# Selecting DE Genes Continued

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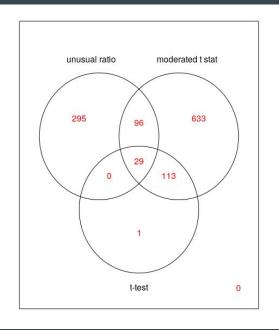
by Jake Sauter

#### **Covered This Week**

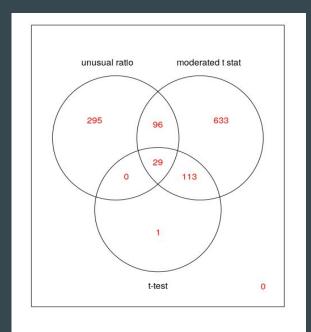
- Implemented Holms and FDR Family Wise Error Rate corrections for t-test
- Use of SAM in R
- Implemented permutation testing for t-test

### **T-test Results**

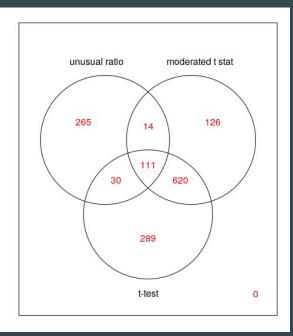
Bonferroni



Holms



FDR

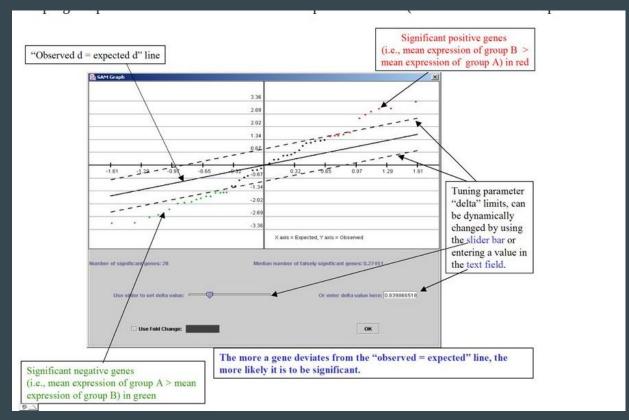


#### SAM Results

- The way to control for FDR in SAM is through the **delta** parameter
- SAM results allow for a table to be printed that shows how many genes are selected, and various FDR statistics associated with a particular delta value

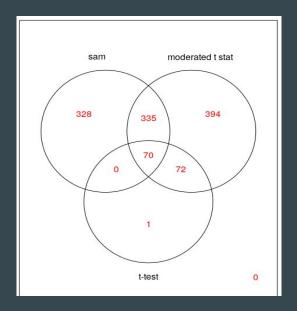
```
delta.table[, c(1,4,5,6)]
            delta # called
                           median FDR 90th perc FDR
     0.00000000
                      2127 0.504348388
                                          0.527150150
     0.001772127
                      2126 0.503690508
                                          0.527142359
     0.007088508
                      2118 0.502512485
                                          0.526771709
     0.015949144
                      2110 0.499779422
                                          0.525728268
     0.028354033
                      2091 0.496259888
                                          0.524004677
                      2061 0.491611968
                                          0.522425104
     0.044303177
     0.063796575
                      2048 0.484511353
                                          0.520192628
     0.086834227
                      2024 0.478973931
                                          0.516179702
     0.113416133
                      1994 0.472546391
                                          0.512766006
     0.143542293
                      1972 0.463618762
                                          0.508257404
     0.177212707
                      1945 0.450486464
                                          0.501000211
     0.214427376
                      1861 0.428748663
                                          0.492703063
     0.255186298
                      1774 0.401349687
                                          0.478891857
     0.299489475
                      1693 0.375429673
                                          0.466830259
     0.347336906
                      1595 0.345829794
                                          0.455152233
     0.398728591
                      1485 0.305725077
                                          0.435594161
     0.453664530
                      1372 0.269479568
                                          0.417217779
[18,] 0.512144724
                      1248 0.231122297
                                          0.399203319
[19.] 0.574169171
                      1179 0.199223692
                                          0.370823543
     0.639737873
                      1058 0.158026708
                                          0.349200482
     0.708850829
                      1004 0.129700857
                                          0.313664871
[22.] 0.781508039
                       937 0.106189736
                                          0.281083651
[23.] 0.857709503
                                          0.248509582
                       850 0.082516695
[24.] 0.937455221
                       780 0.060993632
                                          0.206541863
                       719 0.044994468
[25,] 1.020745193
                                          0.177104274
                       656 0.035225416
                                          0.151013431
     1.107579420
     1.197957901
                       586 0.023659938
                                          0.120712077
     1.291880635
                       545 0.016461086
                                          0.086794817
                       488 0.010027524
                                          0.064844658
     1.389347624
     1.490358867
                       438 0.004965431
                                          0.047668134
     1.594914365
                       385 0.004236738
                                          0.026973896
```

### SAM Results

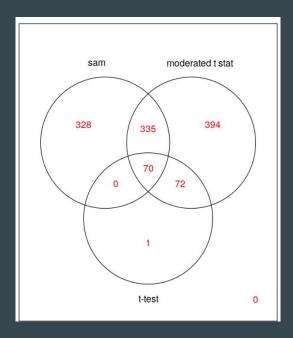


# **SAM Results**

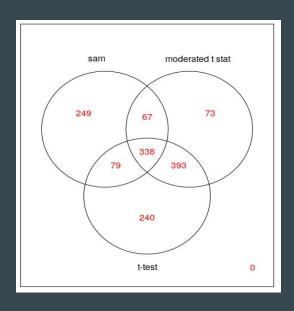
Bonferroni



Holms



FDR

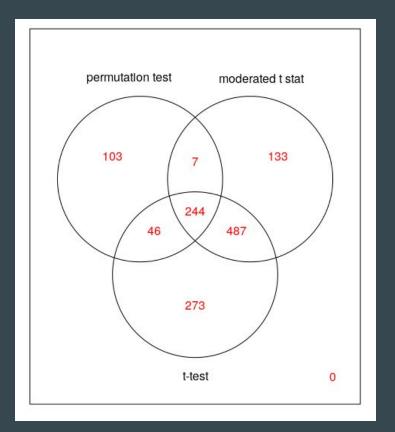


## **Permutation Testing**

- For permutation testing, our goal is to determine the distribution of our test statistic by computing the test statistic for all or some amount of permutations of the data
  - With the distribution of our test-statistic, we can produce a p-value with our actual test statistic, counting how many statistics in our distribution are greater than or equal to our actual test statistic
- If there are too many possible permutations to account for, we can choose permutations randomly (Monte Carlo Sampling) [2]
  - The more random permutations we perform, the closer our analysis become to an exact test

# **Permutation Testing**

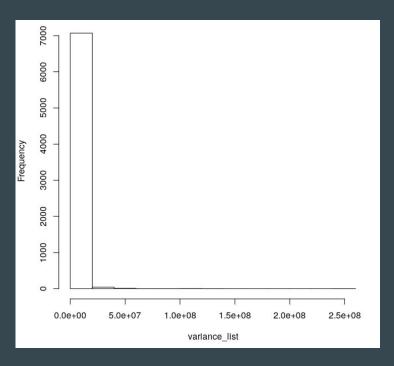
- 10,000 tests were performed for each gene
- Only 1 value was below the .05 threshold
- The 10 lowest p-values were 0.0324, 0.0694, 0.0741, 0.0775, 0.1013, 0.1033, 0.1103, 0.1186, 0.1205, 0.1284



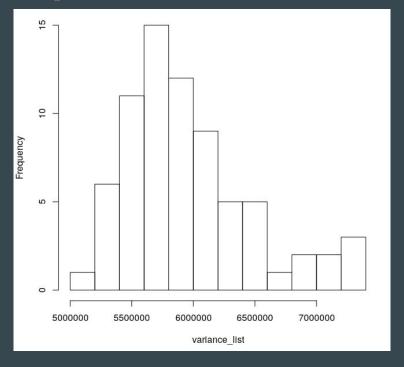
Selecting the 400 lowest p-values of permutation testing

### **Variance Observations**

#### Genes

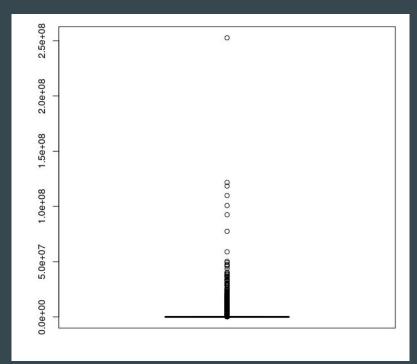


#### People

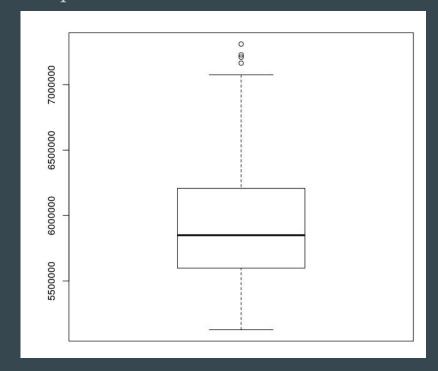


### **Variance Observations**

#### Genes



#### People



#### References

[1] Cui, Yan. "Data File: Stanford\_Large.Txt." Microarray Data Analysis II, compbio.uthsc.edu/microarray/lecture2.htm.

[2] Jianqiang, MA. "Permutation Test & Monte Carlo Sampling." Permutation Test & Monte Carlo Sampling, 18 Mar. 2009, www.let.rug.nl/nerbonne/teach/rema-stats-meth-seminar/presentations/Permutation-Monte-Carlo-Jianqiang-2009.pdf.

[3] Draghici Sorin. Statistics and Data Analysis for Microarrays: Using R and Bioconductor. Chapman and Hall, 2012.