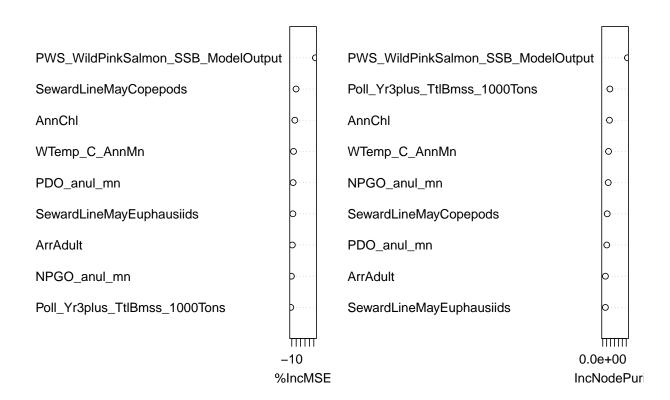
# Rachael Blake January 27, 2016

# Random Forest Analysis Exploration for DMX Linkages

```
###
# Pink Salmon
CPD_Pink <- CPD %>%
            select(PDO_anul_mn,NPGO_anul_mn,#WndSp_m_s_AnnMn,WndDir_degT_AnnMn,
                   WTemp_C_AnnMn, AnnChl, SewardLineMayEuphausiids, SewardLineMayCopepods,
                   goaPinkCatchNum,PWS_WildPinkSalmon_SSB_ModelOutput,ArrAdult,
                   Poll_Yr3plus_TtlBmss_1000Tons) %>%
            filter(complete.cases(.))
goaPink <- randomForest(goaPinkCatchNum ~., data=CPD_Pink, importance=T, do.trace=1000, ntree=5000)</pre>
               Out-of-bag
               MSE %Var(y) |
## Tree |
                       89.91
## 1000 | 6.754e+08
## 2000 | 6.647e+08
                       88.48 |
## 3000 | 6.621e+08
                       88.14
## 4000 | 6.706e+08
                     89.27
## 5000 | 6.615e+08
                     88.07 |
print(goaPink)
##
## Call:
  randomForest(formula = goaPinkCatchNum ~ ., data = CPD_Pink,
                                                                       importance = T, do.trace = 1000, :
##
##
                  Type of random forest: regression
                        Number of trees: 5000
## No. of variables tried at each split: 3
##
             Mean of squared residuals: 661539690
##
##
                       % Var explained: 11.93
#plot(qoaPink)
varImpPlot(goaPink)
```

## goaPink



## goaPink\$importance

##

Out-of-bag

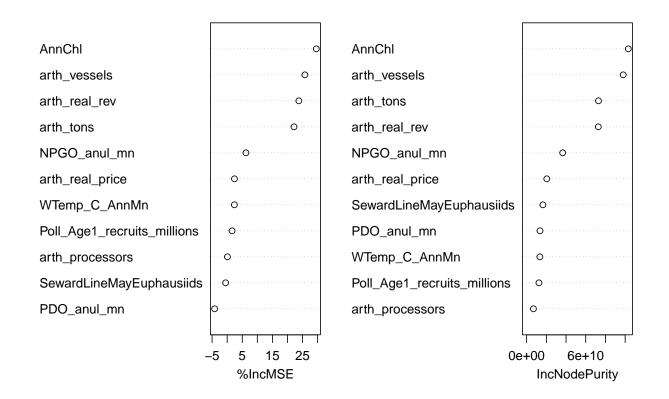
```
##
                                           %IncMSE IncNodePurity
                                       -20090445.1
## PDO_anul_mn
                                                       512657317
## NPGO_anul_mn
                                       -39270643.0
                                                        699152713
## WTemp_C_AnnMn
                                       -19089981.2
                                                       741417186
## AnnChl
                                                       858157379
                                        -9491189.1
## SewardLineMayEuphausiids
                                       -20159957.2
                                                       336844264
## SewardLineMayCopepods
                                         -609485.2
                                                       569584662
## PWS_WildPinkSalmon_SSB_ModelOutput 435618400.7
                                                       3151921292
## ArrAdult
                                       -22529767.7
                                                        341388813
## Poll_Yr3plus_TtlBmss_1000Tons
                                       -52628342.0
                                                       911916150
# Arrowtooth
CPD_Arrow <- CPD %>%
             select (PDO_anul_mn, NPGO_anul_mn, #WndSp_m_s_AnnMn, WndDir_deqT_AnnMn,
                    WTemp_C_AnnMn, AnnChl, SewardLineMayEuphausiids, Poll_Age1_recruits_millions,
                    ArrAdult, arth_tons, arth_real_rev, arth_vessels, arth_processors, arth_real_price) %%
             filter(complete.cases(.))
arrow <- randomForest(ArrAdult ~., data=CPD_Arrow, importance=T, do.trace=1000, ntree=5000)</pre>
```

```
## 1000 | 1.365e+10
                       33.21 |
                       32.65 |
## 2000 | 1.342e+10
## 3000 | 1.376e+10
                       33.50 |
## 4000 | 1.351e+10
                       32.88 |
## 5000 | 1.335e+10
                       32.50 |
print(arrow)
##
## Call:
   randomForest(formula = ArrAdult ~ ., data = CPD_Arrow, importance = T,
                                                                                 do.trace = 1000, ntree
                  Type of random forest: regression
##
##
                        Number of trees: 5000
## No. of variables tried at each split: 3
##
##
             Mean of squared residuals: 13353600825
##
                       % Var explained: 67.5
#plot(arrow)
varImpPlot(arrow)
```

MSE %Var(y) |

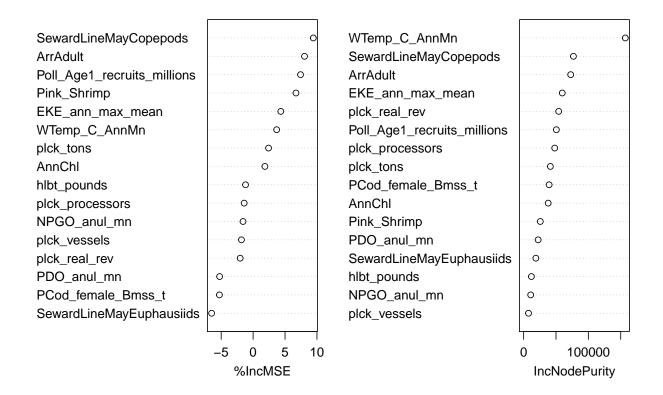
## Tree |

#### arrow



```
arrow$importance
##
                                                                                 %IncMSE IncNodePurity
## PDO_anul_mn
                                                                          -477160151
                                                                                                       13594530483
## NPGO_anul_mn
                                                                          1157942414
                                                                                                        36595326288
## WTemp_C_AnnMn
                                                                            201158865 13429955280
                                                                        12602062035 103229453363
## AnnChl
## SewardLineMayEuphausiids
                                                                            -44158412 16515360674
## Poll_Age1_recruits_millions
                                                                         141740340 12514181111
                                                                          6453167900 72930974461
## arth tons
## arth real rev
                                                                          7701157446 72749312442
## arth_vessels
                                                                          9309516115 98034094984
## arth_processors
                                                                                 5286482
                                                                                                         6907744158
## arth_real_price
                                                                            250486278
                                                                                                       20470993587
# Pollock Adults
CPD_Poll <- CPD %>%
                            \verb|select(PDO_anul_mn,NPGO_anul_mn,\#WndSp_m_s_AnnMn,WndDir_degT_AnnMn,\#WndSp_m_s_AnnMn,WndDir_degT_AnnMn,\#WndSp_m_s_AnnMn,WndDir_degT_AnnMn,WndSp_m_s_AnnMn,WndDir_degT_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn,WndSp_m_s_AnnMn
                                            WTemp_C_AnnMn, AnnChl, EKE_ann_max_mean, SewardLineMayEuphausiids,
                                            SewardLineMayCopepods, Pink_Shrimp, Poll_Age1_recruits_millions,
                                            Poll_Yr3plus_TtlBmss_1000Tons,ArrAdult, PCod_female_Bmss_t,hlbt_pounds,
                                            plck_tons,plck_real_rev,plck_vessels,plck_processors) %>%
                            filter(complete.cases(.))
poll_a <- randomForest(Poll_Yr3plus_TtlBmss_1000Tons ~., data=CPD_Poll, importance=T, do.trace=1000, nt
                                  Out-of-bag
                                  MSE %Var(y) |
## Tree |
## 1000 | 7.358e+04
                                                109.83 |
## 2000 | 7.423e+04
                                                110.80 |
## 4000 | 7.464e+04
                                                111.41 |
## 5000 | 7.538e+04
                                                112.52
print(poll_a)
##
## Call:
      randomForest(formula = Poll_Yr3plus_TtlBmss_1000Tons ~ ., data = CPD_Poll,
                                                                                                                                                                                                  importance = T, do.
##
                                         Type of random forest: regression
                                                       Number of trees: 5000
##
## No. of variables tried at each split: 5
##
##
                              Mean of squared residuals: 75381.6
                                                     % Var explained: -12.52
##
#plot(poll_a)
varImpPlot(poll_a)
```

## poll\_a

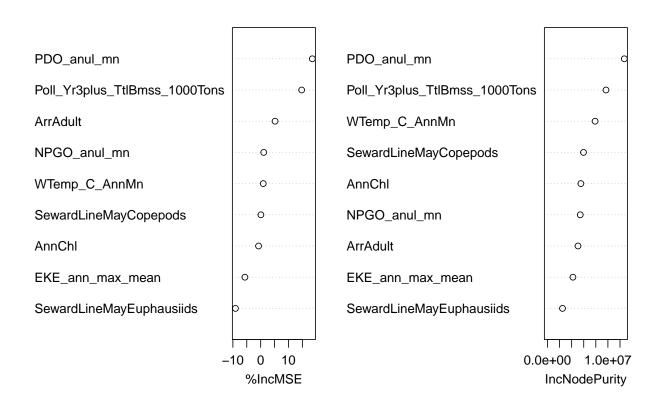


#### poll\_a\$importance

```
##
                                   %IncMSE IncNodePurity
## PDO anul mn
                                               22427.432
                                 -957.0998
## NPGO_anul_mn
                                 -212.1263
                                               10913.432
## WTemp C AnnMn
                                 1938.3586
                                              157129.152
## AnnChl
                                  404.3940
                                               37969.837
## EKE_ann_max_mean
                                 1073.1554
                                               59694.484
## SewardLineMayEuphausiids
                                               18862.370
                                -1299.7921
## SewardLineMayCopepods
                                 3428.9089
                                               76934.817
## Pink Shrimp
                                 1282.4778
                                               25780.672
## Poll_Age1_recruits_millions
                                2318.9059
                                               50590.419
## ArrAdult
                                 2981.4986
                                               72709.491
## PCod_female_Bmss_t
                                -1295.4460
                                               39429.603
## hlbt_pounds
                                 -141.7567
                                               12002.622
## plck_tons
                                  546.0648
                                               41309.136
## plck_real_rev
                                 -326.1507
                                               54135.794
## plck_vessels
                                 -147.3356
                                                7549.144
## plck_processors
                                 -208.4154
                                               48028.514
# Pollock Juvenile
CPD JPoll <- CPD %>%
             select(PDO_anul_mn,NPGO_anul_mn,#WndSp_m_s_AnnMn,WndDir_degT_AnnMn,
```

```
{\tt WTemp\_C\_AnnMn,AnnChl,\ EKE\_ann\_max\_mean,SewardLineMayEuphausiids,}
                    SewardLineMayCopepods,Poll_Age1_recruits_millions,
                    Poll_Yr3plus_TtlBmss_1000Tons,ArrAdult) %>%
             filter(complete.cases(.))
poll_j <- randomForest(Poll_Age1_recruits_millions ~., data=CPD_JPoll, importance=T, do.trace=1000, ntr
        Out-of-bag
## Tree |
               MSE %Var(y) |
## 1000 | 5.598e+06 102.14 |
## 2000 | 5.513e+06
                     100.59 |
## 3000 | 5.531e+06
                     100.93 |
## 4000 | 5.534e+06
                    100.97 |
## 5000 | 5.515e+06 100.63 |
print(poll_j)
##
## Call:
   randomForest(formula = Poll_Age1_recruits_millions ~ ., data = CPD_JPoll,
##
                                                                                    importance = T, do.t;
##
                  Type of random forest: regression
##
                        Number of trees: 5000
## No. of variables tried at each split: 3
##
             Mean of squared residuals: 5514883
##
##
                       % Var explained: -0.63
#plot(poll_j)
varImpPlot(poll_j)
```

### poll\_j



## poll\_j\$importance

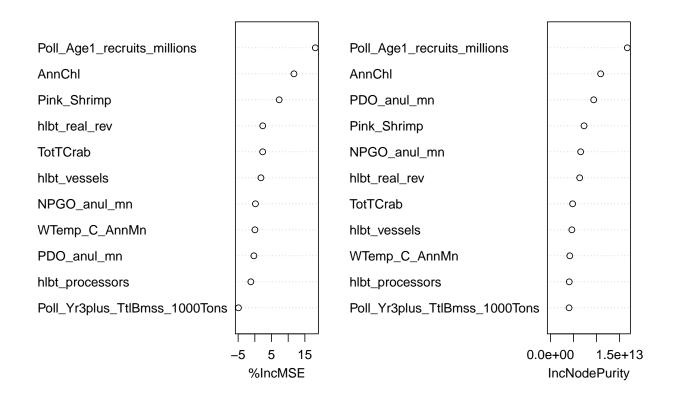
##

Out-of-bag

```
##
                                      %IncMSE IncNodePurity
## PDO_anul_mn
                                   833385.356
                                                    12716167
## NPGO_anul_mn
                                    29712.021
                                                    5425393
## WTemp_C_AnnMn
                                    27613.027
                                                    7884966
## AnnChl
                                   -17849.302
                                                    5527456
## EKE_ann_max_mean
                                  -129918.422
                                                    4213952
## SewardLineMayEuphausiids
                                  -182148.119
                                                    2491129
## SewardLineMayCopepods
                                     2053.969
                                                    5961496
## Poll_Yr3plus_TtlBmss_1000Tons
                                   534448.850
                                                    9685797
## ArrAdult
                                   131449.090
                                                    5054524
# Halibut
CPD_Hal <- CPD %>%
           select(PDO_anul_mn,NPGO_anul_mn,#WndSp_m s_AnnMn,WndDir_deqT_AnnMn,
                  WTemp_C_AnnMn, AnnChl, Poll_Yr3plus_TtlBmss_1000Tons, Poll_Age1_recruits_millions,
                  TotTCrab, Pink_Shrimp, hlbt_pounds, hlbt_real_rev, hlbt_vessels, hlbt_processors) %>%
           filter(complete.cases(.))
hlbt_lbs <- randomForest(hlbt_pounds ~., data=CPD_Hal, importance=T, do.trace=1000, ntree=5000)
```

```
## Tree |
              MSE %Var(y) |
## 1000 | 8.159e+12
                      107.56 |
## 2000 | 8.152e+12
                      107.47
## 3000 | 8.067e+12
                     106.34 |
## 4000 | 8.059e+12
                     106.25
## 5000 | 8.051e+12
                     106.14 |
print(hlbt_lbs)
##
## Call:
   randomForest(formula = hlbt_pounds ~ ., data = CPD_Hal, importance = T,
                                                                                 do.trace = 1000, ntree
                  Type of random forest: regression
##
##
                        Number of trees: 5000
## No. of variables tried at each split: 3
##
##
             Mean of squared residuals: 8.050789e+12
##
                       % Var explained: -6.14
#plot(hlbt_lbs)
varImpPlot(hlbt_lbs)
```

## hlbt\_lbs



## hlbt\_lbs\$importance

| ## |                               | %IncMSE       | IncNodePurity |
|----|-------------------------------|---------------|---------------|
| ## | PDO_anul_mn                   | -10739664795  | 9.383004e+12  |
| ## | NPGO_anul_mn                  | 6423047180    | 6.559912e+12  |
| ## | WTemp_C_AnnMn                 | 552018766     | 4.194333e+12  |
| ## | AnnChl                        | 513692226449  | 1.089447e+13  |
| ## | Poll_Yr3plus_TtlBmss_1000Tons | -121932501831 | 4.046998e+12  |
| ## | Poll_Age1_recruits_millions   | 1069456441911 | 1.667865e+13  |
| ## | TotTCrab                      | 73342931198   | 4.814391e+12  |
| ## | Pink_Shrimp                   | 227494056533  | 7.294152e+12  |
| ## | hlbt_real_rev                 | 65798174468   | 6.344041e+12  |
| ## | hlbt_vessels                  | 52743591728   | 4.642313e+12  |
| ## | hlbt_processors               | -32638972199  | 4.078487e+12  |