Batch-effect Assessment on Network Using GTEx

BST 550 Project Presentation

Yun Zhang

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Batch-effect on Gene Network

- ► Technical effect: when, where
- Biological effect: types of death (if used ventilator), gender, ethnicity
- Mixture of cell types: especially for models that rely on correlation structure
- How much of the reported findings is due to batch-effects?
- Does an edge in a gene network really represent a biological mechanism? Or is it just due to similar composition of cell types?

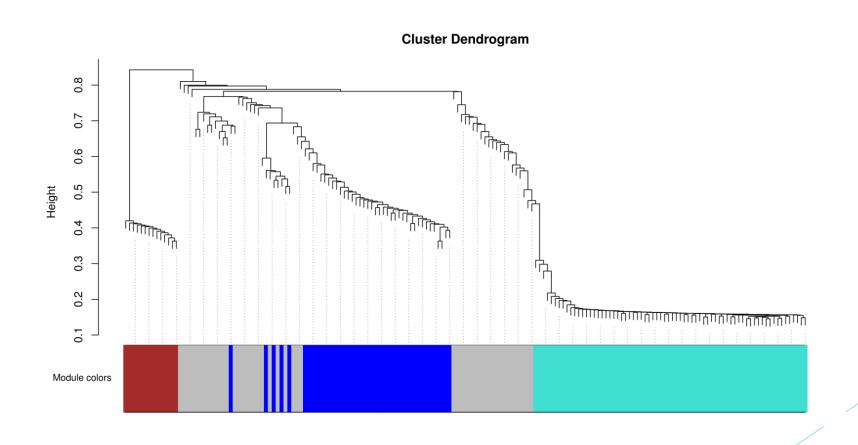
GTEx Data: Data Preprocessing

- Focused on the lung tissue samples:
 - ▶ 133 samples
- RNA-seq
- Variance-stabilizing transformation on the count data
- Filtered out low expression and small variation genes
 - ► Sample data 1: 175 genes
 - Sample data 2: 2157 genes

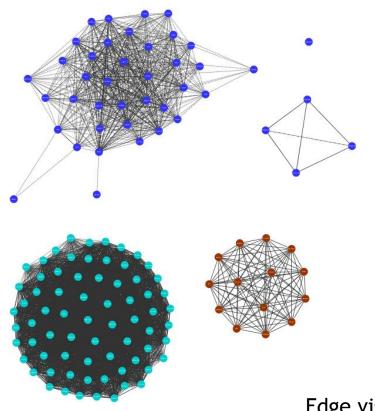
Analysis Plan

- Weighted Gene Co-expression Network Analysis (WGCNA)
 - ► Fit a correlation network
 - ► Gene modules and their corresponding eigengenes
- Investigate potential batch-effects
 - Gender
 - Ventilator
- Adjust known/unknown batch-effects using existing methods
 - ComBat for known effects
 - Surrogate Variable Analysis (SVA) for unknown effects

Network by WGCNA for Sample Data 1



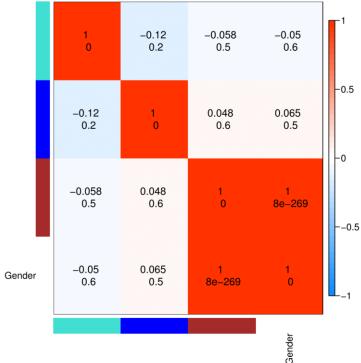
An Actual View of the Network



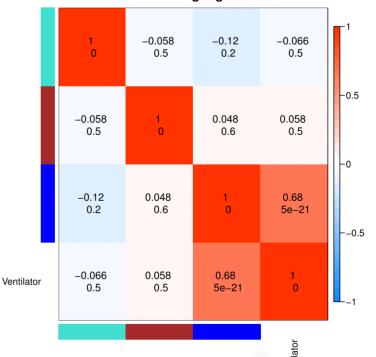
Edge visibility: correlation > 0.5

Suspects of Gene Modules Induced by Batch-Effect

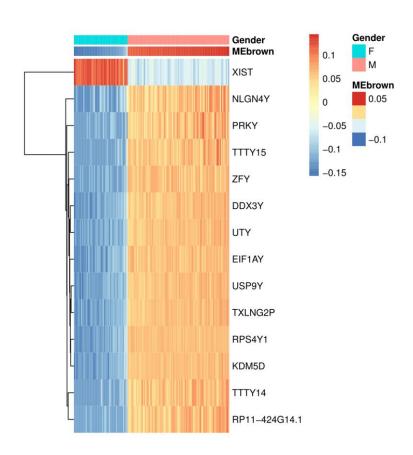
Correlation between eigengenes and trait variables

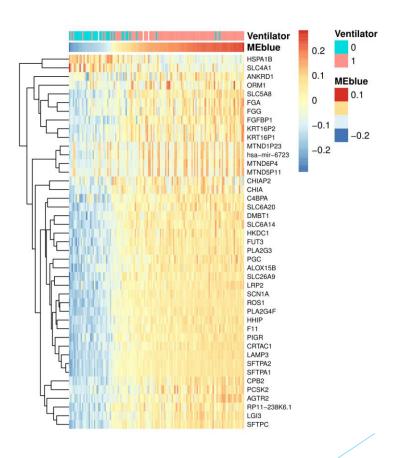


Correlation between eigengenes and trait variables

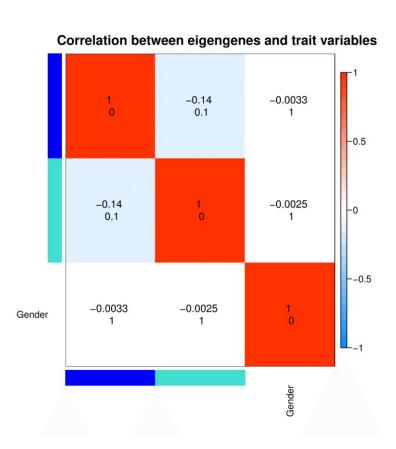


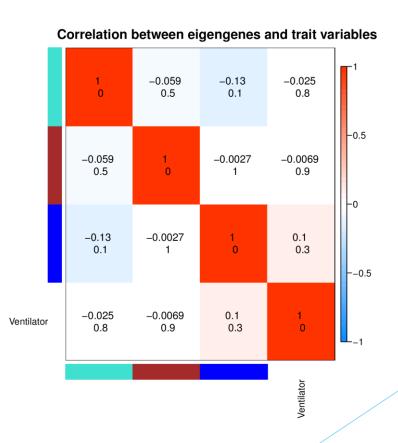
Gene Expression Profile of Suspicious Modules





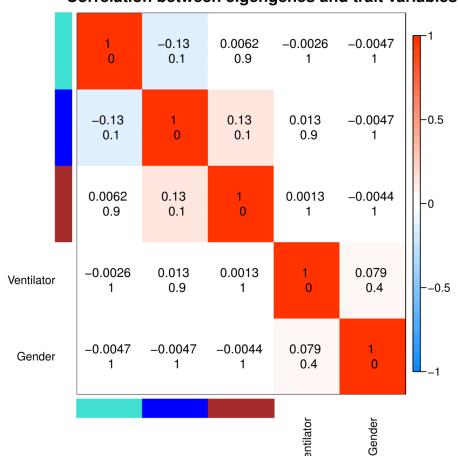
Batch-Effect Adjustment Using ComBat (One Batch-Effect A Time)





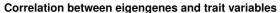
Batch-Effect Adjustment Using ComBat (Combined Batch-Effects)

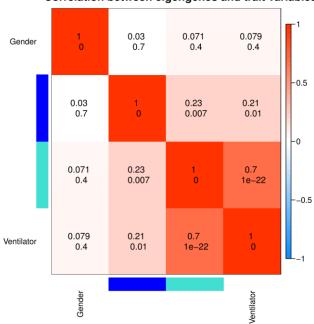
Correlation between eigengenes and trait variables



Batch-Effect Adjustment Using SVA (Bad Example)

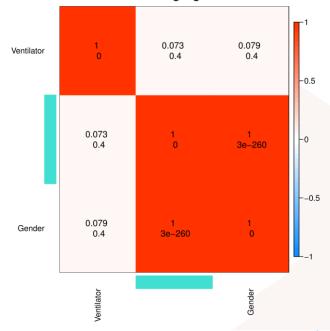
Adjust for gender





Adjust for ventilator

Correlation between eigengenes and trait variables



Conclusion

- All currently existing batch-effect removal methods focus on adjusting batch-effects for differential expression
- We conducted the first assessment of batch-effect adjustment on network
- Sample data 2 shows similar results as sample data 1
- ComBat can effectively remove batch-effects for correlation network; however, there is technical difficulty of using SVA to adjust the batch-effects
- Future work:
 - Look at other types of network: information theory, Bayesian inference
 - ▶ Batch-effect methods specifically for network, e.g. improvement of SVA