# HBP D11 OAES 2023 Sorting Subsample Experiment

# Courtney Meier

#### 2023-09-22

#### Goal

To determine the efficacy of subsampling various proportions of HBP samples at the D11 OAES site to reduce long sort times associated with removing OSD from current-year clipped biomass. Subsampling is only evaluated in the context of clip harvests that do not require sorting to functional group (i.e., non-peak biomass clips), because the subsample to total mass ratios will not apply to individual herbGroups.

# **Experimental Setup and Analyses**

- Select n=10 plots (all plots for OAES), resulting in a maximum of n=20 clipID to test, due to both exclosure = Y and N for each plot. Random spatially-balanced plot locations, and locations of clipIDs within plots, will provide an unbiased estimate of biomass throughout the Tower airshed.
- For each clipID harvested in the field, test subsampling efficiency at various levels of sorting by creating subsamples (current-year + OSD) with the following percentages of the total freshMass:
  - -10%
  - -15%
  - -25%
  - -50%

The sum of all the subsamples = 100%; that is, the fresh mass of the entire clip strip.

- When subsampling is employed, calculate dryMass as follows: dM = fM \* (ssDM/ssFM), where:
  - -dM = dryMass of current-year biomass in the clipID (no OSD)
  - -fM = total freshMass in the clipID (current-year + OSD)
  - ssDM = subsampleDryMass of current-year biomass in the subsample (no OSD)
  - -ssFM = fresh mass of all biomass in the subsample (current-year + OSD)
- Compare dryMass results calculated via subsampling with dryMass obtained with no subsampling, and
  use mixed effects models to analyze results.

### Procedure

- 1. Perform clip harvest in the field as normal, and bring clipped biomass back to the laboratory in cold storage as normal.
- 2. Identify up to n=20 clipIDs (n=10 for exclosure = Y and n=10 for exclosure = N), originating from each of the 10 plotIDs.
- 3. Thoroughly mix biomass from each clipID to homogenize as thoroughly as possible.
  - a. For large amounts of biomass, and when there is more than one bag of biomass for a given clipID, use a large bag, box, tray or equivalent vessel to mix the biomass.
- 4. For each clipID, weigh and record to 0.01 g:

- a. freshMass = total fresh mass in the clipID (current-year + OSD).
- b. It is important that freshMass for the entire clipID and subsample fresh masses (below) are collected for a given clipID as close to each other in time as possible. That is, avoid weighing freshMass for a given clipID hours apart from the subsample fresh masses as water loss will affect the experimental results.
- 5. Based on the **freshMass**, calculate the desired subsample fresh masses for testing. For example, assuming **freshMass** = 100 g, the target subsample fresh masses are:

```
a. 10\% subsample -> 10 g
b. 15\% subsample -> 15 g
c. 25\% subsample -> 25 g
d. 50\% subsample -> 50 g
```

6. Label a coin envelope for each subsample above with the information below.

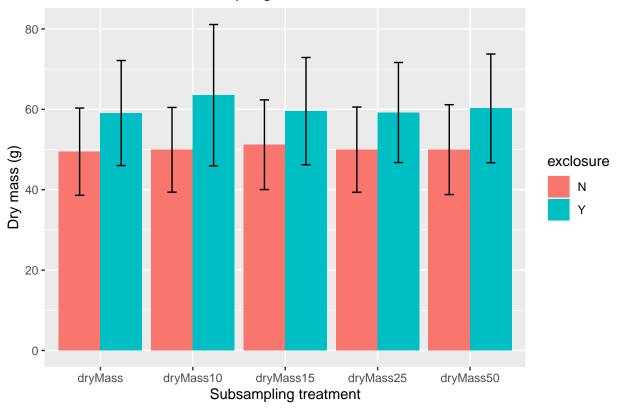
```
a. subsampleTest: 10%, 15%, 25% or 50%
b. clipID
c. collectDate
d. exclosure: Y/N
```

- 7. Weigh each fresh subsample created above (current-year + OSD), and record the information below.
  - a. subsampleTest: as above
  - $b. \ {\tt clipID}$
  - c. collectDate
  - d. exclosure: Y/N
  - e. subsampleFreshMass: To the nearest 0.01 g; for subsamples < 0.5 g total mass, weigh to the nearest 0.0001 g
- 8. Sort current-year biomass from OSD for each subsample, and place sorted, current-year biomass into the corresponding labeled coin envelope.
  - a. Sorted OSD may be discarded at this point.
- 9. Dry subsamples until dry; minimum of 48 h @ 65  $\,^{\circ}\,\mathrm{C},$  track drying progress as normal.
- 10. Remove dry samples from the oven one at a time, and immediately weigh and record:
  - a. subsampleDryMass: To the nearest 0.01 g; for masses < 0.5 g, weigh to the nearest 0.0001 g.

#### Data summary

```
## `summarise()` has grouped output by 'treatment'. You can override using the
## `.groups` argument.
```

# D11 OAES HBP subsampling



# Results: Mixed-Effects model analysis

1. Models accounting for subsampling effect on **dryMass** and using **clipID** as a random effect (no need to use **exclosure** as a fixed effect since random effect accounts for variation across exclosure treatment).

#### Model: Data from eventID = "HBP.2023.OAES.24" only

```
## Linear mixed model fit by maximum likelihood . t-tests use Satterthwaite's
     method [lmerModLmerTest]
## Formula: estDryMass ~ treatment + (1 | clipID)
##
      Data: longDF %>% dplyr::filter(eventID == "HBP.2023.OAES.24")
##
##
        AIC
                        logLik deviance df.resid
                 BIC
##
      672.6
               690.9
                       -329.3
                                  658.6
                                              93
##
##
  Scaled residuals:
##
       Min
                1Q Median
                                 3Q
                                        Max
  -4.9356 -0.3435 -0.0927 0.4176
                                    3.8149
##
##
## Random effects:
##
    Groups
             Name
                         Variance Std.Dev.
##
    clipID
             (Intercept) 199.77
                                   14.134
    Residual
                           19.19
                                    4.381
##
## Number of obs: 100, groups: clipID, 20
##
## Fixed effects:
                                                df t value Pr(>|t|)
##
                      Estimate Std. Error
## (Intercept)
                       32.3385
                                    3.3088 23.0967
                                                     9.774 1.13e-09 ***
```

```
## treatmentdryMass10 -0.0150
                                  1.3852 80.0000 -0.011
                                                            0.991
## treatmentdryMass15
                      0.2005
                                  1.3852 80.0000 0.145
                                                           0.885
## treatmentdryMass25
                                  1.3852 80.0000
                       1.4835
                                                  1.071
                                                            0.287
## treatmentdryMass50
                       0.4175
                                  1.3852 80.0000
                                                  0.301
                                                           0.764
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Correlation of Fixed Effects:
##
              (Intr) trtM10 trtM15 trtM25
## trtmntdrM10 -0.209
## trtmntdrM15 -0.209 0.500
## trtmntdrM25 -0.209 0.500 0.500
## trtmntdrM50 -0.209 0.500 0.500 0.500
## Type III Analysis of Variance Table with Satterthwaite's method
            Sum Sq Mean Sq NumDF DenDF F value Pr(>F)
## treatment 30.896
                    7.724
                               4
                                    80 0.4025 0.8063
Model: Data from eventID = "HBP.2023.OAES.36" only
## Linear mixed model fit by maximum likelihood . t-tests use Satterthwaite's
    method [lmerModLmerTest]
## Formula: estDryMass ~ treatment + (1 | clipID)
##
     Data: longDF %>% dplyr::filter(eventID == "HBP.2023.OAES.36")
##
##
                BIC
                      logLik deviance df.resid
       ATC
##
     840.2
              858.0
                      -413.1
                                826.2
##
## Scaled residuals:
##
      Min
               1Q Median
                               3Q
                                      Max
## -2.8516 -0.2981 0.0556 0.1988 7.0689
##
## Random effects:
## Groups
                        Variance Std.Dev.
            Name
            (Intercept) 4707.1
## clipID
                                 68.61
                         122.2
## Residual
                                 11.05
## Number of obs: 95, groups: clipID, 19
##
## Fixed effects:
                     Estimate Std. Error
                                              df t value Pr(>|t|)
##
## (Intercept)
                      77.5984 15.9427 19.7910 4.867 9.59e-05 ***
## treatmentdryMass10
                     5.1689
                                 3.5862 76.0000
                                                 1.441
                                                           0.154
## treatmentdryMass15
                      2.0226
                                  3.5862 76.0000
                                                 0.564
                                                           0.574
## treatmentdryMass25 -0.9163
                                  3.5862 76.0000 -0.256
                                                           0.799
## treatmentdryMass50
                      1.2926
                                  3.5862 76.0000
                                                 0.360
                                                           0.720
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Correlation of Fixed Effects:
              (Intr) trtM10 trtM15 trtM25
## trtmntdrM10 -0.112
## trtmntdrM15 -0.112 0.500
## trtmntdrM25 -0.112 0.500 0.500
## trtmntdrM50 -0.112 0.500 0.500 0.500
## Type III Analysis of Variance Table with Satterthwaite's method
```

```
Sum Sq Mean Sq NumDF DenDF F value Pr(>F)
                                     76 0.8501 0.498
## treatment 415.43 103.86
                                4
Model: Data from both eventIDs
## Linear mixed model fit by maximum likelihood . t-tests use Satterthwaite's
     method [lmerModLmerTest]
## Formula: estDryMass ~ treatment * eventID + (1 | clipID)
##
      Data: longDF
##
##
        AIC
                 BIC
                       logLik deviance df.resid
##
     1605.2
              1644.5
                       -790.6
                                1581.2
##
## Scaled residuals:
      Min
               1Q Median
                                3Q
                                       Max
## -3.7691 -0.2097 0.0132 0.2436 9.3973
##
## Random effects:
## Groups
            Name
                         Variance Std.Dev.
             (Intercept) 2395.63 48.945
## clipID
## Residual
                           69.36
## Number of obs: 195, groups: clipID, 39
## Fixed effects:
                                              Estimate Std. Error
##
                                                                        df t value
                                                                             2.913
## (Intercept)
                                               32.3385
                                                          11.1018 40.8116
## treatmentdryMass10
                                               -0.0150
                                                           2.6337 156.0000
                                                                            -0.006
## treatmentdryMass15
                                                0.2005
                                                           2.6337 156.0000
                                                                             0.076
## treatmentdryMass25
                                                1.4835
                                                           2.6337 156.0000
                                                                             0.563
## treatmentdryMass50
                                                0.4175
                                                           2.6337 156.0000
                                                                             0.159
## eventIDHBP.2023.OAES.36
                                               45.2599
                                                          15.9055 40.8116
                                                                             2.846
## treatmentdryMass10:eventIDHBP.2023.0AES.36
                                                5.1840
                                                           3.7733 156.0000
                                                                             1.374
## treatmentdryMass15:eventIDHBP.2023.OAES.36
                                                1.8221
                                                           3.7733 156.0000
                                                                             0.483
## treatmentdryMass25:eventIDHBP.2023.OAES.36
                                               -2.3998
                                                           3.7733 156.0000
                                                                            -0.636
## treatmentdryMass50:eventIDHBP.2023.0AES.36
                                                           3.7733 156.0000
                                                0.8751
                                                                             0.232
                                              Pr(>|t|)
## (Intercept)
                                               0.00578 **
## treatmentdryMass10
                                               0.99546
## treatmentdryMass15
                                               0.93941
## treatmentdryMass25
                                               0.57405
## treatmentdryMass50
                                               0.87425
## eventIDHBP.2023.OAES.36
                                               0.00690 **
## treatmentdryMass10:eventIDHBP.2023.0AES.36
                                               0.17146
## treatmentdryMass15:eventIDHBP.2023.0AES.36
                                               0.62984
## treatmentdryMass25:eventIDHBP.2023.0AES.36
## treatmentdryMass50:eventIDHBP.2023.0AES.36
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Correlation of Fixed Effects:
               (Intr) trtM10 trtM15 trtM25 trtM50 eIDHBP tM10:I tM15:I tM25:I
## trtmntdrM10 -0.119
## trtmntdrM15 -0.119 0.500
## trtmntdrM25 -0.119 0.500 0.500
## trtmntdrM50 -0.119 0.500 0.500 0.500
```

```
## eIDHBP.2023 -0.698 0.083 0.083 0.083 0.083
## tM10:IDHBP. 0.083 -0.698 -0.349 -0.349 -0.349 -0.119
## tM15:IDHBP. 0.083 -0.349 -0.698 -0.349 -0.349 -0.119 0.500
## tM25:IDHBP. 0.083 -0.349 -0.349 -0.698 -0.349 -0.119 0.500 0.500
## tM50:IDHBP. 0.083 -0.349 -0.349 -0.349 -0.698 -0.119 0.500 0.500 0.500
## Type III Analysis of Variance Table with Satterthwaite's method
                   Sum Sq Mean Sq NumDF DenDF F value Pr(>F)
                   156.97 39.24 4 156 0.5658 0.687851
## treatment
## eventID
                   602.74 602.74
                                 1 39 8.6897 0.005381 **
## treatment:eventID 299.22
                          74.80 4 156 1.0785 0.369134
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

2. Null model, and using **clipID** as a random effect. Theoretically, if all subsampling results in the same dryMass as the full sort, the null model should be no different than the "treatment" model.

```
## Linear mixed model fit by maximum likelihood . t-tests use Satterthwaite's
     method [lmerModLmerTest]
## Formula: estDryMass ~ 1 + (1 | clipID)
      Data: longDF
##
##
##
        AIC
                 BIC
                       logLik deviance df.resid
##
     1601.3
                       -797.7
                                1595.3
                                            192
              1611.2
##
## Scaled residuals:
##
       Min
                10 Median
                                3Q
                                       Max
## -3.9879 -0.1959 -0.0171 0.1825 9.6311
##
## Random effects:
   Groups
                         Variance Std.Dev.
##
            Name
             (Intercept) 2931.93 54.147
##
   clipID
## Residual
                           72.22 8.498
## Number of obs: 195, groups: clipID, 39
##
## Fixed effects:
              Estimate Std. Error
                                       df t value Pr(>|t|)
## (Intercept)
                55.340
                             8.692 39.000
                                           6.367 1.6e-07 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Data: longDF
## Models:
## m4ME: estDryMass ~ 1 + (1 | clipID)
## m3ME: estDryMass ~ treatment * eventID + (1 | clipID)
                AIC
        npar
                      BIC logLik deviance Chisq Df Pr(>Chisq)
## m4ME
           3 1601.3 1611.2 -797.67
                                     1595.3
## m3ME
         12 1605.2 1644.5 -790.60
                                     1581.2 14.151 9
                                                          0.1171
```

3. Linear model, using treatment\*exclosure, and no random effect.

```
##
## Call:
## lm(formula = estDryMass ~ exclosure * treatment + eventID, data = longDF)
##
## Residuals:
##
      Min
               1Q Median
                               3Q
                                      Max
## -79.356 -20.643 -5.911
                            8.659 292.004
##
## Coefficients:
                                Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
                                 27.6124
                                            12.1799
                                                      2.267
                                                              0.0246 *
## exclosureY
                                  8.3994
                                            16.3104
                                                      0.515
                                                              0.6072
## treatmentdryMass10
                                  0.4747
                                            16.5170
                                                      0.029
                                                              0.9771
## treatmentdryMass15
                                  1.7300
                                            16.5170
                                                      0.105
                                                            0.9167
## treatmentdryMass25
                                                      0.031
                                  0.5095
                                            16.5170
                                                              0.9754
## treatmentdryMass50
                                  0.5121
                                            16.5170
                                                      0.031
                                                              0.9753
## eventIDHBP.2023.OAES.36
                                 46.1195
                                             7.2963
                                                      6.321 1.91e-09 ***
## exclosureY:treatmentdryMass10
                                  3.9698
                                            23.0648
                                                      0.172
                                                              0.8635
## exclosureY:treatmentdryMass15
                                 -1.2515
                                            23.0648 -0.054
                                                              0.9568
## exclosureY:treatmentdryMass25
                                 -0.3805
                                            23.0648 -0.016
                                                            0.9869
## exclosureY:treatmentdryMass50
                                  0.6469
                                            23.0648
                                                     0.028
                                                             0.9777
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 50.91 on 184 degrees of freedom
## Multiple R-squared: 0.186, Adjusted R-squared: 0.1417
## F-statistic: 4.203 on 10 and 184 DF, p-value: 2.911e-05
## Analysis of Variance Table
##
## Response: estDryMass
##
                       Df Sum Sq Mean Sq F value
                                                    Pr(>F)
                                    5079 1.9595
## exclosure
                            5079
                                                    0.1632
                        1
## treatment
                        4
                             147
                                      37 0.0142
                                                    0.9996
## eventID
                        1 103552
                                 103552 39.9548 1.912e-09 ***
## exclosure:treatment
                        4
                             157
                                      39 0.0151
                                                    0.9995
## Residuals
                       184 476876
                                    2592
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

#### Summary of subsampling results

Table 1: Difference in estimated dryMass to total dryMass for subsampling (%)

eventID	ss10	ss15	ss25	ss50
HBP.2023.OAES.24	0.0	0.6	4.6	1.3
HBP.2023.OAES.36	6.7	2.6	-1.2	1.7

#### Conclusions

Summary of D11 OAES results:

- 1. Random effect associated with **clipID** explains considerable variability in the data. See summary outputs for all mixed-effects models.
- 2. Summary output for Mixed Effects model indicates that D11 OAES Clip Strips can be subsampled at the 15% level for all bouts with **herbGroup** = ALL.
  - Comparing results from two separate bouts, estimates of dryMass using a 10% subsample are more variable relative to total dryMass from the full sort compared to other subsampling levels, even though the difference is not significant.
  - When eventIDs are analyzed separately (m1ME, m2ME), other subsamples are not significantly different than the entire sorted subsample (p > 0.29) -> go with 15% subsample.
  - With both eventIDs analyzed together, there are no differences between the full sort dryMass and estimated dryMass from subsampling (p = 0.68).
- 3. Effect of exclosure\*treatment, as evaluated in standard linear model (m1LM):
  - Effect of exclosure is not significant (p = 0.16).
  - Effect of treatment not significant (p = 0.99).
  - No detection of exclosure: treatment interaction effect (p = 0.99).
  - Effect of eventID highly significant (p < 0.0001)