

Final Project: Statistical Analysis

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Examining the relationship between manatee (*Trichechus manatus*) anatomy and environment and manatee death by watercraft collision.

INIT DATA FRAMES

```
mortDat <- read.csv("https://www.dropbox.com/s/jsfh8rq2ez0wsj8/ReformattedManateeMortalityData.csv")
cReg <- read.csv("https://www.dropbox.com/s/mpxmf4qn7aelr9v/CountyRegions.csv?dl=1") #Loads county regions
b <- mortDat$County[mortDat$County == c(cReg$North.West.Central[1])]
```

```
southCentralWest <- vector(length = length(mortDat$County)) #Holds booleans for region
northWestCentral <- vector(length = length(mortDat$County)) #Holds booleans for region
northEastCentral <- vector(length = length(mortDat$County)) #Holds booleans for region
southCentralEast <- vector(length = length(mortDat$County)) #Holds booleans for region
```

```
for(i in 1:length(cReg$South.Central.West)){
  southCentralWest <- (southCentralWest | (mortDat$County == as.character(cReg$South.Central.West[i])))
}
```

Places a True if County is a member of the region

```
for(i in 1:length(cReg$North.West.Central)){
  northWestCentral <- (northWestCentral | (mortDat$County == as.character(cReg$North.West.Central[i])))
}
```

Places a True if County is a member of the region

```
for(i in 1:length(cReg$North.East.Central)){
  northEastCentral <- (northEastCentral | (mortDat$County == as.character(cReg$North.East.Central[i])))
}
```

Places a True if County is a member of the region

```
for(i in 1:length(cReg$South.Central.East)){
  southCentralEast <- (southCentralEast | (mortDat$County == as.character(cReg$South.Central
})
```

Places a True if County is a member of the region

```
checker = southCentralWest | northWestCentral | northEastCentral | southCentralEast
```

Make sure that all the data gets assigned regions.

```
mortDat[, "Region"] = ifelse(southCentralWest == T,F,F)
mortDat[, "Region"][southCentralWest] = "SouthCentralWest"
mortDat[, "Region"][northWestCentral] = "NorthWestCentral"
mortDat[, "Region"][northEastCentral] = "NorthEastCentral"
mortDat[, "Region"][southCentralEast] = "SouthCentralEast"

winter <- vector(length = length(mortDat$Date))
spring <- vector(length = length(mortDat$Date))
summer <- vector(length = length(mortDat$Date))
fall <- vector(length = length(mortDat$Date))

mortDat[, "Season"] = ifelse(1==1, F,F) #Initialize a empty vector for season.

for(i in 1:length(mortDat$Date)){
  if((as.Date(mortDat$Date[i], "%m/%d") >= "2016-03-20")
    &&
    (as.Date(mortDat$Date[i], "%m/%d") < "2016-06-21")) {
    mortDat$Season[i] <- "Spring"
  }
  else{
    if((as.Date(mortDat$Date[i], "%m/%d") >= "2016-06-21")
      &&
      (as.Date(mortDat$Date[i], "%m/%d") < "2016-09-22")) {
      mortDat$Season[i] <- "Summer"
    }
    else{
      if((as.Date(mortDat$Date[i], "%m/%d") >= "2016-09-22")
        &&
        (as.Date(mortDat$Date[i], "%m/%d") < "2016-12-21")){
      mortDat$Season[i] <- "Fall"
    }else{
      mortDat$Season[i] <- "Winter"
    }
  }
}
```

```
}
}
```

```
naLOGI <- !is.na(mortDat$Size..cm.)
```

Locations that are not NA.

```
mortDat <- mortDat[naLOGI, ]
```

Removes the NAs from the data. Removes NAs from dataframe.

```
mortDat <- mortDat[mortDat$Size..cm. > 0, ]
```

Removes non positive values.

```
names(mortDat)[names(mortDat)=="Size..cm."] <- "Sizecm"
```

Changes the name of the column to Sizecm.
Create Collision Boolean

```
mortDat["Collision"] <- ifelse(mortDat$Probable.Cause == "Human Related: Watercraft Collision", 1, 0)
```

Adds a value to the datafram for the occurence of death by collision

AGGREGATION ON DATA

```
aggregate(Collision ~ Sex, mortDat, length) #Counting Sex Information
```

```
##      Sex Collision
## 1    F      4572
## 2    M      4935
## 3    U       376
```

```
aggregate(Collision ~ Region, mortDat, length) #Counting the region frequency
```

```
##              Region Collision
## 1 NorthEastCentral      898
## 2 NorthWestCentral      189
## 3 SouthCentralEast    4495
## 4 SouthCentralWest    4301
```

```
max(aggregate(Collision ~ Waterway, mortDat, length)["Collision"])
```

```
## [1] 1162
```

```
aggregate(Collision ~ County, mortDat, length) # Much more meaningful
```

##	County	Collision
## 1	Bay	9
## 2	Brevard	2067
## 3	Broward	283
## 4	Charlotte	360
## 5	Citrus	296
## 6	Clay	86
## 7	Collier	669
## 8	DeSoto	16
## 9	Dixie	25
## 10	Duval	430
## 11	Escambia	5
## 12	Flagler	93
## 13	Franklin	16
## 14	Gilchrist	3
## 15	Glades	139
## 16	Gulf	7
## 17	Hendry	18
## 18	Hernando	22
## 19	Highlands	1
## 20	Hillsborough	297
## 21	Indian River	270
## 22	Lake	26
## 23	Lee	1746
## 24	Levy	84
## 25	Manatee	188
## 26	Marion	3
## 27	Martin	249
## 28	Miami-Dade	329
## 29	Monroe	349
## 30	Nassau	34
## 31	Okaloosa	4
## 32	Okeechobee	35
## 33	Palm Beach	246
## 34	Pasco	46
## 35	Pinellas	219
## 36	Putnam	106
## 37	Santa Rosa	2
## 38	Sarasota	285
## 39	Seminole	12
## 40	St. Johns	107
## 41	St. Lucie	159
## 42	Taylor	11
## 43	Volusia	508

```
## 44      Wakulla      17
## 45      Walton      6

aggregate(Collision ~ Sex, mortDat, sum) # Males have a higher incidence of collisions but not females

##      Sex Collision
## 1    F      1055
## 2    M      1078
## 3    U       14

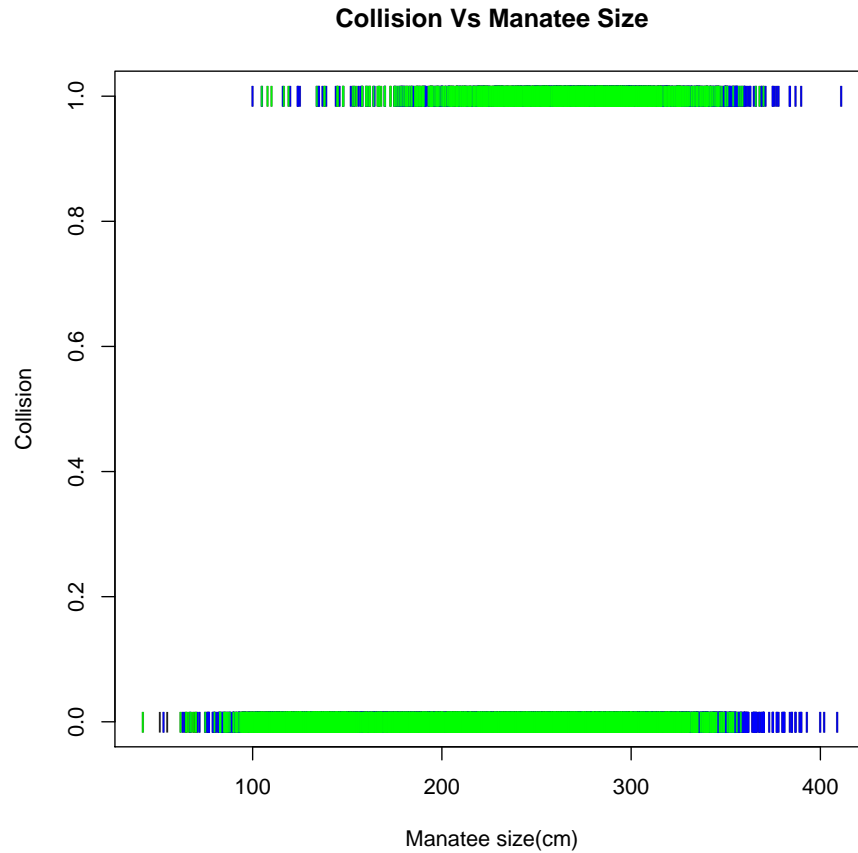
aggregate(Sizecm ~ Collision, mortDat, mean)

##      Collision      Sizecm
## 1      FALSE 218.0519
## 2       TRUE 271.0433
```

Size is considerably higher in average with Collision. 271.0433 average in collision vs 218.0519 without.

Visualizations

```
plot(Collision ~ Sizecm, mortDat, pch = "|", xlab = "Manatee size(cm)",
      ylab = "Collision", main="Collision Vs Manatee Size")
mdm <- mortDat[mortDat$Sex == "M",]
mdf <- mortDat[mortDat$Sex == "F",]
mdc <- mortDat[(mortDat$Sex == "M") | (mortDat$Sex == "F") ,]
points(mdf$Sizecm, mdf$Collision, pch = "|", col = "blue") # Mort Dat Female
points(mdm$Sizecm, mdm$Collision, pch = "|", col = "green") # Mort Dat Male
```



```

wc <- mortDat[mortDat['Collision'] == TRUE, ] #Population with collision
nc <- mortDat[mortDat['Collision'] == FALSE, ] #Population without collision

aggregate(Collision ~ Season, wc, length) #Some Evidence of a difference by Season.

##   Season Collision
## 1  Fall         371
## 2 Spring        660
## 3 Summer        578
## 4 Winter        538

```

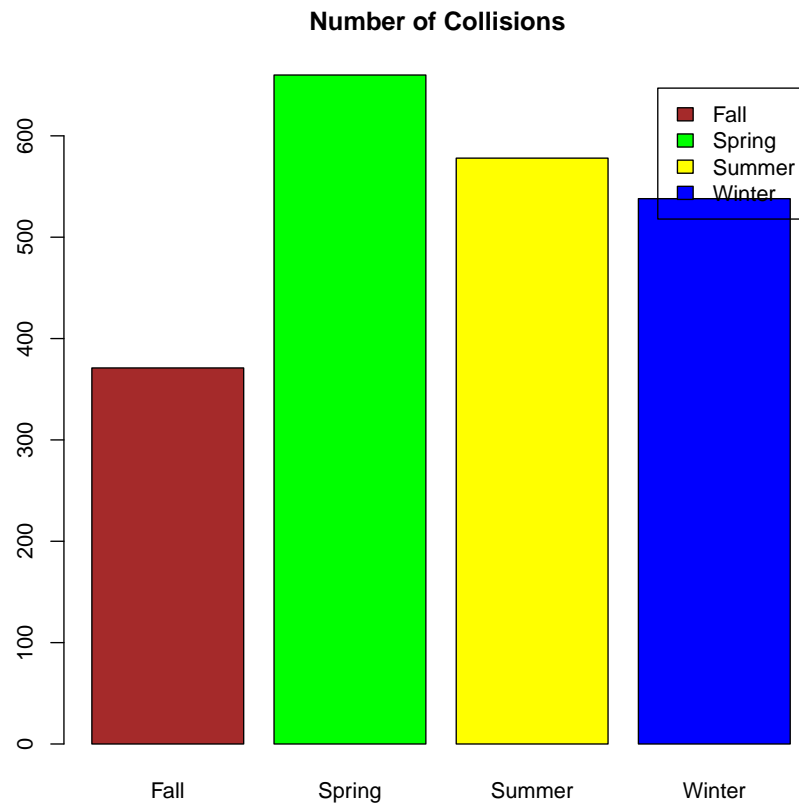
Season Visulization

```

season = wc["Season"]
season.freq = table(season)
colors = c("brown", "green", "yellow", "blue")

```

```
barplot(season.freq, col=colors, legend = rownames(season.freq), main="Number of Coll
```



Random sampling based Nonmetric Multidimensional Scaling Code

```
library(vegan)

## Loading required package: permute
## Loading required package: lattice
## This is vegan 2.3-4

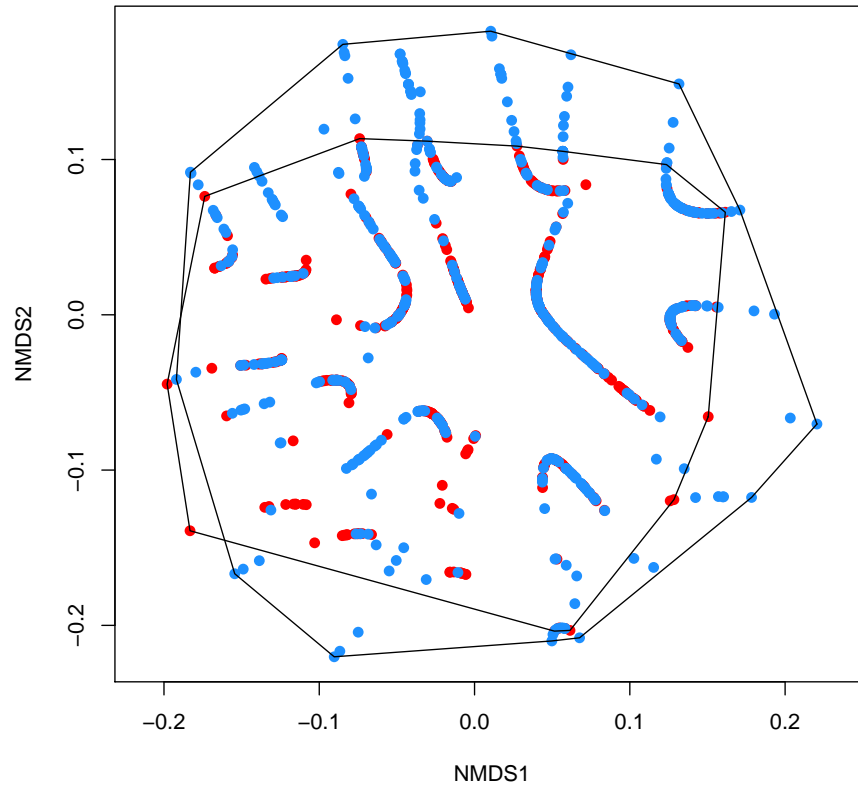
alt <- mortDat[!(mortDat["Sex"] == "U"),]
alt <- alt[,c("Region", "Sex", "Sizecm", "Season", "Collision")]
altP <- alt[alt$Collision == TRUE, c("Region", "Sex", "Sizecm", "Season", "Collision")] #Co
```

```
altNP <- alt[alt$Collision == FALSE, c("Region", "Sex", "Sizecm", "Season", "Collision")] #\naltR <- rbind(altP[sample(1:length(altP$Region), 500),], altNP[sample(1:length(altNP$Region),
```

New sample set composed of 500 datapoints each from collision and non-collision.

```
#Ordinates categorical variables to be numerical factors\naltR$Region <- as.numeric(factor(altR$Region , levels=unique(alt$Region)))\naltR$Sex <- as.numeric(factor(altR$Sex , levels=unique(alt$Sex)))\naltR$Season <- as.numeric(factor(altR$Season , levels=unique(alt$Season)))\naltR$Collision <- as.numeric(factor(altR$Collision , levels=unique(alt$Collision)))\n\nc.mds <- metaMDS(altR[,1:4], zerodist="add")\n\n## Square root transformation\n## Wisconsin double standardization\n## Zero dissimilarities changed into 0.0001038296\n## Run 0 stress 0.1893291\n## Run 1 stress 0.1950198\n## Run 2 stress 0.1955467\n## Run 3 stress 0.1954207\n## Run 4 stress 0.4203501\n## Run 5 stress 0.192938\n## Run 6 stress 0.1894116\n## ... procrustes: rmse 0.002177115 max resid 0.06859807\n## Run 7 stress 0.195726\n## Run 8 stress 0.1912247\n## Run 9 stress 0.195569\n## Run 10 stress 0.1935351\n## Run 11 stress 0.1909318\n## Run 12 stress 0.1948448\n## Run 13 stress 0.1926753\n## Run 14 stress 0.1902997\n## Run 15 stress 0.1928693\n## Run 16 stress 0.1949402\n## Run 17 stress 0.1902939\n## Run 18 stress 0.1949735\n## Run 19 stress 0.1949626\n## Run 20 stress 0.1926543\n\npar(mfcol = c(1,1))\nfig <- ordiplot(c.mds, type = "none", main = "NMDS for Collision and Non-Collision Communiti\npoints(fig, "sites", pch=16, col=c("dodgerblue", "red")[altR$Collision], bg="white", cex=1.1\nordihull(c.mds, altR$Collision == "2", display = "sites", draw = "polygon")
```

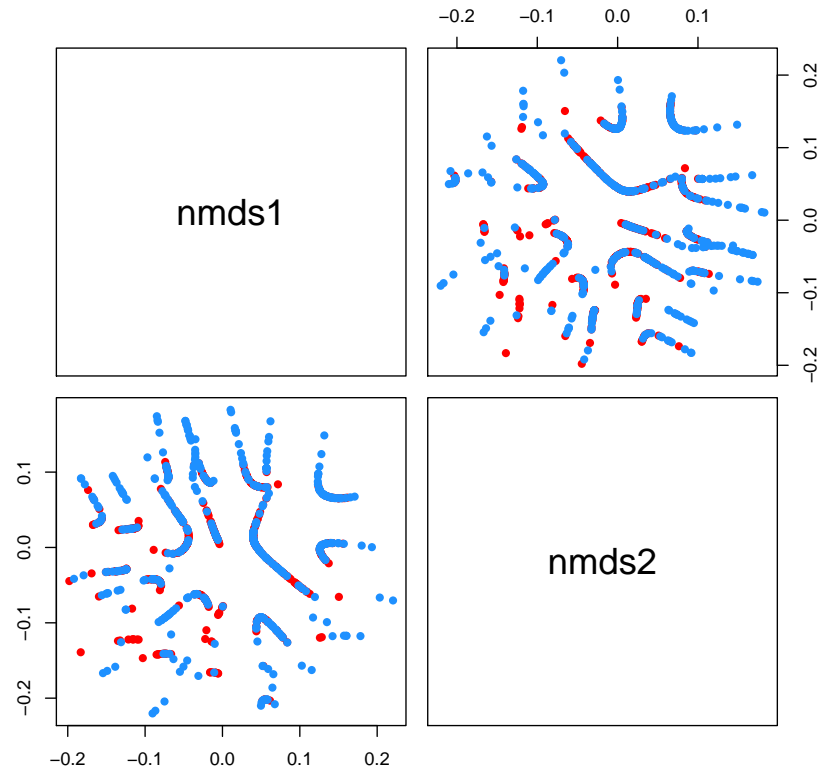

NMDS for Collision and Non-Collision Communities



```
altR$nm1 <- c.mds$points[,1]
altR$nm2 <- c.mds$points[,2]

pairs(altR[,6:7], col= c("dodgerblue", "red")[altR$Collision], pch = 16, main = "NMDS for C
```

NMDS for Collision and Non-Collision Communities



Generalized Linear Modeling Selection Process

```
library(xtable)
#Model Selection

mortD <- mortDat[!(mortDat["Sex"] == "U"),]

options(na.action = "na.fail") #Specifies NA treatment
subset <- mortD[c("Sizecm", "Region", "Sex", "Season", "Collision")] #Subsets data to the exp
maximal <- glm(Collision ~ Sizecm*Region*Sex*Season, data = subset, family = binomial, na.action = na.fail)
```

STEP AIC Method

```

model <- glm(Collision ~ Sizecm*Region*Sex*Season, data = mortD, family = binomial, na.action = na.fail)
summary(model)

##
## Call:
## glm(formula = Collision ~ Sizecm * Region * Sex * Season, family = binomial,
##      data = mortD, na.action = na.fail)
##
## Deviance Residuals:
##      Min       1Q   Median       3Q      Max
## -1.8715  -0.7261  -0.4646  -0.2902   2.5633
##
## Coefficients:
##                                     Estimate Std. Error
## (Intercept)                       -3.9792753   1.4904950
## Sizecm                             0.0105109   0.0053728
## RegionNorthWestCentral             -1.4770445   4.2154018
## RegionSouthCentralEast             -0.2374862   1.6135738
## RegionSouthCentralWest              0.9182840   1.5967759
## SexM                               1.6645543   1.8710938
## SeasonSpring                       0.9858437   1.6836772
## SeasonSummer                       1.2378793   1.6882345
## SeasonWinter                      -1.5663994   2.2063178
## Sizecm:RegionNorthWestCentral       0.0091041   0.0167030
## Sizecm:RegionSouthCentralEast       0.0004921   0.0058147
## Sizecm:RegionSouthCentralWest      -0.0020174   0.0057789
## Sizecm:SexM                        -0.0027896   0.0068306
## RegionNorthWestCentral:SexM        -1.0431218   7.0328503
## RegionSouthCentralEast:SexM        -2.0036415   2.0626063
## RegionSouthCentralWest:SexM        -2.5748479   2.0450856
## Sizecm:SeasonSpring                -0.0006557   0.0060754
## Sizecm:SeasonSummer                -0.0038117   0.0060281
## Sizecm:SeasonWinter                0.0033545   0.0081739
## RegionNorthWestCentral:SeasonSpring 1.3086386   4.5601541
## RegionSouthCentralEast:SeasonSpring -1.0267916   1.8505785
## RegionSouthCentralWest:SeasonSpring -0.9823429   1.8132461
## RegionNorthWestCentral:SeasonSummer 0.7322562   5.2893006
## RegionSouthCentralEast:SeasonSummer -0.9318533   1.8636635
## RegionSouthCentralWest:SeasonSummer -1.7804699   1.8348033
## RegionNorthWestCentral:SeasonWinter 1.5541247   6.3392272
## RegionSouthCentralEast:SeasonWinter 1.2099843   2.3350573
## RegionSouthCentralWest:SeasonWinter 0.3312152   2.3322402
## SexM:SeasonSpring                  -6.2511615   2.4824137
## SexM:SeasonSummer                  -3.6821017   2.2920365
## SexM:SeasonWinter                  -0.6042932   3.0577212
## Sizecm:RegionNorthWestCentral:SexM -0.0035674   0.0254683

```

## Sizecm:RegionSouthCentralEast:SexM	0.0053262	0.0075449
## Sizecm:RegionSouthCentralWest:SexM	0.0062116	0.0075196
## Sizecm:RegionNorthWestCentral:SeasonSpring	-0.0128531	0.0179025
## Sizecm:RegionSouthCentralEast:SeasonSpring	0.0022954	0.0066838
## Sizecm:RegionSouthCentralWest:SeasonSpring	0.0011069	0.0065784
## Sizecm:RegionNorthWestCentral:SeasonSummer	-0.0107289	0.0205092
## Sizecm:RegionSouthCentralEast:SeasonSummer	0.0032662	0.0066546
## Sizecm:RegionSouthCentralWest:SeasonSummer	0.0074382	0.0065887
## Sizecm:RegionNorthWestCentral:SeasonWinter	-0.0098543	0.0266129
## Sizecm:RegionSouthCentralEast:SeasonWinter	-0.0021934	0.0086336
## Sizecm:RegionSouthCentralWest:SeasonWinter	-0.0016841	0.0086384
## Sizecm:SexM:SeasonSpring	0.0210785	0.0089779
## Sizecm:SexM:SeasonSummer	0.0134853	0.0083013
## Sizecm:SexM:SeasonWinter	-0.0022245	0.0115304
## RegionNorthWestCentral:SexM:SeasonSpring	2.5499119	7.6373634
## RegionSouthCentralEast:SexM:SeasonSpring	6.2649663	2.7052993
## RegionSouthCentralWest:SexM:SeasonSpring	6.3158963	2.6766517
## RegionNorthWestCentral:SexM:SeasonSummer	2.8314487	8.2198145
## RegionSouthCentralEast:SexM:SeasonSummer	3.2718067	2.5471781
## RegionSouthCentralWest:SexM:SeasonSummer	3.1578815	2.5416806
## RegionNorthWestCentral:SexM:SeasonWinter	1.6978567	9.5858797
## RegionSouthCentralEast:SexM:SeasonWinter	0.9962753	3.2440849
## RegionSouthCentralWest:SexM:SeasonWinter	1.5897948	3.2494577
## Sizecm:RegionNorthWestCentral:SexM:SeasonSpring	0.0031795	0.0279352
## Sizecm:RegionSouthCentralEast:SexM:SeasonSpring	-0.0219140	0.0098254
## Sizecm:RegionSouthCentralWest:SexM:SeasonSpring	-0.0224944	0.0097599
## Sizecm:RegionNorthWestCentral:SexM:SeasonSummer	-0.0007464	0.0299511
## Sizecm:RegionSouthCentralEast:SexM:SeasonSummer	-0.0109615	0.0092528
## Sizecm:RegionSouthCentralWest:SexM:SeasonSummer	-0.0105737	0.0093010
## Sizecm:RegionNorthWestCentral:SexM:SeasonWinter	-0.0023414	0.0370964
## Sizecm:RegionSouthCentralEast:SexM:SeasonWinter	-0.0003113	0.0122189
## Sizecm:RegionSouthCentralWest:SexM:SeasonWinter	-0.0016075	0.0122604
##	z value Pr(> z)	
## (Intercept)	-2.670	0.00759 **
## Sizecm	1.956	0.05043 .
## RegionNorthWestCentral	-0.350	0.72604
## RegionSouthCentralEast	-0.147	0.88299
## RegionSouthCentralWest	0.575	0.56523
## SexM	0.890	0.37367
## SeasonSpring	0.586	0.55819
## SeasonSummer	0.733	0.46341
## SeasonWinter	-0.710	0.47773
## Sizecm:RegionNorthWestCentral	0.545	0.58571
## Sizecm:RegionSouthCentralEast	0.085	0.93255
## Sizecm:RegionSouthCentralWest	-0.349	0.72702

## Sizecm:SexM	-0.408	0.68298
## RegionNorthWestCentral:SexM	-0.148	0.88209
## RegionSouthCentralEast:SexM	-0.971	0.33134
## RegionSouthCentralWest:SexM	-1.259	0.20802
## Sizecm:SeasonSpring	-0.108	0.91405
## Sizecm:SeasonSummer	-0.632	0.52718
## Sizecm:SeasonWinter	0.410	0.68152
## RegionNorthWestCentral:SeasonSpring	0.287	0.77413
## RegionSouthCentralEast:SeasonSpring	-0.555	0.57900
## RegionSouthCentralWest:SeasonSpring	-0.542	0.58798
## RegionNorthWestCentral:SeasonSummer	0.138	0.88989
## RegionSouthCentralEast:SeasonSummer	-0.500	0.61707
## RegionSouthCentralWest:SeasonSummer	-0.970	0.33185
## RegionNorthWestCentral:SeasonWinter	0.245	0.80633
## RegionSouthCentralEast:SeasonWinter	0.518	0.60433
## RegionSouthCentralWest:SeasonWinter	0.142	0.88707
## SexM:SeasonSpring	-2.518	0.01180 *
## SexM:SeasonSummer	-1.606	0.10817
## SexM:SeasonWinter	-0.198	0.84334
## Sizecm:RegionNorthWestCentral:SexM	-0.140	0.88860
## Sizecm:RegionSouthCentralEast:SexM	0.706	0.48023
## Sizecm:RegionSouthCentralWest:SexM	0.826	0.40877
## Sizecm:RegionNorthWestCentral:SeasonSpring	-0.718	0.47279
## Sizecm:RegionSouthCentralEast:SeasonSpring	0.343	0.73128
## Sizecm:RegionSouthCentralWest:SeasonSpring	0.168	0.86638
## Sizecm:RegionNorthWestCentral:SeasonSummer	-0.523	0.60089
## Sizecm:RegionSouthCentralEast:SeasonSummer	0.491	0.62356
## Sizecm:RegionSouthCentralWest:SeasonSummer	1.129	0.25892
## Sizecm:RegionNorthWestCentral:SeasonWinter	-0.370	0.71117
## Sizecm:RegionSouthCentralEast:SeasonWinter	-0.254	0.79946
## Sizecm:RegionSouthCentralWest:SeasonWinter	-0.195	0.84543
## Sizecm:SexM:SeasonSpring	2.348	0.01888 *
## Sizecm:SexM:SeasonSummer	1.624	0.10428
## Sizecm:SexM:SeasonWinter	-0.193	0.84702
## RegionNorthWestCentral:SexM:SeasonSpring	0.334	0.73848
## RegionSouthCentralEast:SexM:SeasonSpring	2.316	0.02057 *
## RegionSouthCentralWest:SexM:SeasonSpring	2.360	0.01829 *
## RegionNorthWestCentral:SexM:SeasonSummer	0.344	0.73050
## RegionSouthCentralEast:SexM:SeasonSummer	1.284	0.19897
## RegionSouthCentralWest:SexM:SeasonSummer	1.242	0.21407
## RegionNorthWestCentral:SexM:SeasonWinter	0.177	0.85941
## RegionSouthCentralEast:SexM:SeasonWinter	0.307	0.75876
## RegionSouthCentralWest:SexM:SeasonWinter	0.489	0.62467
## Sizecm:RegionNorthWestCentral:SexM:SeasonSpring	0.114	0.90938
## Sizecm:RegionSouthCentralEast:SexM:SeasonSpring	-2.230	0.02572 *

```

## Sizecm:RegionSouthCentralWest:SexM:SeasonSpring -2.305 0.02118 *
## Sizecm:RegionNorthWestCentral:SexM:SeasonSummer -0.025 0.98012
## Sizecm:RegionSouthCentralEast:SexM:SeasonSummer -1.185 0.23615
## Sizecm:RegionSouthCentralWest:SexM:SeasonSummer -1.137 0.25561
## Sizecm:RegionNorthWestCentral:SexM:SeasonWinter -0.063 0.94967
## Sizecm:RegionSouthCentralEast:SexM:SeasonWinter -0.025 0.97968
## Sizecm:RegionSouthCentralWest:SexM:SeasonWinter -0.131 0.89569
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
##      Null deviance: 10122.5  on 9506  degrees of freedom
## Residual deviance:  8778.3  on 9443  degrees of freedom
## AIC: 8906.3
##
## Number of Fisher Scoring iterations: 5

model2 <- step(model) #Step AIC model reduction

## Start:  AIC=8906.29
## Collision ~ Sizecm * Region * Sex * Season
##
##              Df Deviance    AIC
## - Sizecm:Region:Sex:Season  9   8787.5 8897.5
## <none>                      8778.3 8906.3
##
## Step:  AIC=8897.54
## Collision ~ Sizecm + Region + Sex + Season + Sizecm:Region +
##      Sizecm:Sex + Region:Sex + Sizecm:Season + Region:Season +
##      Sex:Season + Sizecm:Region:Sex + Sizecm:Region:Season + Sizecm:Sex:Season +
##      Region:Sex:Season
##
##              Df Deviance    AIC
## - Region:Sex:Season      9   8796.4 8888.4
## - Sizecm:Region:Season   9   8800.5 8892.5
## - Sizecm:Region:Sex      3   8791.7 8895.7
## <none>                   8787.5 8897.5
## - Sizecm:Sex:Season      3   8793.8 8897.8
##
## Step:  AIC=8888.39
## Collision ~ Sizecm + Region + Sex + Season + Sizecm:Region +
##      Sizecm:Sex + Region:Sex + Sizecm:Season + Region:Season +
##      Sex:Season + Sizecm:Region:Sex + Sizecm:Region:Season + Sizecm:Sex:Season
##
##              Df Deviance    AIC

```

```

## - Sizecm:Region:Season 9 8809.3 8883.3
## - Sizecm:Region:Sex 3 8800.5 8886.5
## <none> 8796.4 8888.4
## - Sizecm:Sex:Season 3 8802.6 8888.6
##
## Step: AIC=8883.28
## Collision ~ Sizecm + Region + Sex + Season + Sizecm:Region +
## Sizecm:Sex + Region:Sex + Sizecm:Season + Region:Season +
## Sex:Season + Sizecm:Region:Sex + Sizecm:Sex:Season
##
## Df Deviance AIC
## - Sizecm:Region:Sex 3 8813.7 8881.7
## - Sizecm:Sex:Season 3 8815.1 8883.1
## <none> 8809.3 8883.3
## - Region:Season 9 8870.9 8926.9
##
## Step: AIC=8881.75
## Collision ~ Sizecm + Region + Sex + Season + Sizecm:Region +
## Sizecm:Sex + Region:Sex + Sizecm:Season + Region:Season +
## Sex:Season + Sizecm:Sex:Season
##
## Df Deviance AIC
## - Sizecm:Region 3 8816.7 8878.7
## <none> 8813.7 8881.7
## - Sizecm:Sex:Season 3 8820.9 8882.9
## - Region:Sex 3 8825.6 8887.6
## - Region:Season 9 8875.5 8925.5
##
## Step: AIC=8878.72
## Collision ~ Sizecm + Region + Sex + Season + Sizecm:Sex + Region:Sex +
## Sizecm:Season + Region:Season + Sex:Season + Sizecm:Sex:Season
##
## Df Deviance AIC
## <none> 8816.7 8878.7
## - Sizecm:Sex:Season 3 8824.1 8880.1
## - Region:Sex 3 8827.9 8883.9
## - Region:Season 9 8878.7 8922.7

summary(model2)

##
## Call:
## glm(formula = Collision ~ Sizecm + Region + Sex + Season + Sizecm:Sex +
## Region:Sex + Sizecm:Season + Region:Season + Sex:Season +
## Sizecm:Sex:Season, family = binomial, data = mortD, na.action = na.fail)
##

```

```

## Deviance Residuals:
##      Min       1Q   Median       3Q      Max
## -1.7406  -0.7283  -0.4632  -0.2910   2.7645
##
## Coefficients:
##                                Estimate Std. Error z value Pr(>|z|)
## (Intercept)                   -3.5588986   0.4598964  -7.738 1.01e-14
## Sizecm                        0.0098506   0.0014597   6.748 1.50e-11
## RegionNorthWestCentral        -0.6669296   0.7127040  -0.936 0.349390
## RegionSouthCentralEast        -0.3498613   0.2639951  -1.325 0.185086
## RegionSouthCentralWest         0.1258460   0.2587647   0.486 0.626731
## SexM                          -0.0807929   0.5870742  -0.138 0.890541
## SeasonSpring                   0.4529067   0.5386926   0.841 0.400487
## SeasonSummer                  -0.2445034   0.5647746  -0.433 0.665071
## SeasonWinter                  -1.6186623   0.5857172  -2.764 0.005718
## Sizecm:SexM                   0.0022902   0.0021008   1.090 0.275643
## RegionNorthWestCentral:SexM    0.1580309   0.5725747   0.276 0.782548
## RegionSouthCentralEast:SexM   -0.2081688   0.1938159  -1.074 0.282798
## RegionSouthCentralWest:SexM   -0.4996420   0.1927597  -2.592 0.009541
## Sizecm:SeasonSpring            0.0004482   0.0017497   0.256 0.797839
## Sizecm:SeasonSummer            0.0007891   0.0018095   0.436 0.662758
## Sizecm:SeasonWinter            0.0013904   0.0018874   0.737 0.461330
## RegionNorthWestCentral:SeasonSpring -0.0543141   0.6962555  -0.078 0.937821
## RegionSouthCentralEast:SeasonSpring -0.1620992   0.2923679  -0.554 0.579281
## RegionSouthCentralWest:SeasonSpring -0.4580531   0.2867128  -1.598 0.110131
## RegionNorthWestCentral:SeasonSummer -0.1862646   0.8483267  -0.220 0.826208
## RegionSouthCentralEast:SeasonSummer  0.2058133   0.2985816   0.689 0.490632
## RegionSouthCentralWest:SeasonSummer  0.4360056   0.2940571   1.483 0.138148
## RegionNorthWestCentral:SeasonWinter -0.4387200   0.8339371  -0.526 0.598831
## RegionSouthCentralEast:SeasonWinter  1.1658173   0.3178515   3.668 0.000245
## RegionSouthCentralWest:SeasonWinter  0.5518911   0.3168227   1.742 0.081516
## SexM:SeasonSpring              -0.7388077   0.6850617  -1.078 0.280831
## SexM:SeasonSummer              -0.7798668   0.7235299  -1.078 0.281094
## SexM:SeasonWinter              0.4416666   0.7329603   0.603 0.546789
## Sizecm:SexM:SeasonSpring        0.0018851   0.0025771   0.731 0.464478
## Sizecm:SexM:SeasonSummer        0.0039181   0.0027047   1.449 0.147443
## Sizecm:SexM:SeasonWinter       -0.0024947   0.0027598  -0.904 0.366013
##
## (Intercept)                    ***
## Sizecm                         ***
## RegionNorthWestCentral
## RegionSouthCentralEast
## RegionSouthCentralWest
## SexM
## SeasonSpring

```



```
## SeasonSummer
## SeasonWinter                **
## Sizecm:SexM
## RegionNorthWestCentral:SexM
## RegionSouthCentralEast:SexM
## RegionSouthCentralWest:SexM  **
## Sizecm:SeasonSpring
## Sizecm:SeasonSummer
## Sizecm:SeasonWinter
## RegionNorthWestCentral:SeasonSpring
## RegionSouthCentralEast:SeasonSpring
## RegionSouthCentralWest:SeasonSpring
## RegionNorthWestCentral:SeasonSummer
## RegionSouthCentralEast:SeasonSummer
## RegionSouthCentralWest:SeasonSummer
## RegionNorthWestCentral:SeasonWinter
## RegionSouthCentralEast:SeasonWinter ***
## RegionSouthCentralWest:SeasonWinter .
## SexM:SeasonSpring
## SexM:SeasonSummer
## SexM:SeasonWinter
## Sizecm:SexM:SeasonSpring
## Sizecm:SexM:SeasonSummer
## Sizecm:SexM:SeasonWinter
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
##      Null deviance: 10122.5  on 9506  degrees of freedom
## Residual deviance:  8816.7  on 9476  degrees of freedom
## AIC: 8878.7
##
## Number of Fisher Scoring iterations: 5
```

Resulting models

```
stepAICModel <- glm(formula = Collision ~ Sizecm + Region + Sex + Season + Sizecm:Sex +
  Region:Sex + Sizecm:Season + Region:Season + Sex:Season +
  Sizecm:Sex:Season, family = binomial, data = mortD, na.action = na.fail)
```

Step AIC Reduced Model

```
oneStep <- glm(formula = Collision ~ Sizecm + Region + Sex + Season + Sizecm:Sex +
               Region:Sex + Region:Season + Sex:Season +
               Sizecm:Sex:Season, family = binomial, data = mortD, na.action = na.fail)
```

Removal of Sex:Season in comparison to StepAIC model

```
oneStepAlt <- glm(formula = Collision ~ Sizecm + Region + Sex + Season + Sizecm:Sex +
                  Region:Sex + Sizecm:Season + Region:Season + Sex:Season ,
                  family = binomial, data = mortD, na.action = na.fail)
```

Removal of Sizecm:Sex:Season in comparison to StepAIC model

Dredge Model

```
library(MuMIn)
dd <- dredge(maximal)

## Fixed term is "(Intercept)"
```

Produces model selection table based on AIC ranking from low to high by recursively making all model combinations from the largest possible model.

```
dredgeModel <- glm(Collision ~ Region + Season + Sex + Sizecm + Region:Season + Region:Sex +
maximal <- glm(Collision ~ Sizecm*Region*Sex*Season, data = subset, family = binomial, na.action = na.omit)
```

Anova Table Generation

```
#Anova Table Generation Code.

print(xtable(anova(maximal, stepAICModel, test="Chi"))) #Anova Table for maximal model vs Dredge Model

## % latex table generated in R 3.2.3 by xtable 1.8-2 package
## % Mon Mar 14 01:46:51 2016
## \begin{table}[ht]
## \centering
## \begin{tabular}{lrrrrr}
## \hline
## & Resid. Df & Resid. Dev & Df & Deviance & Pr(>$Chi) \\
## \hline
## 1 & 9443 & 8778.29 & & & \\
## 2 & 9476 & 8816.72 & -33 & -38.43 & 0.2369 \\
## \hline
## \end{tabular}
## \end{table}
```

```

print(xtable(anova(maximal, dredgeModel, test="Chi")) #Anova Table for maximal model vs Dr

## % latex table generated in R 3.2.3 by xtable 1.8-2 package
## % Mon Mar 14 01:46:51 2016
## \begin{table}[ht]
## \centering
## \begin{tabular}{lrrrrr}
## \hline
## & Resid. Df & Resid. Dev & Df & Deviance & Pr(>Chi) \\
## \hline
## 1 & 9443 & 8778.29 & & & \\
## 2 & 9482 & 8828.62 & -39 & -50.33 & 0.1056 \\
## \hline
## \end{tabular}
## \end{table}

print(xtable(anova(maximal, oneStep, oneStepAlt, dredgeModel, test="Chi")) #Anova Table for

## % latex table generated in R 3.2.3 by xtable 1.8-2 package
## % Mon Mar 14 01:46:51 2016
## \begin{table}[ht]
## \centering
## \begin{tabular}{lrrrrr}
## \hline
## & Resid. Df & Resid. Dev & Df & Deviance & Pr(>Chi) \\
## \hline
## 1 & 9443 & 8778.29 & & & \\
## 2 & 9476 & 8816.72 & -33 & -38.43 & 0.2369 \\
## 3 & 9479 & 8824.05 & -3 & -7.33 & 0.0622 \\
## 4 & 9482 & 8828.62 & -3 & -4.57 & 0.2059 \\
## \hline
## \end{tabular}
## \end{table}

```