Practice Markdown Script for Alaska Plaice GAMs

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Loading Alaska Plaice Data and Environmental Data

This chunk will load Alaska plaice data into the global environment. This dataset includes

When you click the **Knit** button a document will be generated that includes both content as well as the output of any embedded R code chunks within the document.

aplarv.ctd<-read.csv(file='../Ichthyo Data/Cleaned_Cut_ApLarv_wCTD.csv',header=TRUE,check.names=TRUE) head(aplarv.ctd)

```
CRUISE STATION HAUL
                                 GMT_DATE_TIME
                                                              HAUL_ID Cper10m2
##
## 1
      9
          4MF07
                       5
                            2 2007-05-08 17:47
                                                    4MF07 5 2 60BON 1
  2 10
          4MF07
                      22
                            2 2007-05-10 15:06
                                                   4MF07 22 2 60BON
## 3 13
          4MF07
                      74
                              2007-05-15 23:40
                                                   4MF07 74 2 60BON
                                                                              0
                                                                              0
##
  4 14 BE13-03
                     172
                              2013-09-17 16:04 BE13-03 172 2 60BON
                                                                              0
## 5 15 BE13-03
                     176
                               2013-09-19 3:19 BE13-03 176 2 60BON 1
  6 17 BE13-03
                     195
                            2 2013-09-24 16:07 BE13-03 195 2 60BON 1
##
     Cper1000m3 year month
                                 lat
                                            lon doy
                                                          vol bottom_depth
## 1
              0 2007
                          5 55.41167 -169.3653 128 408.73367
                                                                       2364
## 2
                          5 55.72917 -170.1652 130 358.30121
              0 2007
                                                                       2428
## 3
              0 2007
                          5 55.79016 -172.6337 135
                                                                       3205
                                                   387.37268
## 4
              0 2013
                          9 63.49245 -165.9990 260
                                                     42.49383
                                                                         25
## 5
              0 2013
                                                                         26
                          9 63.00184 -167.0096 262
                                                     36.63332
## 6
                2013
                          9 60.51539 -168.0088 267
                                                     21.49008
                                                                         30
##
                                                     id count
                                                               SS
                                                                         date
                                                                                 SSB
       4MF07_55.41167_-169.36533_2007-05-08 17:47_505
                                                            0 446 2007-05-08 234261
## 1
       4MF07_55.72917_-170.16516_2007-05-10 15:06_505
##
  2
                                                            0 446 2007-05-10 234261
       4MF07_55.79016_-172.63367_2007-05-15 23:40_505
                                                              446 2007-05-15 234261
  4 BE13-03_63.49245_-165.99901_2013-09-17 16:04_505
                                                               63 2013-09-17 234526
      BE13-03_63.00184_-167.00956_2013-09-19 3:19_505
                                                               63 2013-09-19 234526
   6 BE13-03_60.51539_-168.00882_2013-09-24 16:07_505
                                                            0
                                                               63 2013-09-24 234526
##
           Link_ID temperature salinity
                                            CTD_date
                                                          CTD_link CTD_time
## 1
         4MF07_5_2
                      3.693791 32.84541 2007-05-08
                                                         4MF07_5_2
                                                                        1747
## 2
        4MF07_22_2
                       3.121164 32.18688 2007-05-10
                                                        4MF07_22_2
                                                                        1506
## 3
        4MF07 74 2
                      3.128455 32.32710 2007-05-15
                                                        4MF07 74 2
                                                                        2325
## 4 BE13-03_172_2
                      9.476573 30.58420 2013-09-17 BE13-03_172_2
                                                                        1604
  5 BE13-03_176_2
                      9.027160 30.45578 2013-09-19 BE13-03_176_2
                                                                         319
   6 BE13-03_195_2
                      9.293682 30.70109 2013-09-24 BE13-03_195_2
                                                                        1607
##
     date_diff
## 1
             0
## 2
             0
```

```
0
## 3
## 4
               0
## 5
               0
## 6
               0
```

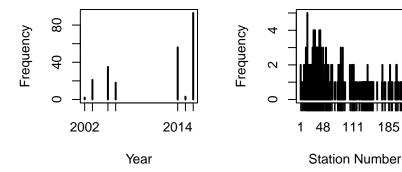
These data include the cruise on which ichthyoplankton were collected, the station and haul which indicate location and net deployment, respectively, the catch per area and catch per volume, the year, day of year, geographic position, and the raw count of larvae.

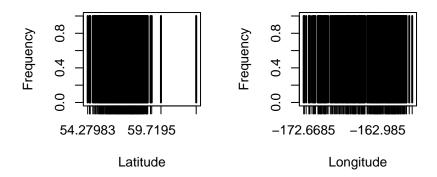
Initial Data Visualization

Before continuing on to the creation of a generalized additive model, it is instructive to generate plots to better visualize these data.

```
windows()
par(mfrow=c(2,2))
plot(table(aplarv.ctd$year[aplarv.ctd$Cper10m2>0]),ylab='Frequency',xlab='Year')
plot(table(aplarv.ctd$STATION[aplarv.ctd$Cper10m2>0]), ylab='Frequency', xlab='Station Number')
plot(table(aplarv.ctd$lat[aplarv.ctd$Cper10m2>0]),ylab='Frequency',xlab='Latitude')
plot(table(aplarv.ctd$lon[aplarv.ctd$Cper10m2>0]),ylab='Frequency',xlab='Longitude')
```

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Now that we understand a bit more about the data, we can run a generalized additive model (GAM).

Generalized Additive Model of Larval Biogeography

Now we will create a GAM that models the distribution of Alaska plaice larvae as it relates to temperature and salinity. The temperature and salinity data were collected by conductivity-temperature-depth casts at every station and haul aboard these cruises. We will create a GAM with a two-dimensional smooth; this means that temperature and salinity act together as covariates to influence larval biogeography in this model.

```
library(mgcv)
## Loading required package: nlme
## This is mgcv 1.8-35. For overview type 'help("mgcv-package")'.
1v.2d \leq gam((Cper10m2+1) \leq factor(year) + s(lon, lat) + s(doy, k=7) + s(bottom depth) + s(doy, k=7) + 
                            s(temperature, salinity), data=aplarv.ctd, family=tw(link='log'),
                        method='REML')
summary(lv.2d)
##
## Family: Tweedie(p=1.99)
## Link function: log
##
## Formula:
      (Cper10m2 + 1) \sim factor(year) + s(lon, lat) + s(doy, k = 7) +
               s(bottom_depth) + s(temperature, salinity)
##
##
## Parametric coefficients:
##
                                              Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                                              0.558493
                                                                     0.144966
                                                                                              3.853 0.000120 ***
## factor(year)1998 0.198585
                                                                     0.282576
                                                                                              0.703 0.482267
## factor(year)1999 0.433149
                                                                     0.223810
                                                                                              1.935 0.053062
## factor(year)2000 -0.112157
                                                                     0.193117
                                                                                           -0.581 0.561447
## factor(year)2001 -0.273245
                                                                     0.335157
                                                                                          -0.815 0.414993
## factor(year)2002 -0.615851
                                                                     0.176898 -3.481 0.000507 ***
## factor(year)2003 0.006481
                                                                     0.179946
                                                                                              0.036 0.971274
## factor(year)2004 0.395337
                                                                     0.327906
                                                                                              1.206 0.228071
## factor(year)2005 0.654477
                                                                     0.168209
                                                                                              3.891 0.000103 ***
## factor(year)2006 0.057439
                                                                     0.157053
                                                                                              0.366 0.714596
## factor(year)2007 -0.012157
                                                                     0.168388
                                                                                           -0.072 0.942452
## factor(year)2008 -0.236235
                                                                     0.180423
                                                                                          -1.309 0.190540
## factor(year)2009 -0.289113
                                                                                           -1.833 0.066952 .
                                                                     0.157744
## factor(year)2010 -0.063496
                                                                     0.154594
                                                                                           -0.411 0.681308
## factor(year)2011 -0.300430
                                                                      0.182558
                                                                                           -1.646 0.099959
## factor(year)2012 -0.366095
                                                                     0.159599
                                                                                           -2.294 0.021883 *
## factor(year)2013 -0.135728
                                                                      0.184578
                                                                                           -0.735 0.462200
## factor(year)2014 -0.041952
                                                                     0.156760
                                                                                           -0.268 0.789015
                                                                                           -0.125 0.900244
## factor(year)2015 -0.020075
                                                                      0.160129
## factor(year)2016 0.763784
                                                                      0.167763
                                                                                              4.553 5.55e-06 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

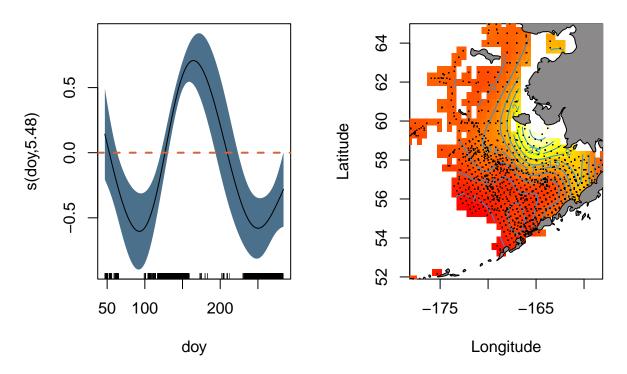
##

```
## Approximate significance of smooth terms:
##
                             edf Ref.df
                                            F p-value
## s(lon,lat)
                          28.072 28.94 42.80
                                               <2e-16 ***
## s(doy)
                           5.481
                                   5.89 27.10
                                               <2e-16 ***
## s(bottom_depth)
                           1.000
                                   1.00 4.44
                                               0.0352 *
## s(temperature, salinity) 26.384 28.58 21.64
                                               <2e-16 ***
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
##
## R-sq.(adj) = 0.397
                        Deviance explained =
                                               83%
## -REML = 3999.2 Scale est. = 0.56273
```

This model actually does a great job of explaining larval biogeography with a deviance explained of 83%. All variables included are significant, though bottom depth is less significant than the others. We included bottom depth to account for variation in sampling presence across the shelf. While these are superficially good results, the predictions for each factor(year) vary in significance which may decrease our faith in the model.

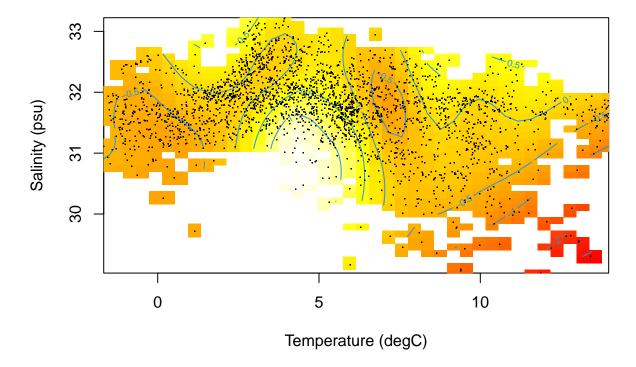
Now we can plot these results.

Seasonal Presence, 2D Temp+Sal M Biogeography, 2D Temp+Sal Mod



This above figure shows the model output for seasonal presence (at what day of year larvae are caught) and biogeography (where larvae are caught).

Larval Log Presence, 2D Temp and Sal Effect



This above figure shows the influence that temperature and salinity, when working together in a two-dimensional smooth, have on larval catch anomalies. Positive values in this figure (more yellow) reflect temperature and salinity values at which one can expect a *higher than average* larval catch.