

Extreme year graphs

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10/3/2016

```
library(ggplot2)
require(reshape)
```

```
## Loading required package: reshape
```

```
require(mgcv)
```

```
## Loading required package: mgcv
```

```
## Loading required package: nlme
```

```
## This is mgcv 1.8-12. For overview type 'help("mgcv-package")'.
```

```
require(lsmeans)
```

```
## Loading required package: lsmeans
```

```
## Loading required package: estimability
```

```
require(car)
```

```
## Loading required package: car
```

```
require(moments)
```

```
## Loading required package: moments
```

```
load("processed_data/gam2_weights_processed.Rdata")
summary(gam2.weights)
```

```
##           Model                Site      Year
## species_response:57086  Howland      :27900  Min.    :1895
##                        Harvard        :11570  1st Qu.:1945
##                        Missouri Ozark   : 6500  Median :1969
##                        Morgan Monroe State Park: 5659  Mean    :1967
##                        Oak Openings Toledo : 5457  3rd Qu.:1991
##                        Austin Cary FL      :    0  Max.    :2013
##                        (Other)           :    0
##      fit.full      PlotID      TreeID      fit.tmean
## Min.    : -3.5612  HOW2      : 9573  HOW1006: 118  Min.    : -0.261350
## 1st Qu.:  0.8906  HOW1      : 9256  HOW1039: 118  1st Qu.: -0.005424
## Median :  1.5964  HOW3      : 9071  HOW1044: 118  Median : -0.002604
```

```

## Mean      : 1.5435   TP1      : 5815   HOW1046: 118   Mean      :-0.003469
## 3rd Qu.: 2.2126   TP2      : 5755   HOW1049: 118   3rd Qu.: 0.011546
## Max.      : 5.0018   OOB      : 2868   HOW1051: 118   Max.      : 0.378653
##                                     (Other):14748   (Other):56378
##      sd.tmean      fit.precip      sd.precip
## Min.      :0.0000438   Min.      :-0.070829   Min.      :4.567e-05
## 1st Qu.:0.0098388   1st Qu.: -0.006105   1st Qu.:2.878e-03
## Median :0.0151772   Median : -0.002670   Median :4.413e-03
## Mean      :0.0181754   Mean      :-0.000273   Mean      :5.726e-03
## 3rd Qu.:0.0234406   3rd Qu.: 0.001558   3rd Qu.:6.978e-03
## Max.      :0.1443291   Max.      : 0.198633   Max.      :5.779e-02
##
## fit.dbh.recon      sd.dbh.recon      fit.Year
## Min.      :-2.34959   Min.      :0.003142   Min.      :-1.74605
## 1st Qu.: -0.74114   1st Qu.:0.009133   1st Qu.: -0.60955
## Median : 0.03584   Median :0.017021   Median : 0.02304
## Mean      : 0.05041   Mean      :0.020860   Mean      :-0.07674
## 3rd Qu.: 0.79419   3rd Qu.:0.027121   3rd Qu.: 0.46579
## Max.      : 2.19686   Max.      :0.173454   Max.      : 2.23084
##
##      sd.Year      weight.tmean      weight.precip      weight.dbh.recon
## Min.      :0.009944   Min.      :0.0000   Min.      :0.0000   Min.      :0.0000
## 1st Qu.:0.013775   1st Qu.:0.1677   1st Qu.:0.1690   1st Qu.:0.0000
## Median :0.024272   Median :0.2477   Median :0.2469   Median :0.2128
## Mean      :0.027517   Mean      :0.2300   Mean      :0.2297   Mean      :0.2839
## 3rd Qu.:0.035484   3rd Qu.:0.3053   3rd Qu.:0.3057   3rd Qu.:0.5504
## Max.      :0.165720   Max.      :0.8457   Max.      :0.8817   Max.      :0.9971
##
##      weight.Year      max      factor.max      BA.inc
## Min.      :0.0000   Min.      :0.3334   dbh.recon:24182   Min.      : 0.000
## 1st Qu.:0.0000   1st Qu.:0.4160   precip      : 5248   1st Qu.: 2.528
## Median :0.2579   Median :0.5024   tmean      : 4388   Median : 5.351
## Mean      :0.2563   Mean      :0.5316   Year       :23268   Mean      : 7.979
## 3rd Qu.:0.4542   3rd Qu.:0.6167   Max.      :196.218   3rd Qu.:10.017
## Max.      :0.9979   Max.      :0.9979   Max.      :196.218   Max.      :196.218
##
##      group      Canopy.Class      fit.full.bai      tmean.bai
## TSCA      :13190   D      :37758   Min.      : 0.02841   Min.      :0.7700
## PCRU      :11192   F      : 0   1st Qu.: 2.43653   1st Qu.:0.9946
## QURU      : 7343   I      :10548   Median : 4.93500   Median :0.9974
## ACRU      : 4860   S      : 8780   Mean      : 7.48753   Mean      :0.9990
## QUAL      : 4211   SNAG: 0   3rd Qu.: 9.13951   3rd Qu.:1.0116
## ACSA      : 2720   Max.      :148.68013   Max.      :1.4603
## (Other):13570
##      precip.bai      dbh.bai      weight.tmean.bai.2      weight.precip.bai.2
## Min.      :0.9316   Min.      :0.09541   Min.      :0.09031   Min.      :0.09023
## 1st Qu.:0.9939   1st Qu.:0.47657   1st Qu.:0.23544   1st Qu.:0.23749
## Median :0.9973   Median :1.03649   Median :0.32746   Median :0.32899
## Mean      :0.9998   Mean      :1.71408   Mean      :0.31405   Mean      :0.31506
## 3rd Qu.:1.0016   3rd Qu.:2.21264   3rd Qu.:0.40264   3rd Qu.:0.40249
## Max.      :1.2197   Max.      :8.99669   Max.      :0.55599   Max.      :0.53430
##
##      weight.dbh.bai.2      max2      factor.max2      State
## Min.      :0.04206   Min.      :0.3334   dbh.recon:28871   IN: 5659

```

```
## 1st Qu.:0.19228 1st Qu.:0.3940 precip :11118 MA:11570
## Median :0.34140 Median :0.4401 tmean :17097 ME:27900
## Mean :0.37089 Mean :0.4782 MO: 6500
## 3rd Qu.:0.52628 3rd Qu.:0.5268 OH: 5457
## Max. :0.81907 Max. :0.8191
##
## BA.inc.Clim Clim.Rel Temp.Mark Precip.Mark
## Min. : -7.9787 Min. : -33.8016 A :52071 A :52259
## 1st Qu.: 0.4559 1st Qu.: -0.8492 cold: 2531 dry: 2515
## Median : 2.8239 Median : -0.2891 hot : 2484 wet: 2312
## Mean : 5.1278 Mean : 0.0000
## 3rd Qu.: 6.8416 3rd Qu.: 0.5439
## Max. :187.5827 Max. : 17.3503
##
```

probability density functions for extreme years

```
load("processed_data/climate_markeryears.Rdata")
summary(gam2.weights)
```

```
## Model Site Year
## species_response:57086 Howland :27900 Min. :1895
## Harvard :11570 1st Qu.:1945
## Missouri Ozark : 6500 Median :1969
## Morgan Monroe State Park: 5659 Mean :1967
## Oak Openings Toledo : 5457 3rd Qu.:1991
## Austin Cary FL : 0 Max. :2013
## (Other) : 0
## fit.full PlotID TreeID fit.tmean
## Min. : -3.5612 HOW2 : 9573 HOW1006: 118 Min. : -0.261350
## 1st Qu.: 0.8906 HOW1 : 9256 HOW1039: 118 1st Qu.: -0.005424
## Median : 1.5964 HOW3 : 9071 HOW1044: 118 Median : -0.002604
## Mean : 1.5435 TP1 : 5815 HOW1046: 118 Mean : -0.003469
## 3rd Qu.: 2.2126 TP2 : 5755 HOW1049: 118 3rd Qu.: 0.011546
## Max. : 5.0018 OOB : 2868 HOW1051: 118 Max. : 0.378653
## (Other):14748 (Other):56378
## sd.tmean fit.precip sd.precip
## Min. :0.0000438 Min. : -0.070829 Min. :4.567e-05
## 1st Qu.:0.0098388 1st Qu.: -0.006105 1st Qu.:2.878e-03
## Median :0.0151772 Median : -0.002670 Median :4.413e-03
## Mean :0.0181754 Mean : -0.000273 Mean :5.726e-03
## 3rd Qu.:0.0234406 3rd Qu.: 0.001558 3rd Qu.:6.978e-03
## Max. :0.1443291 Max. : 0.198633 Max. :5.779e-02
##
## fit.dbh.recon sd.dbh.recon fit.Year
## Min. : -2.34959 Min. : 0.003142 Min. : -1.74605
## 1st Qu.: -0.74114 1st Qu.:0.009133 1st Qu.: -0.60955
## Median : 0.03584 Median :0.017021 Median : 0.02304
## Mean : 0.05041 Mean :0.020860 Mean : -0.07674
## 3rd Qu.: 0.79419 3rd Qu.:0.027121 3rd Qu.: 0.46579
## Max. : 2.19686 Max. :0.173454 Max. : 2.23084
```

```

##
##      sd.Year      weight.tmean      weight.precip      weight.dbh.recon
## Min.   :0.009944   Min.   :0.0000   Min.   :0.0000   Min.   :0.0000
## 1st Qu.:0.013775   1st Qu.:0.1677   1st Qu.:0.1690   1st Qu.:0.0000
## Median :0.024272   Median :0.2477   Median :0.2469   Median :0.2128
## Mean   :0.027517   Mean   :0.2300   Mean   :0.2297   Mean   :0.2839
## 3rd Qu.:0.035484   3rd Qu.:0.3053   3rd Qu.:0.3057   3rd Qu.:0.5504
## Max.   :0.165720   Max.   :0.8457   Max.   :0.8817   Max.   :0.9971
##
##      weight.Year      max      factor.max      BA.inc
## Min.   :0.0000   Min.   :0.3334   dbh.recon:24182   Min.   : 0.000
## 1st Qu.:0.0000   1st Qu.:0.4160   precip   : 5248   1st Qu.: 2.528
## Median :0.2579   Median :0.5024   tmean    : 4388   Median : 5.351
## Mean   :0.2563   Mean   :0.5316   Year      :23268   Mean   : 7.979
## 3rd Qu.:0.4542   3rd Qu.:0.6167           3rd Qu.:10.017
## Max.   :0.9979   Max.   :0.9979           Max.   :196.218
##
##      group      Canopy.Class      fit.full.bai      tmean.bai
## TSCA   :13190   D   :37758   Min.   : 0.02841   Min.   :0.7700
## PCRU    :11192   F   : 0   1st Qu.: 2.43653   1st Qu.:0.9946
## QURU    : 7343   I   :10548   Median : 4.93500   Median :0.9974
## ACRU    : 4860   S   : 8780   Mean    : 7.48753   Mean    :0.9990
## QUAL    : 4211   SNAG: 0   3rd Qu.: 9.13951   3rd Qu.:1.0116
## ACSA    : 2720           Max.   :148.68013   Max.   :1.4603
## (Other):13570
##      precip.bai      dbh.bai      weight.tmean.bai.2      weight.precip.bai.2
## Min.   :0.9316   Min.   :0.09541   Min.   :0.09031   Min.   :0.09023
## 1st Qu.:0.9939   1st Qu.:0.47657   1st Qu.:0.23544   1st Qu.:0.23749
## Median :0.9973   Median :1.03649   Median :0.32746   Median :0.32899
## Mean   :0.9998   Mean    :1.71408   Mean    :0.31405   Mean    :0.31506
## 3rd Qu.:1.0016   3rd Qu.:2.21264   3rd Qu.:0.40264   3rd Qu.:0.40249
## Max.   :1.2197   Max.   :8.99669   Max.   :0.55599   Max.   :0.53430
##
##      weight.dbh.bai.2      max2      factor.max2      State
## Min.   :0.04206   Min.   :0.3334   dbh.recon:28871   IN: 5659
## 1st Qu.:0.19228   1st Qu.:0.3940   precip   :11118   MA:11570
## Median :0.34140   Median :0.4401   tmean    :17097   ME:27900
## Mean   :0.37089   Mean    :0.4782           MO: 6500
## 3rd Qu.:0.52628   3rd Qu.:0.5268           OH: 5457
## Max.   :0.81907   Max.   :0.8191
##
##      BA.inc.Clim      Clim.Rel      Temp.Mark      Precip.Mark
## Min.   : -7.9787   Min.   : -33.8016   A   :52071   A   :52259
## 1st Qu.: 0.4559   1st Qu.: -0.8492   cold: 2531   dry: 2515
## Median : 2.8239   Median : -0.2891   hot : 2484   wet: 2312
## Mean   : 5.1278   Mean    : 0.0000
## 3rd Qu.: 6.8416   3rd Qu.: 0.5439
## Max.   :187.5827   Max.   : 17.3503
##

```

```

# Making a combined temp/precip marker year

```

```

gam2.weights$mix.mark <- as.factor(paste(gam2.weights$Temp.Mark, gam2.weights$Precip.Mark, sep="-"))
summary(gam2.weights)

```

```

##           Model                      Site          Year
## species_response:57086  Howland          :27900  Min.    :1895
##                        Harvard            :11570  1st Qu.:1945
##                        Missouri Ozark     : 6500  Median :1969
##                        Morgan Monroe State Park: 5659  Mean    :1967
##                        Oak Openings Toledo : 5457  3rd Qu.:1991
##                        Austin Cary FL     :    0  Max.    :2013
##                        (Other)            :    0
##      fit.full      PlotID      TreeID      fit.tmean
## Min.    :-3.5612  HOW2    : 9573  HOW1006: 118  Min.    :-0.261350
## 1st Qu.: 0.8906  HOW1    : 9256  HOW1039: 118  1st Qu.: -0.005424
## Median : 1.5964  HOW3    : 9071  HOW1044: 118  Median : -0.002604
## Mean    : 1.5435  TP1     : 5815  HOW1046: 118  Mean    : -0.003469
## 3rd Qu.: 2.2126  TP2     : 5755  HOW1049: 118  3rd Qu.: 0.011546
## Max.    : 5.0018  OOB     : 2868  HOW1051: 118  Max.    : 0.378653
##                        (Other):14748  (Other):56378
##      sd.tmean      fit.precip      sd.precip
## Min.    :0.0000438  Min.    :-0.070829  Min.    :4.567e-05
## 1st Qu.:0.0098388  1st Qu.: -0.006105  1st Qu.:2.878e-03
## Median :0.0151772  Median : -0.002670  Median :4.413e-03
## Mean    :0.0181754  Mean    : -0.000273  Mean    :5.726e-03
## 3rd Qu.:0.0234406  3rd Qu.: 0.001558  3rd Qu.:6.978e-03
## Max.    :0.1443291  Max.    : 0.198633  Max.    :5.779e-02
##
##      fit.dbh.recon      sd.dbh.recon      fit.Year
## Min.    :-2.34959  Min.    :0.003142  Min.    :-1.74605
## 1st Qu.: -0.74114  1st Qu.:0.009133  1st Qu.: -0.60955
## Median : 0.03584  Median :0.017021  Median : 0.02304
## Mean    : 0.05041  Mean    :0.020860  Mean    : -0.07674
## 3rd Qu.: 0.79419  3rd Qu.:0.027121  3rd Qu.: 0.46579
## Max.    : 2.19686  Max.    :0.173454  Max.    : 2.23084
##
##      sd.Year      weight.tmean      weight.precip      weight.dbh.recon
## Min.    :0.009944  Min.    :0.0000  Min.    :0.0000  Min.    :0.0000
## 1st Qu.:0.013775  1st Qu.:0.1677  1st Qu.:0.1690  1st Qu.:0.0000
## Median :0.024272  Median :0.2477  Median :0.2469  Median :0.2128
## Mean    :0.027517  Mean    :0.2300  Mean    :0.2297  Mean    :0.2839
## 3rd Qu.:0.035484  3rd Qu.:0.3053  3rd Qu.:0.3057  3rd Qu.:0.5504
## Max.    :0.165720  Max.    :0.8457  Max.    :0.8817  Max.    :0.9971
##
##      weight.Year      max      factor.max      BA.inc
## Min.    :0.0000  Min.    :0.3334  dbh.recon:24182  Min.    : 0.000
## 1st Qu.:0.0000  1st Qu.:0.4160  precip    : 5248  1st Qu.: 2.528
## Median :0.2579  Median :0.5024  tmean     : 4388  Median : 5.351
## Mean    :0.2563  Mean    :0.5316  Year      :23268  Mean    : 7.979
## 3rd Qu.:0.4542  3rd Qu.:0.6167          :          3rd Qu.:10.017
## Max.    :0.9979  Max.    :0.9979          :          Max.    :196.218
##
##      group      Canopy.Class  fit.full.bai      tmean.bai
## TSCA    :13190  D    :37758  Min.    : 0.02841  Min.    :0.7700
## PCRU    :11192  F    :    0  1st Qu.: 2.43653  1st Qu.:0.9946
## QURU    : 7343  I    :10548  Median : 4.93500  Median :0.9974
## ACRU    : 4860  S    : 8780  Mean    : 7.48753  Mean    :0.9990
## QUAL    : 4211  SNAG:    0  3rd Qu.: 9.13951  3rd Qu.:1.0116

```

```

## ACSA : 2720 Max. :148.68013 Max. :1.4603
## (Other):13570
## precip.bai dbh.bai weight.tmean.bai.2 weight.precip.bai.2
## Min. :0.9316 Min. :0.09541 Min. :0.09031 Min. :0.09023
## 1st Qu.:0.9939 1st Qu.:0.47657 1st Qu.:0.23544 1st Qu.:0.23749
## Median :0.9973 Median :1.03649 Median :0.32746 Median :0.32899
## Mean :0.9998 Mean :1.71408 Mean :0.31405 Mean :0.31506
## 3rd Qu.:1.0016 3rd Qu.:2.21264 3rd Qu.:0.40264 3rd Qu.:0.40249
## Max. :1.2197 Max. :8.99669 Max. :0.55599 Max. :0.53430
##
## weight.dbh.bai.2 max2 factor.max2 State
## Min. :0.04206 Min. :0.3334 dbh.recon:28871 IN: 5659
## 1st Qu.:0.19228 1st Qu.:0.3940 precip :11118 MA:11570
## Median :0.34140 Median :0.4401 tmean :17097 ME:27900
## Mean :0.37089 Mean :0.4782 MO: 6500
## 3rd Qu.:0.52628 3rd Qu.:0.5268 OH: 5457
## Max. :0.81907 Max. :0.8191
##
## BA.inc.Clim Clim.Rel Temp.Mark Precip.Mark
## Min. : -7.9787 Min. : -33.8016 A :52071 A :52259
## 1st Qu.: 0.4559 1st Qu.: -0.8492 cold: 2531 dry: 2515
## Median : 2.8239 Median : -0.2891 hot : 2484 wet: 2312
## Mean : 5.1278 Mean : 0.0000
## 3rd Qu.: 6.8416 3rd Qu.: 0.5439
## Max. :187.5827 Max. : 17.3503
##
## mix.mark
## A-A :48026
## A-dry : 1872
## A-wet : 2173
## cold-A : 2531
## hot-A : 1702
## hot-dry: 643
## hot-wet: 139

```

```
# calculating median BAI for temp and precip
```

```

median.temp.s <- data.frame(type= unique(gam2.weights$Temp.Mark))
for(i in unique(gam2.weights$Temp.Mark)){
  median.temp.s[median.temp.s$type==i,"median"] <- median(gam2.weights[gam2.weights$Temp.Mark==i & gam2
}]
median.temp.s$Canopy.Class <- as.factor("S")
median.temp.i <- data.frame(type= unique(gam2.weights$Temp.Mark))
for(i in unique(gam2.weights$Temp.Mark)){
  median.temp.i[median.temp.s$type==i,"median"] <- median(gam2.weights[gam2.weights$Temp.Mark==i & gam2
}]
median.temp.i$Canopy.Class <- as.factor("I")

median.temp.d <- data.frame(type= unique(gam2.weights$Temp.Mark))
for(i in unique(gam2.weights$Temp.Mark)){
  median.temp.d[median.temp.s$type==i,"median"] <- median(gam2.weights[gam2.weights$Temp.Mark==i & gam2
}]
median.temp.d$Canopy.Class <- as.factor("D")

median.temp <- rbind(median.temp.d, median.temp.i, median.temp.s)

```

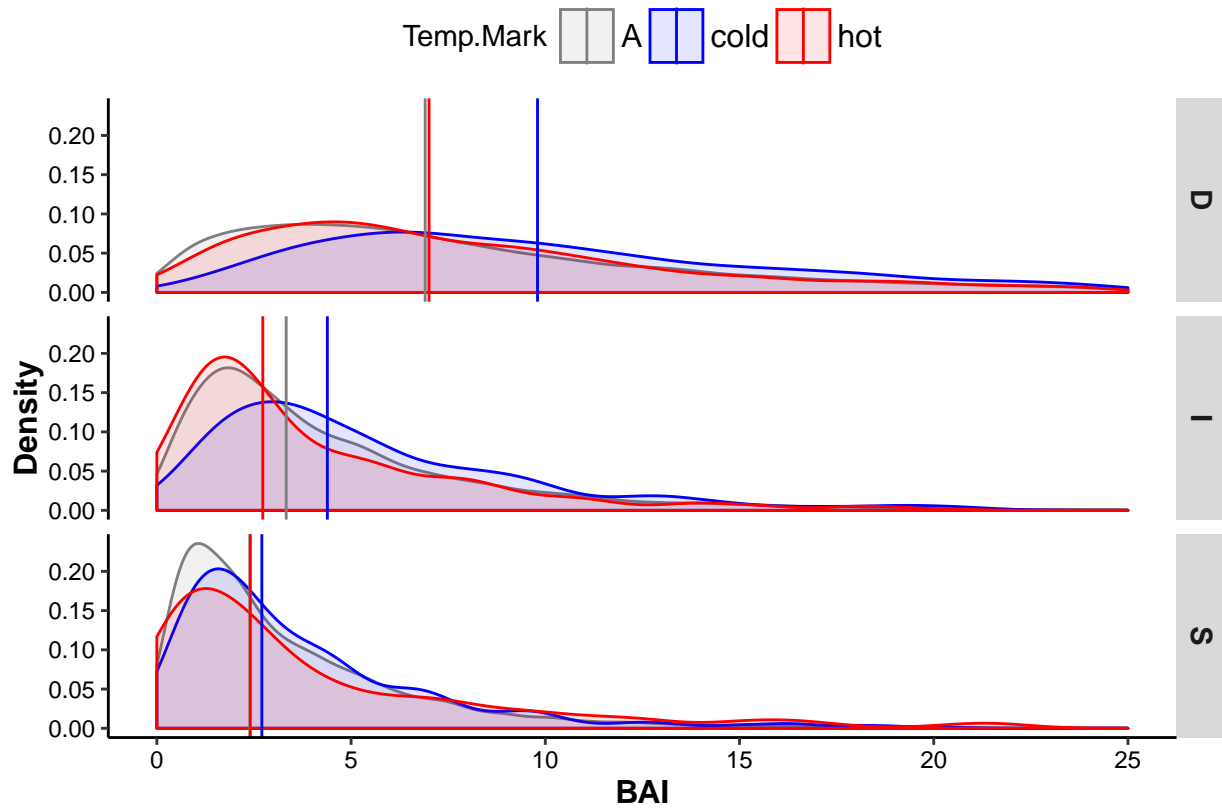
```
#####
# Precip
median.precip.s <- data.frame(type= unique(gam2.weights$Precip.Mark))
for(i in unique(gam2.weights$Precip.Mark)){
  median.precip.s[median.precip.s$type==i,"median"] <- median(gam2.weights[gam2.weights$Precip.Mark==i &
}]
median.precip.s$Canopy.Class <- as.factor("S")
median.precip.i <- data.frame(type= unique(gam2.weights$Precip.Mark))
for(i in unique(gam2.weights$Precip.Mark)){
  median.precip.i[median.precip.s$type==i,"median"] <- median(gam2.weights[gam2.weights$Precip.Mark==i &
}]
median.precip.i$Canopy.Class <- as.factor("I")

median.precip.d <- data.frame(type= unique(gam2.weights$Precip.Mark))
for(i in unique(gam2.weights$Precip.Mark)){
  median.precip.d[median.precip.s$type==i,"median"] <- median(gam2.weights[gam2.weights$Precip.Mark==i &
}]
median.precip.d$Canopy.Class <- as.factor("D")

median.precip <- rbind(median.precip.d, median.precip.i, median.precip.s)

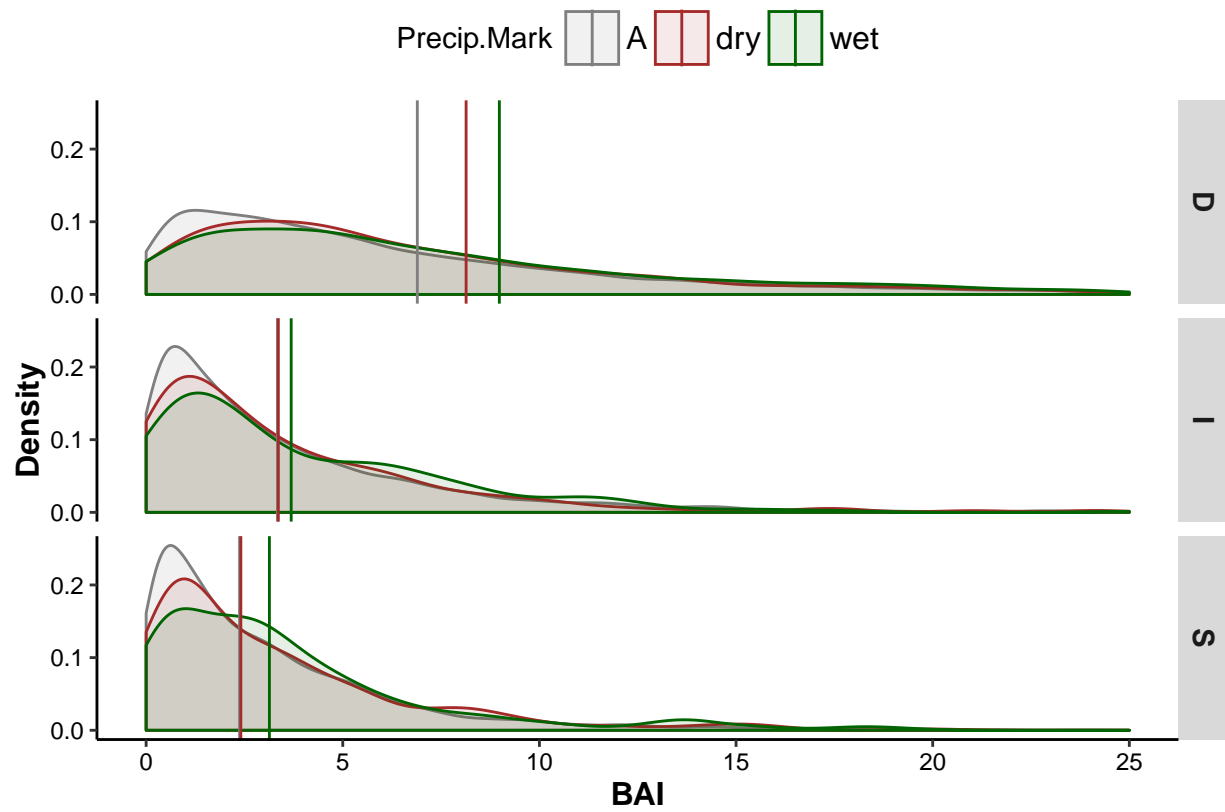
ggplot(gam2.weights) + facet_grid(Canopy.Class~.) +
  geom_density(aes(x=BA.inc,color=Temp.Mark, fill=Temp.Mark), alpha=0.1) +
  geom_vline(data=median.temp, aes(xintercept=median, color=type)) +
  scale_color_manual(values=c("grey50", "blue", "red")) +
  scale_fill_manual(values=c("grey50", "blue", "red")) +
  xlim(0,25) +
  labs(x= "BAI", y="Density") +
  theme(axis.line=element_line(color="black"),
        panel.grid.major=element_blank(),
        panel.grid.minor=element_blank(),
        panel.border=element_blank(),
        panel.background=element_blank(),
        axis.text.x=element_text(angle=0, color="black", size=rel(1)),
        axis.text.y=element_text(angle=0, color="black", size=rel(1)),
        strip.text=element_text(face="bold", size=rel(1.0)),
        axis.line.x = element_line(color="black", size = 0.5),
        axis.line.y = element_line(color="black", size = 0.5),
        legend.position="top",
        legend.key.size = unit(0.75, "cm"),
        legend.text = element_text(size=rel(1.1)),
        legend.key = element_rect(fill = "white")) +
  guides(color=guide_legend(nrow=1)) +
  theme(axis.title.y= element_text(size=rel(1.1), face="bold"))+
  theme(axis.title.x= element_text(size=rel(1.1), face="bold"))
```

```
## Warning: Removed 2568 rows containing non-finite values (stat_density).
```



```
ggplot(gam2.weights) + facet_grid(Canopy.Class~.) +
  geom_density(aes(x=BA.inc.Clim,color=Precip.Mark, fill=Precip.Mark), alpha=0.1) +
  geom_vline(data=median.precip, aes(xintercept=median, color=type)) +
  scale_color_manual(values=c("grey50", "brown", "darkgreen")) +
  scale_fill_manual(values=c("grey50", "brown", "darkgreen")) +
  xlim(0,25) +
  labs(x= "BAI", y="Density") +
  theme(axis.line=element_line(color="black"),
        panel.grid.major=element_blank(),
        panel.grid.minor=element_blank(),
        panel.border=element_blank(),
        panel.background=element_blank(),
        axis.text.x=element_text(angle=0, color="black", size=rel(1)),
        axis.text.y=element_text(angle=0, color="black", size=rel(1)),
        strip.text=element_text(face="bold", size=rel(1.0)),
        axis.line.x = element_line(color="black", size = 0.5),
        axis.line.y = element_line(color="black", size = 0.5),
        legend.position="top",
        legend.key.size = unit(0.75, "cm"),
        legend.text = element_text(size=rel(1.1)),
        legend.key = element_rect(fill = "white")) +
  guides(color=guide_legend(nrow=1)) +
  theme(axis.title.y= element_text(size=rel(1.1), face="bold"))+
  theme(axis.title.x= element_text(size=rel(1.1), face="bold"))
```

```
## Warning: Removed 12438 rows containing non-finite values (stat_density).
```

counterintuitive happenings in the dominant canopy class