.7 41.7 ...
## $ Longitude  : num  -87.5 -87.6 -87.6 -87.6 -87.6 ...
## $ Tmax       : int   85 83 83 83 83 83 92 92 92 92 ...
## $ Tmin       : int   69 70 70 70 70 70 69 69 69 69 ...
## $ Tavg       : int   42 42 42 42 42 42 46 46 46 46 ...
## $ WnvPresent: Factor w/ 2 levels "No","Yes": 2 2 2 2 2 2 2 2 2 2 ...

```

```

testRecs <- combinedForModeling[(nTrainingRecs+1):nTotalRecs,]
stopifnot(nrow(testRecs) == wnvTestFileNRecs)
write.arff(testRecs,
            paste0(workingSubDir, "/", "test", curMasterIdx, ".arff"),
            eol = '\n', relation="WNVPTTestDataset")
str(testRecs)

```

```

## 'data.frame':    116293 obs. of  7 variables:
## $ Month      : Factor w/ 6 levels "05","06","07",...: 3 3 3 3 3 3 3 3 3 3 ...
## $ Latitude   : num  41.9 41.9 41.9 41.8 41.8 ...
## $ Longitude  : num  -87.7 -87.7 -87.7 -87.7 -87.7 ...
## $ Tmax       : int   89 89 89 89 89 89 89 89 89 89 ...
## $ Tmin       : int   64 64 64 64 64 64 64 64 64 64 ...
## $ Tavg       : int   42 42 42 42 42 42 42 42 42 42 ...
## $ WnvPresent: Factor w/ 2 levels "No","Yes": 1 1 1 1 1 1 1 1 1 1 ...

```

May 28: Additional Predictors (Species bit vectors, NumMosqitos)

Note: Dataset rolls over to a new record if number of mosquitos reaches 50. TODO: Same date, same lat/long, same Species: combine the records.

```

colsToKeep=c("Latitude", "Longitude", "Month", "Tmin", "Tmax", "Tavg", "WnvPresent")
colsToKeep=c(colsToKeep, "SpeciesCULEX ERRATICUS", "SpeciesCULEX PIPIENS",
               "SpeciesCULEX PIPIENS/RESTUANS", "SpeciesCULEX RESTUANS", "SpeciesCULEX SALINARIUS",
               "SpeciesCULEX TARSALIS", "SpeciesCULEX TERRITANS", "SpeciesUNSPECIFIED CULEX")
colsToKeep=c(colsToKeep, "NumMosquitos")
combinedForModeling <- combinedMaster[,names(combinedMaster) %in% colsToKeep]
stopifnot(nrow(combinedForModeling) == (wnvpTrainFileNRecs + wnvTestFileNRecs))

```

Oversample: use all the WnvPresent==True samples. Randomly select an equal number of False samples. Use that for the test data set.

```

trainRecs <- combinedForModeling[1:nTrainingRecs,]
oversample_df <- trainRecs[trainRecs$WnvPresent=="Yes",]
nFalseObservationsToUse <- nrow(oversample_df)
wnvNotPresent <- trainRecs[trainRecs$WnvPresent=="No",]
oversample_df <- rbind(oversample_df, wnvNotPresent[sample(nrow(wnvNotPresent), nFalseObservationsToUse),])

write.arff(oversample_df,
  paste0(workingSubDir, "/", "train", curMasterIdx, ".arff"),
  eol = '\n', relation="WNVPTTrainDataset")
str(oversample_df)

```

```

## 'data.frame':    472 obs. of  16 variables:
## $ Month                : Factor w/ 6 levels "05","06","07",...: 3 3 3 3 3 3 4 4 4 4 ...
## $ SpeciesCULEX ERRATICUS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS   : num  0 0 0 1 1 1 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS/RESTUANS: num  1 1 1 0 0 0 1 1 1 1 ...
## $ SpeciesCULEX RESTUANS   : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX SALINARIUS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX TARSALIS   : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX TERRITANS  : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesUNSPECIFIED CULEX : num  0 0 0 0 0 0 0 0 0 0 ...
## $ Latitude               : num  41.7 41.7 41.7 41.7 41.7 ...
## $ Longitude              : num  -87.5 -87.6 -87.6 -87.6 -87.6 ...
## $ NumMosquitos           : num  50 50 50 50 50 50 50 21 5 2 ...
## $ Tmax                   : int   85 83 83 83 83 83 92 92 92 92 ...
## $ Tmin                   : int   69 70 70 70 70 70 69 69 69 69 ...
## $ Tavg                   : int   42 42 42 42 42 42 46 46 46 46 ...
## $ WnvPresent              : Factor w/ 2 levels "No","Yes": 2 2 2 2 2 2 2 2 2 2 ...

```

```

testRecs <- combinedForModeling[(nTrainingRecs+1):nTotalRecs,]
stopifnot(nrow(testRecs) == wnvptestFileNRecs)
write.arff(testRecs,
  paste0(workingSubDir, "/", "test", curMasterIdx, ".arff"),
  eol = '\n', relation="WNVPTTestDataset")
str(testRecs)

```

```

## 'data.frame':    116293 obs. of  16 variables:
## $ Month                : Factor w/ 6 levels "05","06","07",...: 3 3 3 3 3 3 3 3 3 3 ...
## $ SpeciesCULEX ERRATICUS : num  0 1 0 0 0 1 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS   : num  0 0 0 0 0 0 0 0 1 0 ...
## $ SpeciesCULEX PIPIENS/RESTUANS: num  0 0 0 0 0 0 1 0 0 0 ...
## $ SpeciesCULEX RESTUANS   : num  0 0 0 0 0 0 0 1 0 0 ...
## $ SpeciesCULEX SALINARIUS : num  0 0 1 0 0 0 0 0 0 1 ...
## $ SpeciesCULEX TARSALIS   : num  0 0 0 1 0 0 0 0 0 0 ...
## $ SpeciesCULEX TERRITANS  : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesUNSPECIFIED CULEX : num  1 0 0 0 1 0 0 0 0 0 ...
## $ Latitude               : num  41.9 41.9 41.9 41.8 41.8 ...
## $ Longitude              : num  -87.7 -87.7 -87.7 -87.7 -87.7 ...
## $ NumMosquitos           : num  0 0 0 0 0 0 0 0 0 0 ...
## $ Tmax                   : int   89 89 89 89 89 89 89 89 89 89 ...
## $ Tmin                   : int   64 64 64 64 64 64 64 64 64 64 ...

```



```
## $ Tavg : int 42 42 42 42 42 42 42 42 42 42 ...
## $ WnvPresent : Factor w/ 2 levels "No","Yes": 1 1 1 1 1 1 1 1 1 1 ...
```

May 28 #2: Additional Predictor (Species bit vectors, NumMosquitos)

```
colsToKeep=c("Latitude", "Longitude", "Month", "Tmin", "Tmax", "Tavg", "WnvPresent")
colsToKeep=c(colsToKeep, "SpeciesCULEX ERRATICUS", "SpeciesCULEX PIPIENS",
               "SpeciesCULEX PIPIENS/RESTUANS", "SpeciesCULEX RESTUANS", "SpeciesCULEX SALINARIUS",
               "SpeciesCULEX TARSALIS", "SpeciesCULEX TERRITANS", "SpeciesUNSPECIFIED CULEX")
colsToKeep=c(colsToKeep, "NumMosquitos")
combinedForModeling <- combinedMaster[,names(combinedMaster) %in% colsToKeep]
stopifnot(nrow(combinedForModeling) == (wnvpTrainFileNRecs + wnvpTestFileNRecs))
```

Oversample: use all the WnvPresent==True samples. Randomly select an equal number of False samples. Use that for the test data set.

```
trainRecs <- combinedForModeling[1:nTrainingRecs,]
oversample_df <- trainRecs[trainRecs$WnvPresent=="Yes",]
nFalseObservationsToUse <- nrow(oversample_df)
wnvpNotPresent <- trainRecs[trainRecs$WnvPresent=="No",]
oversample_df <- rbind(oversample_df, wnvpNotPresent[sample(nrow(wnvpNotPresent), nFalseObservationsToUse),])

write.arff(oversample_df,
            paste0(workingSubDir, "/", "train", curMasterIdx, ".arff"),
            eol = '\n', relation="WNVPTTrainDataset")
str(oversample_df)
```

```
## 'data.frame': 472 obs. of 16 variables:
## $ Month : Factor w/ 6 levels "05","06","07",...: 3 3 3 3 3 3 4 4 4 4 ...
## $ SpeciesCULEX ERRATICUS : num 0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS : num 0 0 0 1 1 1 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS/RESTUANS: num 1 1 1 0 0 0 1 1 1 1 ...
## $ SpeciesCULEX RESTUANS : num 0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX SALINARIUS : num 0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX TARSALIS : num 0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX TERRITANS : num 0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesUNSPECIFIED CULEX : num 0 0 0 0 0 0 0 0 0 0 ...
## $ Latitude : num 41.7 41.7 41.7 41.7 41.7 ...
## $ Longitude : num -87.5 -87.6 -87.6 -87.6 -87.6 ...
## $ NumMosquitos : num 50 50 50 50 50 50 50 21 5 2 ...
## $ Tmax : int 85 83 83 83 83 83 92 92 92 92 ...
## $ Tmin : int 69 70 70 70 70 70 69 69 69 69 ...
## $ Tavg : int 42 42 42 42 42 42 46 46 46 46 ...
## $ WnvPresent : Factor w/ 2 levels "No","Yes": 2 2 2 2 2 2 2 2 2 2 ...
```

```
testRecs <- combinedForModeling[(nTrainingRecs+1):nTotalRecs,]
stopifnot(nrow(testRecs) == wnvpTestFileNRecs)
write.arff(testRecs,
            paste0(workingSubDir, "/", "test", curMasterIdx, ".arff"),
            eol = '\n', relation="WNVPTTestDataset")
str(testRecs)
```



```
## 'data.frame':    116293 obs. of  16 variables:
## $ Month          : Factor w/ 6 levels "05","06","07",...: 3 3 3 3 3 3 3 3 3 3 ...
## $ SpeciesCULEX ERRATICUS : num  0 1 0 0 0 1 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS   : num  0 0 0 0 0 0 0 0 1 0 ...
## $ SpeciesCULEX PIPIENS/RESTUANS: num  0 0 0 0 0 0 1 0 0 0 ...
## $ SpeciesCULEX RESTUANS  : num  0 0 0 0 0 0 0 1 0 0 ...
## $ SpeciesCULEX SALINARIUS : num  0 0 1 0 0 0 0 0 0 1 ...
## $ SpeciesCULEX TARSALIS  : num  0 0 0 1 0 0 0 0 0 0 ...
## $ SpeciesCULEX TERRITANS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesUNSPECIFIED CULEX : num  1 0 0 0 1 0 0 0 0 0 ...
## $ Latitude           : num  41.9 41.9 41.9 41.8 41.8 ...
## $ Longitude          : num  -87.7 -87.7 -87.7 -87.7 -87.7 ...
## $ NumMosquitos       : num  0 0 0 0 0 0 0 0 0 0 ...
## $ Tmax               : int   89 89 89 89 89 89 89 89 89 89 ...
## $ Tmin               : int   64 64 64 64 64 64 64 64 64 64 ...
## $ Tavg                : int   42 42 42 42 42 42 42 42 42 42 ...
## $ WnvPresent          : Factor w/ 2 levels "No","Yes": 1 1 1 1 1 1 1 1 1 1 ...
```

NumMosquitos degraded score. Left Species bit vector.

May 28 #3: Additional Predictor (Species bit vectors). Use SMOTE in Weka for oversampling.

Change: use SMOTE in Weka to oversample WnvPresent. Don't undersample !WnvPresent here. In Weka, randomize after creating synthetic entries - they got stuffed at end and cause 10-fold cross validation to mess up.

```
curMasterIdx <- "04"
colsToKeep=c("Latitude", "Longitude", "Month", "Tmin", "Tmax", "Tavg", "WnvPresent")
colsToKeep=c(colsToKeep, "SpeciesCULEX ERRATICUS", "SpeciesCULEX PIPIENS",
              "SpeciesCULEX PIPIENS/RESTUANS", "SpeciesCULEX RESTUANS", "SpeciesCULEX SALINARIUS",
              "SpeciesCULEX TARSALIS", "SpeciesCULEX TERRITANS", "SpeciesUNSPECIFIED CULEX")
combinedForModeling <- combinedMaster[,names(combinedMaster) %in% colsToKeep]
stopifnot(nrow(combinedForModeling) == (wnvpTrainFileNRecs + wnvpTestFileNRecs))

nTrainingRecs = nrow(train_df)
nTotalRecs = wnvpTrainFileNRecs + wnvpTestFileNRecs
stopifnot(nrow(combinedMaster) == nTotalRecs)

trainRecs <- combinedMaster[1:nTrainingRecs,]
stopifnot(nTrainingRecs == wnvpTrainFileNRecs)
write.csv(trainRecs,
          paste0(workingSubDir, "/", "train", curMasterIdx, ".csv"),
          eol = '\n')
str(trainRecs)
```

```
## 'data.frame':    10506 obs. of  22 variables:
## $ Date           : Date, format: "2007-05-29" "2007-05-29" ...
## $ NearestStation : num  1 1 1 1 1 1 1 2 2 2 ...
## $ Year           : Factor w/ 8 levels "2007","2008",...: 1 1 1 1 1 1 1 1 1 1 ...
## $ Month          : Factor w/ 6 levels "05","06","07",...: 1 1 1 1 1 1 1 1 1 1 ...
## $ SpeciesCULEX ERRATICUS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS   : num  0 0 0 0 0 0 0 0 0 0 ...
```

```
## $ SpeciesCULEX PIPIENS/RESTUANS: num 1 0 0 1 0 1 1 0 1 0 ...
## $ SpeciesCULEX RESTUANS : num 0 1 1 0 1 0 0 1 0 1 ...
## $ SpeciesCULEX SALINARIUS : num 0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX TARSALIS : num 0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX TERRITANS : num 0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesUNSPECIFIED CULEX : num 0 0 0 0 0 0 0 0 0 0 ...
## $ Trap : Factor w/ 149 levels "T001","T002",...: 2 2 7 14 14 95 90 34
## $ Latitude : num 42 42 42 42 42 ...
## $ Longitude : num -87.8 -87.8 -87.8 -87.8 -87.8 ...
## $ NumMosquitos : num 1 1 1 1 4 1 1 1 1 2 ...
## $ Station1DistKm : num 11.81 11.81 13.55 9.25 9.25 ...
## $ Station2DistKm : num 19.2 19.2 23.3 21.8 21.8 ...
## $ Tmax : int 88 88 88 88 88 88 88 88 88 88 ...
## $ Tmin : int 60 60 60 60 60 60 60 65 65 65 ...
## $ Tavg : int 39 39 39 39 39 39 39 42 42 42 ...
## $ WnvPresent : Factor w/ 2 levels "No","Yes": 1 1 1 1 1 1 1 1 1 1 ...
```

```
testRecs <- combinedMaster[(nTrainingRecs+1):nTotalRecs,]
stopifnot(nrow(testRecs) == wnvTestFileNRecs)
write.csv(testRecs,
          paste0(workingSubDir, "/", "test", curMasterIdx, ".csv"),
          eol = '\n')
str(testRecs)
```

```
## 'data.frame': 116293 obs. of 22 variables:
## $ Date : Date, format: "2008-07-11" "2008-07-11" ...
## $ NearestStation : num 2 2 2 2 2 2 2 2 2 2 ...
## $ Year : Factor w/ 8 levels "2007","2008",...: 2 2 2 2 2 2 2 2 2 2 ...
## $ Month : Factor w/ 6 levels "05","06","07",...: 3 3 3 3 3 3 3 3 3 3 ...
## $ SpeciesCULEX ERRATICUS : num 0 1 0 0 0 1 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS : num 0 0 0 0 0 0 0 0 1 0 ...
## $ SpeciesCULEX PIPIENS/RESTUANS: num 0 0 0 0 0 0 1 0 0 0 ...
## $ SpeciesCULEX RESTUANS : num 0 0 0 0 0 0 0 1 0 0 ...
## $ SpeciesCULEX SALINARIUS : num 0 0 1 0 0 0 0 0 0 1 ...
## $ SpeciesCULEX TARSALIS : num 0 0 0 1 0 0 0 0 0 0 ...
## $ SpeciesCULEX TERRITANS : num 0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesUNSPECIFIED CULEX : num 1 0 0 0 1 0 0 0 0 0 ...
## $ Trap : Factor w/ 149 levels "T001","T002",...: 94 94 107 49 49 49 50
## $ Latitude : num 41.9 41.9 41.9 41.8 41.8 ...
## $ Longitude : num -87.7 -87.7 -87.7 -87.7 -87.7 ...
## $ NumMosquitos : num 0 0 0 0 0 0 0 0 0 0 ...
## $ Station1DistKm : num 20.5 20.5 22.7 32.9 32.9 ...
## $ Station2DistKm : num 16.8 16.8 14.1 6.4 6.4 ...
## $ Tmax : int 89 89 89 89 89 89 89 89 89 89 ...
## $ Tmin : int 64 64 64 64 64 64 64 64 64 64 ...
## $ Tavg : int 42 42 42 42 42 42 42 42 42 42 ...
## $ WnvPresent : Factor w/ 2 levels "No","Yes": 1 1 1 1 1 1 1 1 1 1 ...
```

Write the combined master - train and test - as a CSV file.

Good starting point for future experiments.

```
write.csv(combinedMaster,
```

```

paste0(workingSubDir, "/", "trainAndTest", curMasterIdx, ".csv"),
eol = '\n')
str(combinedMaster)

```

```

## 'data.frame':    126799 obs. of  22 variables:
## $ Date          : Date, format: "2007-05-29" "2007-05-29" ...
## $ NearestStation : num  1 1 1 1 1 1 1 2 2 2 ...
## $ Year          : Factor w/ 8 levels "2007","2008",...: 1 1 1 1 1 1 1 1 1 1 ...
## $ Month         : Factor w/ 6 levels "05","06","07",...: 1 1 1 1 1 1 1 1 1 1 ...
## $ SpeciesCULEX ERRATICUS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS   : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS/RESTUANS: num  1 0 0 1 0 1 1 0 1 0 ...
## $ SpeciesCULEX RESTUANS  : num  0 1 1 0 1 0 0 1 0 1 ...
## $ SpeciesCULEX SALINARIUS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX TARSALIS  : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX TERRITANS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesUNSPECIFIED CULEX : num  0 0 0 0 0 0 0 0 0 0 ...
## $ Trap           : Factor w/ 149 levels "T001","T002",...: 2 2 7 14 14 95 90 34
## $ Latitude       : num  42 42 42 42 42 ...
## $ Longitude      : num  -87.8 -87.8 -87.8 -87.8 -87.8 ...
## $ NumMosquitos   : num  1 1 1 1 4 1 1 1 1 2 ...
## $ Station1DistKm : num  11.81 11.81 13.55 9.25 9.25 ...
## $ Station2DistKm : num  19.2 19.2 23.3 21.8 21.8 ...
## $ Tmax           : int   88 88 88 88 88 88 88 88 88 88 ...
## $ Tmin           : int   60 60 60 60 60 60 60 65 65 65 ...
## $ Tavg           : int   39 39 39 39 39 39 39 42 42 42 ...
## $ WnvPresent     : Factor w/ 2 levels "No","Yes": 1 1 1 1 1 1 1 1 1 1 ...

```

```
trainRecs <- combinedForModeling[1:nTrainingRecs,]
```

```

write.arff(trainRecs,
paste0(workingSubDir, "/", "train", curMasterIdx, ".arff"),
eol = '\n', relation="WNVPTTrainDataset")
str(trainRecs)

```

```

## 'data.frame':    10506 obs. of  15 variables:
## $ Month         : Factor w/ 6 levels "05","06","07",...: 1 1 1 1 1 1 1 1 1 1 ...
## $ SpeciesCULEX ERRATICUS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS   : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS/RESTUANS: num  1 0 0 1 0 1 1 0 1 0 ...
## $ SpeciesCULEX RESTUANS  : num  0 1 1 0 1 0 0 1 0 1 ...
## $ SpeciesCULEX SALINARIUS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX TARSALIS  : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesCULEX TERRITANS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesUNSPECIFIED CULEX : num  0 0 0 0 0 0 0 0 0 0 ...
## $ Latitude       : num  42 42 42 42 42 ...
## $ Longitude      : num  -87.8 -87.8 -87.8 -87.8 -87.8 ...
## $ Tmax           : int   88 88 88 88 88 88 88 88 88 88 ...
## $ Tmin           : int   60 60 60 60 60 60 60 65 65 65 ...
## $ Tavg           : int   39 39 39 39 39 39 39 42 42 42 ...
## $ WnvPresent     : Factor w/ 2 levels "No","Yes": 1 1 1 1 1 1 1 1 1 1 ...

```

```
testRecs <- combinedForModeling[(nTrainingRecs+1):nTotalRecs,]
stopifnot(nrow(testRecs) == wnvTestFileNRecs)
write.arff(testRecs,
  paste0(workingSubDir, "/", "test", curMasterIdx, ".arff"),
  eol = '\n', relation="WNVPTestDataset")
str(testRecs)
```

```
## 'data.frame':    116293 obs. of  15 variables:
## $ Month                : Factor w/ 6 levels "05","06","07",...: 3 3 3 3 3 3 3 3 3 3 ...
## $ SpeciesCULEX ERRATICUS : num  0 1 0 0 0 1 0 0 0 0 ...
## $ SpeciesCULEX PIPIENS   : num  0 0 0 0 0 0 0 0 1 0 ...
## $ SpeciesCULEX PIPIENS/RESTUANS: num  0 0 0 0 0 0 1 0 0 0 ...
## $ SpeciesCULEX RESTUANS  : num  0 0 0 0 0 0 0 1 0 0 ...
## $ SpeciesCULEX SALINARIUS : num  0 0 1 0 0 0 0 0 0 1 ...
## $ SpeciesCULEX TARSALIS  : num  0 0 0 1 0 0 0 0 0 0 ...
## $ SpeciesCULEX TERRITANS : num  0 0 0 0 0 0 0 0 0 0 ...
## $ SpeciesUNSPECIFIED CULEX : num  1 0 0 0 1 0 0 0 0 0 ...
## $ Latitude              : num  41.9 41.9 41.9 41.8 41.8 ...
## $ Longitude              : num  -87.7 -87.7 -87.7 -87.7 -87.7 ...
## $ Tmax                   : int   89 89 89 89 89 89 89 89 89 89 ...
## $ Tmin                   : int   64 64 64 64 64 64 64 64 64 64 ...
## $ Tavg                    : int   42 42 42 42 42 42 42 42 42 42 ...
## $ WnvPresent              : Factor w/ 2 levels "No","Yes": 1 1 1 1 1 1 1 1 1 1 ...
```

Appendix

General Setup: Clear environment, set working directory, load libraries, utilities

```
# Clear the working environment of variables, data, functions
rm(list=ls())

# Set working directory for this Kaggle project. Default: pwd.
#kaggleProjHomeDir <- "."
kaggleProjHomeDir <- "/Users/jimstearns/GoogleDrive/Learning/Courses/UWPCE-DataScience/Course3_DataScience"
setwd(kaggleProjHomeDir)
getwd()

#install.packages("rPython") # For download from web site with login/pwd.
library(rPython) # For calling python function to download file w/login+pwd
# Package for writing Weka ARFF file format
stopifnot(require("foreign"))
library("foreign")
# Package for calculating great circle distances
stopifnot(require("geosphere"))
library("geosphere")

# Return a data frame with the named column(s) moved to last position.
# Here, it will be the output classification, WnvPresent.
moveColToLast <- function(df, colsToMove) {
```

```
df[c(setdiff(names(df), colsToMove), colsToMove)]
}
```

Dataset download and unpacking

This R and Python code downloads the WNVP datasets from Kaggle. Some setup is required:

- One's Kaggle username and password must be defined as environment variables where R is running.
- Easiest way to set environment variable for R: Create (add to) ~/.Renvron file (kaggleUsername="XXXX" and kagglePassword="YYYY").

Alternatively, files can be downloaded manually.

```
wnvpTrainFilename <- "train.csv"
wnvpTestFilename <- "test.csv"
wnvpWeatherFilename <- "weather.csv"
wnvpSprayFilename <- "spray.csv"
kaggleDatasets = c(
  wnvpTrainFilename,
  wnvpTestFilename,
  wnvpWeatherFilename,
  wnvpSprayFilename)
dataSubDir <- "input" # Kaggle convention
workingSubDir <- "working" # Kaggle convention: massaged datasets - and output - go here.

wnvpTrainFileNRecs <- 10506 # Observation records in training file. Excludes header record.
wnvpTestFileNRecs <- 116293 # Records in test file supplied by Kaggle. Submission record cnt mu
# If download from Kaggle required, and user and pwd are empty (default),
# then user will be prompted for these two values.
kaggleUsername <- ""
kagglePassword <- ""

allKaggleFilesArePresent <- function() {
  filesAllFound <- TRUE
  for (file in kaggleDatasets) {
    if (!file.exists(paste0(dataSubDir, "/", file))) {
      print(paste("Error: could not find unzipped Kaggle file in PWD:", file))
      filesAllFound <- FALSE
    }
  }
  return(filesAllFound)
}

downloadMissingKaggleFiles <- function() {
  python.load("src/UrlFileDownloaderWithLogin.py")

  kaggleUsername = Sys.getenv("kaggleUsername")
  kagglePassword = Sys.getenv("kagglePassword")
  if (kaggleUsername == "" || kagglePassword == "") {
    print("Please assign kaggleUsername and kagglePassword environment variables.")
  }
}
```

```

    print("Place in ~/.Renviro entries such as kaggleUsername='YourName'.")
}
stopifnot(!(kaggleUsername == ""))
stopifnot(!(kagglePassword == ""))

wnvpKaggleDataUrl <-
  "https://www.kaggle.com/c/predict-west-nile-virus/download/"

for (file in kaggleDatasets) {
  if (file.exists(file))
    next

  urlOfZip <- paste0(wnvpKaggleDataUrl, file, ".zip")
  print(urlOfZip)
  # Use a python method to download from URL with login and password.
  # Download to subdirectory "input" and filename w/o the .zip suffix.
  python.call("Download", urlOfZip,
              kaggleUsername, kagglePassword ,
              paste0(dataSubDir, "/", file, ".zip"))
}
}

unzipDownloadedFiles <- function() {
  for (file in kaggleDatasets) {
    zippedFile <- paste0(dataSubDir, "/", file, ".zip")
    print(paste0("Unzip: ", zippedFile))
    if (file.exists(zippedFile)) {
      if (file.exists(file)) {
        print(sprintf("Warning: removing existing file %s\n", file))
        file.remove(file)
      }
      unzip(zippedFile, exdir=dataSubDir)
      print(sprintf("Unzipped: %s\n", zippedFile))
    }
  }
}

if (!allKaggleFilesArePresent()) {
  print(paste("Not all needed Kaggle datasets are present in PWD;",
              "attempting to download from Kaggle web site.))
  downloadMissingKaggleFiles()
  unzipDownloadedFiles()
}

```

File UrlFileDownloaderWithLogin.py:

```

__author__ = 'jimstearns'
""" Download a file at a URL at a web site that requires a user name and password.
"""

import logging

```

```

import os          # File utilities

# Python package "requests": "Python HTTP for Humans" by Kenneth Reitz. Current version: 2.7.0.
# Documented at http://docs.python-requests.org/en/latest/
# To install from the command line: "pip install requests"
# (On Mac, sudo may be required. Also pip2.7 instead of pip, depending on default Python version)

import requests # Http GET, POST

def Download(url, username, password, local_filename):
    # Login to web site such as Kaggle and retrieve the data. Use POST rather than GET as as to
    # send login info in body of HTTP request rather than in query string portion of URL.

    # Limitation: when used by Python version < 2.7.9, an "InsecureRequestWarning" is generated.
    # TODO: Fix. Details: https://urllib3.readthedocs.org/en/latest/security.html#insecureplatform
    # Workaround: log warnings to file, not stdout.
    logging.captureWarnings(True)

    if (os.path.exists(local_filename)):
        os.remove(local_filename)

    # This won't get the file, but use the return value URL in a follow-on POST:
    r = requests.get(url)

    login_info = {'UserName': '{0}'.format(username), 'Password': '{0}'.format(password) }
    print(login_info)
    r = requests.post(r.url, data = login_info)
    print("POST (w/login info): {0}\n".format(r.status_code))

    # Write the data to a local file one chunk at a time.
    chunk_size = 512 * 1024 # Reads 512KB at a time into memory
    with open(local_filename, 'wb') as fd:
        for chunk in r.iter_content(chunk_size): # Reads 512KB at a time into memory
            if chunk: # filter out keep-alive new chunks
                fd.write(chunk)

    if (os.path.exists(local_filename)):
        return(True)
    else:
        return(False)

```

Miscellaneous

Prepare Weka results as ARFF file as submittal file to Kaggle as CSV.

File PrepareWekaArffResultsForKaggleCsvSubmittal:

```

# Script to read in ARFF file created by Weka modeler,
# atrip all attributes except the predicted classification (here, "WnvPresent"),
# add an Id column with a sequence number equal to the record number; and
# write as a CSV file.

```



```
wnvpTestFileNRecs <- 116293 # Records in test file supplied by Kaggle. Submission record cnt must
arffInFilename <- "working/testClassified02"
testClassified_df <- read.arff(paste0(arffInFilename, ".arff"))
stopifnot(nrow(testClassified_df) == wnvpTestFileNRecs)
```

```
Id <- seq(1:wnvpTestFileNRecs)
colsToKeep <- c("predicted WnvPresent")
testClassified_df <- cbind(Id, testClassified_df[names(testClassified_df) %in% colsToKeep])
names(testClassified_df) <- c("Id", "WnvPresent")
# Write "No" as 0 and "Yes" as 1
testClassified_df$WnvPresent <- ifelse(testClassified_df$WnvPresent == "No", 0, 1)
str(testClassified_df)
```

```
write.csv(testClassified_df, paste0(arffInFilename, ".csv"), row.names=FALSE)
```

NOT USED

Distance function by “Curlew”

```
# From https://conservationecology.wordpress.com/2013/06/30/distance-between-two-points-in-r/
# Calculate distance in kilometers between two points
earth.dist <- function (long1, lat1, long2, lat2)
{
  rad <- pi/180
  a1 <- lat1 * rad
  a2 <- long1 * rad
  b1 <- lat2 * rad
  b2 <- long2 * rad
  dlon <- b2 - a2
  dlat <- b1 - a1
  a <- (sin(dlat/2))^2 + cos(a1) * cos(b1) * (sin(dlon/2))^2
  c <- 2 * atan2(sqrt(a), sqrt(1 - a))
  R <- 6378.145
  d <- R * c
  return(d)
}
```