### Comparing SilviMetric and FUSION outputs

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#### Load packages

```
library(terra)
library(sf)
library(mapview)
```

#### Setup

```
HAGVRTfolder <- "C:/Users/bmcgaughey/SilviMetricTesting/TestOutput/plumas_vrt_tifs/"
HAGNNfolder <- "C:/Users/bmcgaughey/SilviMetricTesting/TestOutput/plumas_nn_tifs/"
HAGFUSIONfolder <- "C:/Users/bmcgaughey/SilviMetricTesting/TestOutput/plumas_normalized_tifs/"
FUSIONfolder <- "H:/FUSIONTestMetrics/Products_FUSIONTestMetrics_2024-05-16/FINAL_FUSIONTestMetrics_2022

SMfile <- "m_Z_max.tif"
#SMfile <- "m_Z_mean.tif"
FUSIONfile <- "elev_max_2plus_30METERS.img"
```

#### Read raster data and display extent and summary info

```
## FUSION raster:
                    ncol= 160
                                 nrow= 134
                                             cells= 21440
                               nrow= 134
## HAGVRT raster:
                    ncol= 158
                                             cells= 21172
## HAGNN raster:
                    ncol= 158 nrow= 134
                                             cells= 21172
## HAGFUSION raster: ncol= 158 nrow= 133
                                             cells= 21014
## FUSION raster:
                    SpatExtent: 634695, 639495, 4400265, 4404285 (xmin, xmax, ymin, ymax)
## HAGVRT raster:
                    SpatExtent: 634725, 639465, 4400265, 4404285 (xmin, xmax, ymin, ymax)
                    SpatExtent: 634725, 639465, 4400265, 4404285 (xmin, xmax, ymin, ymax)
## HAGNN raster:
## HAGFUSION raster: SpatExtent: 634725, 639465, 4400295, 4404285 (xmin, xmax, ymin, ymax)
```

#### Adjust extent

The rasters produced when using PDAL's hag\_nn are different from those produced using other hag filters. I don't know for sure why but suspect it has to do with the extent of ground points compared to the extent of non-ground points.

The HAGNN raster requires an extra operation to make it match the other rasters.

FUSION rasters are assigned a srs using an ESRI's projection file. The format of these files differs from the format used for the srs in the point cloud files so SilviMetric's srs doesn't exactly match FUSION's. To overcome this, I forced the srs for FUSION rasters to match those from SilviMetric.

```
## adjusted FUSION raster: SpatExtent : 634725, 639465, 4400295, 4404285 (xmin, xmax, ymin, ymax)
## adjusted HAGVRT raster: SpatExtent : 634725, 639465, 4400295, 4404285 (xmin, xmax, ymin, ymax)
## adjusted HAGNN raster: SpatExtent : 634725, 639465, 4400295, 4404285 (xmin, xmax, ymin, ymax)
## adjusted HAGFUSION raster: SpatExtent : 634725, 639465, 4400295, 4404285 (xmin, xmax, ymin, ymax)
```

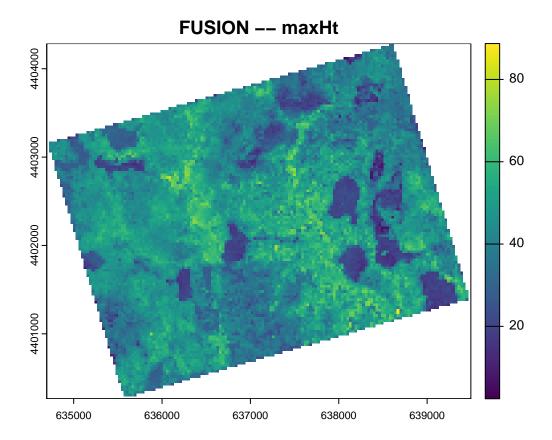
### Extent and summary information for adjusted rasters

```
## FUSION output:
                      ncol= 158
                                    nrow= 133
                                                   cells= 21014
## HAGVRT output:
                      ncol= 158
                                    nrow= 133
                                                   cells= 21014
## HAGNN output:
                      ncol= 158
                                    nrow= 133
                                                   cells= 21014
## HAGFUSION output: ncol= 158
                                    nrow= 133
                                                   cells= 21014
  FUSION raster:
##
       Layer_1
##
    Min.
            : 2.408
    1st Qu.:36.595
##
    Median: 44.817
##
    Mean
            :43.495
##
    3rd Qu.:51.475
            :88.718
##
   Max.
##
    NA's
            :7415
## HAGVRT raster:
##
       m_Z_{max}
            : 2.551
##
    \mathtt{Min}.
    1st Qu.:36.706
##
##
    Median :44.930
            :43.586
    Mean
##
    3rd Qu.:51.575
##
    Max.
            :88.835
##
    NA's
            :7409
## HAGNN raster:
##
       m_Z_{max}
##
    Min.
           : 2.44
##
    1st Qu.:36.67
##
   Median :44.89
##
    Mean
            :43.59
##
    3rd Qu.:51.61
##
    Max.
            :89.66
##
   NA's
            :7401
## HAGFUSION raster:
##
       m_Z_{max}
            : 2.41
   Min.
    1st Qu.:36.59
##
##
    Median :44.81
##
    Mean
            :43.49
    3rd Qu.:51.47
##
            :88.72
    Max.
    NA's
            :7414
```

### Compare raster values for maximum height

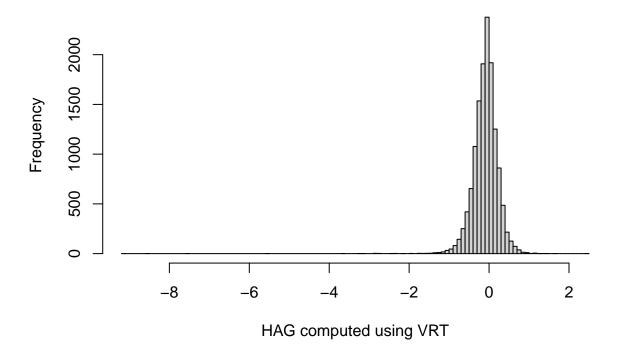
This metric (maximum HAG) doesn't involve any calculation so it basically tests that FUSION and Silvi-Metric are using the same HAG values and same point for the cells.

This is a plot of the FUSION output for maximum height.

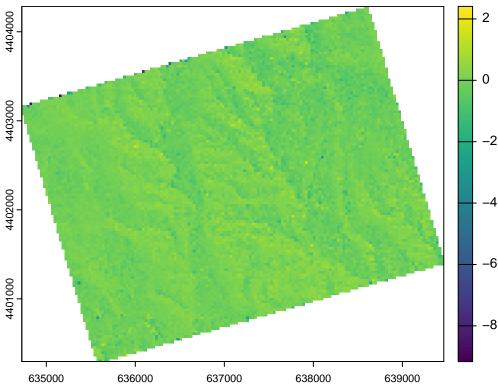


The first test uses HAG computed using the VRT with PDAL's hag\_dem filter. The interpolation problem with PDAL mentioned above leads to small differences between HAG compute by FUSION and using the VRT. In general, these differences are largest at the edge of the coverage area but there are patterns related to topographic features visible in the difference raster.

# FUSION minus SilviMetric -- maxHt



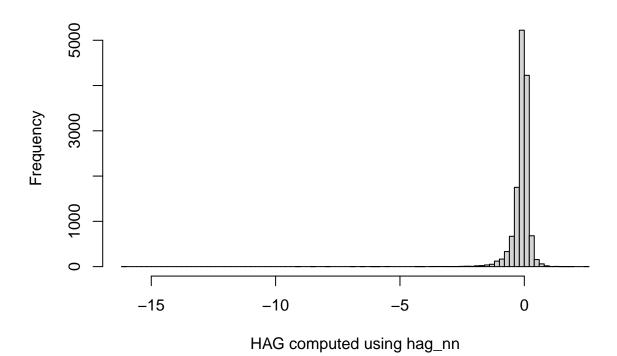




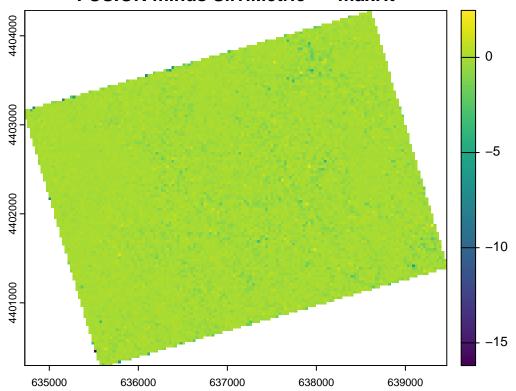
```
##
       Layer_1
           :-9.164
##
##
    1st Qu.:-0.255
    Median :-0.075
##
##
    Mean
            :-0.095
    3rd Qu.: 0.080
##
##
    Max.
            : 2.409
##
    NA's
            :7415
```

The second test uses HAG computed using PDAL's hag\_nn filter. This produces similar differences compared to the VRT method. Again, differences are largest at the edge of the coverage area. Interesting, topographic patterns are not reflected in the differences but are when using the VRT approach.

# FUSION minus SilviMetric -- maxHt



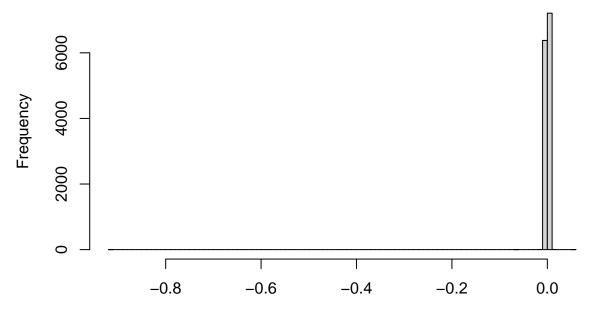




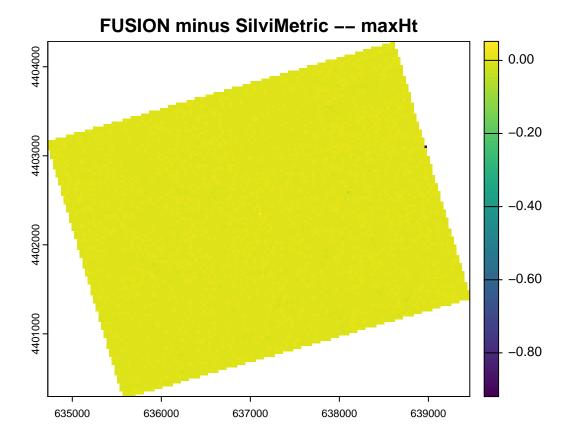
```
##
       Layer_1
##
            :-16.194
##
    1st Qu.: -0.187
##
    Median : -0.043
            : -0.110
##
    Mean
##
    3rd Qu.:
               0.049
               2.469
##
    Max.
    NA's
##
            :7415
```

The final test used FUSION to compute HAG for the point tiles. Then PDAL to convert the tiles back to COPC format (FUSION doesn't write COPC format). The normalized point tiles were then used with SilviMetric (so no HAG computation was needed). This test, compared to the first test, highlights the difference in the HAG values computed in FUSION and PDAL. The maximum heights for cells are nearly identical with differences attributable to numeric precision used for the HAG values (FUSION carries more significant digits... not necessarily more accurate values).

### FUSION minus SilviMetric -- maxHt



HAG computed using points normalized by FUSION



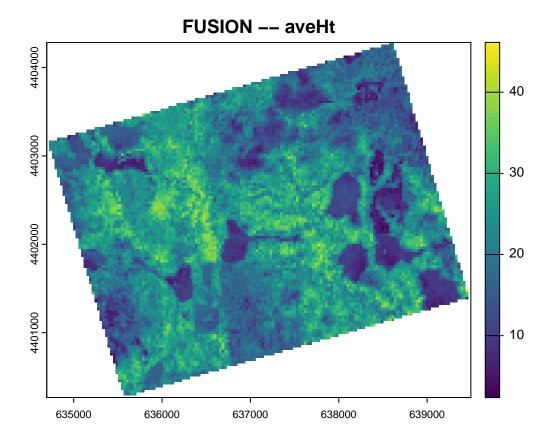
## Layer\_1 ## :-0.920 1st Qu.:-0.002 ## ## Median : 0.000 : 0.000 ## Mean 3rd Qu.: 0.003 ## : 0.052 ## Max. ## NA's :7415

I suspect that differences in the third test also result from the rules used to select point for a cell. FUSION does not include points that excatly fall on the top and right edges of a cell whereas, PDAL includes these points. While this does produce slightly different values for metrics, I don't think it affect the utility of the metrics. It is debatable which method is more "correct" but I don't expect to see large difference in metrics over large areas because of this difference...only for scattered individual cells.

### Compare raster values for mean height

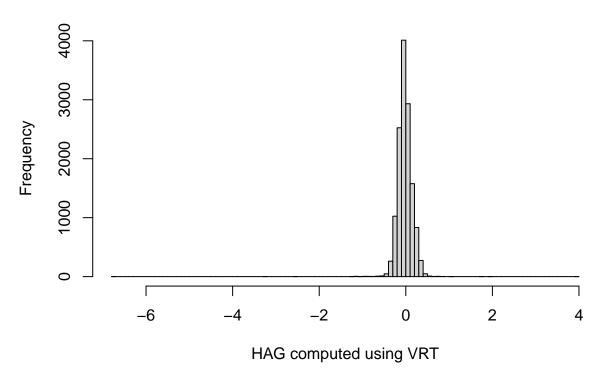
This metric (mean HAG) involves calculation so it tests that FUSION and SilviMetric are using the same points and calculation methods.

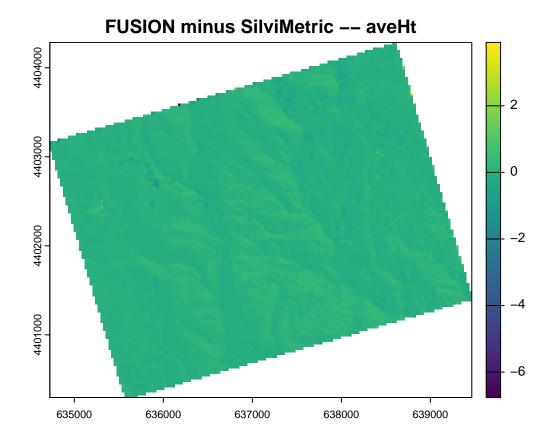
This is a plot of the FUSION output for average height.



This is the difference using HAG computed using a VRT with FUSION-derived DEM tiles.

# FUSION minus SilviMetric -- aveHt

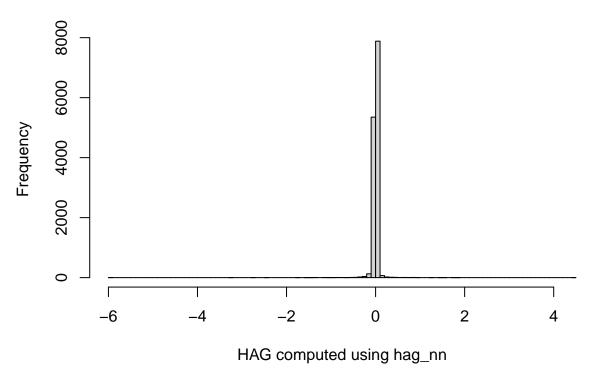


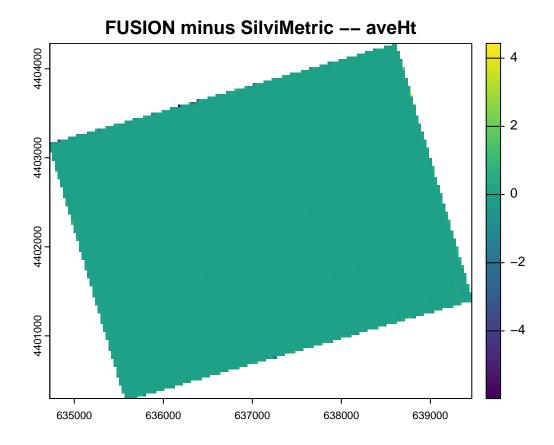


```
##
       Layer_1
          :-6.765
##
##
    1st Qu.:-0.114
    Median :-0.025
##
           :-0.019
##
    Mean
    3rd Qu.: 0.071
##
##
    Max.
           : 3.905
##
    NA's
           :7415
```

This is the difference using HAG computed using dem\_nn.

# FUSION minus SilviMetric -- aveHt

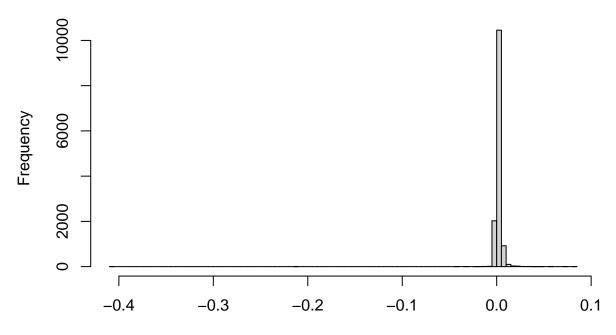




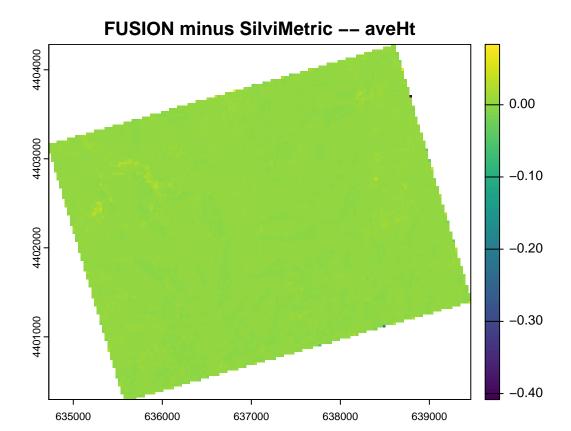
```
##
       Layer_1
         :-5.985
##
##
    1st Qu.:-0.006
   Median : 0.003
           : 0.000
##
   Mean
    3rd Qu.: 0.011
##
##
   Max.
           : 4.433
##
   NA's
           :7415
```

This is the difference using HAG computed by FUSION.

# FUSION minus SilviMetric -- aveHt



HAG computed using points normalized by FUSION



```
##
       Layer_1
##
            :-0.408
    1st Qu.: 0.001
##
##
    Median : 0.002
            : 0.002
##
    Mean
    3rd Qu.: 0.003
##
##
    Max.
            : 0.084
##
    NA's
            :7415
```

As with the comparison of maximum height values, the smallest differences occur when FUSION was used to normalize the point data. For this metric, the HAG and the set of points due to inclusion of points on the right and top edges of cells affect the comparison.

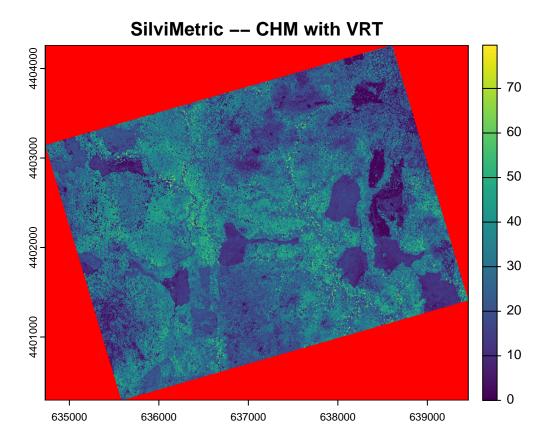
#### CHM comparison

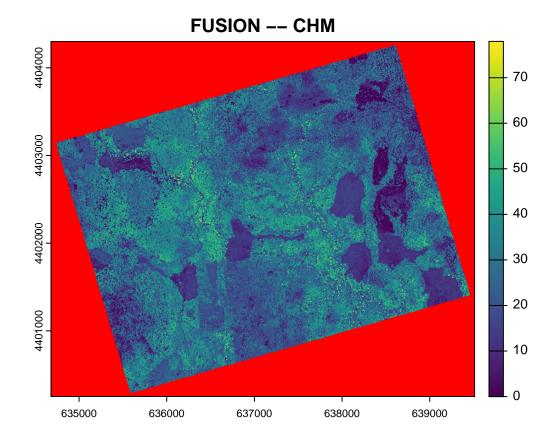
SilviMetric was used to produce a CHM using 1.5m resolution. HAG was computed using the FUSION-derived DEM tiles and below ground points were dropped from the data. As with the metric rasters, some cropping of the FUSION output was needed to match the extent of the SilviMetric CHM. FUSION's normal logic fills holes (areas with no points) using bilinear interpolation. This was turned off when creating this CHM.

FUSION's alignment for surfaces is different from the alignment for raster layers. For the CHM, the cell edges are a multiple of the cell size rather than the cell centers. This originated due to differences between lattice and raster (or GRID) formats and alignment. A version of SilviMetric that matched this alignment was used to create the SilviMetric CHM.

Looking closely at the following plots for my first run, I didn't see many empty (red) cells (NODATA or NA values for cells) in the FUSION output but did see some in the SilviMetric output. FUSION's behavior (CanopyModel) is to replace any valid negative point height value with 0.0. The logic in my build\_pipeline() function drops points if there HAG is below 0.0. I set the min\_HAG value to -100.0 and added an assign filter to set the Z (HAG) value for points below 0.0 to 0.0 and the empty cells were eliminated.

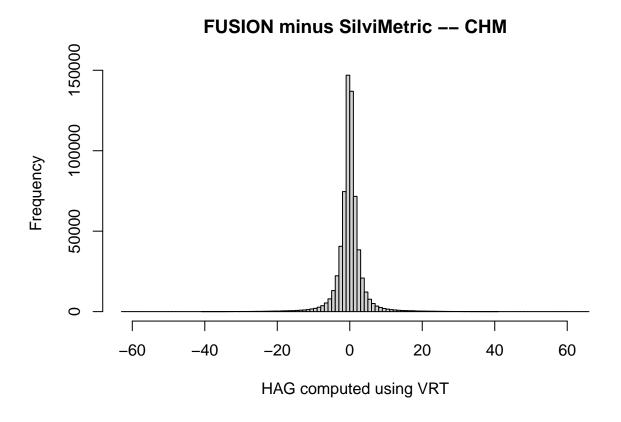
As with the HAG metrics, I suspect the interpolation process is causing the bulk of the difference. The remainder is due to the right and top edge points in cells in SilviMetric but these should be small differences.

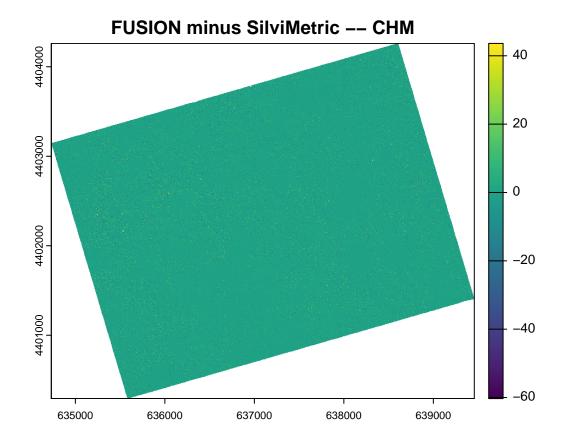




```
## Warning: [summary] used a sample
## Warning: [summary] used a sample
## Warning: [summary] used a sample
```

## Warning: [hist] a sample of 12% of the cells was used (of which 36% was NA)



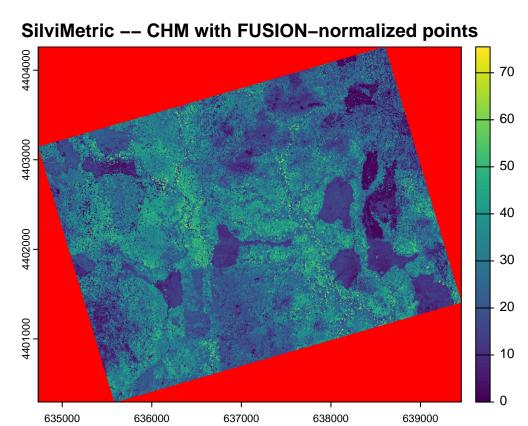


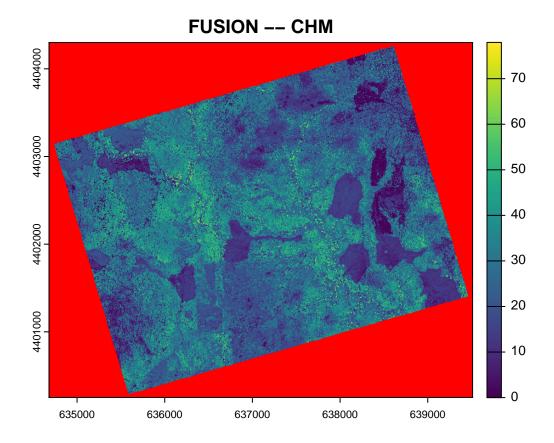
```
## SilviMetric raster:
##
      m_Z_{max}
  Min. : 0.00
##
   1st Qu.:16.83
##
   Median :25.64
         :25.84
   Mean
   3rd Qu.:34.55
##
          :79.06
##
   Max.
##
   NA's
          :36147
##
##
## FUSION raster:
##
      Layer_1
   Min. : 0.00
   1st Qu.:16.78
##
##
   Median :25.66
##
   Mean
         :25.83
##
   3rd Qu.:34.53
##
   Max.
         :72.75
##
   NA's
          :38793
##
##
## Difference raster:
##
      Layer_1
## Min. :-49.62
  1st Qu.: -1.25
```

## Median : -0.04 ## Mean : -0.05 ## 3rd Qu.: 1.15 ## Max. : 48.16 ## NA's :36174

### SilviMetric CHM using fusion-normalized points

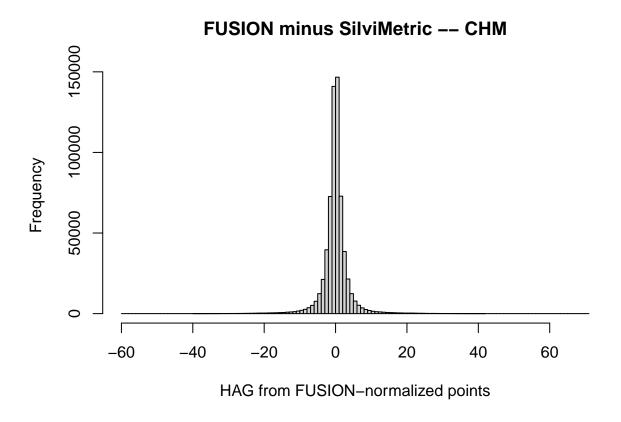
For completeness, I created another CHM using SilviMetric using the points normalized by FUSION. Differences are slightly smaller than the CHM created using VRT for normalization. Both CHMs are adequate for all applications.



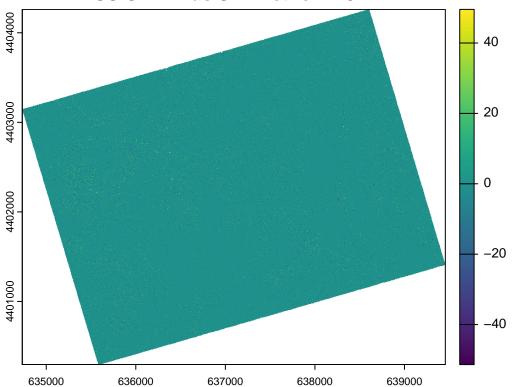


```
## Warning: [summary] used a sample
## Warning: [summary] used a sample
## Warning: [summary] used a sample
```

## Warning: [hist] a sample of 12% of the cells was used (of which 36% was NA)







```
## SilviMetric raster:
##
      m_Z_{max}
  Min. : 0.00
##
   1st Qu.:16.73
##
   Median :25.59
         :25.79
   Mean
##
   3rd Qu.:34.56
          :78.78
##
   Max.
          :36089
##
   NA's
##
##
## FUSION raster:
##
      Layer_1
  Min. : 0.00
   1st Qu.:16.78
##
##
   Median :25.66
##
   Mean
         :25.83
##
   3rd Qu.:34.53
##
   Max.
         :72.75
##
   NA's
          :38793
##
##
## Difference raster:
##
      Layer_1
## Min. :-47.67
  1st Qu.: -1.18
##
```

## Median : 0.00 ## Mean : 0.00 ## 3rd Qu.: 1.18 ## Max. : 45.17 ## NA's :36106