## Intersect Enrichment Model

$$y_{i,j}^{DEG} \sim Binomial(n_{i,j}^{DEG}, f(\pi_{i,j}^{DEG})) \qquad (1.1)$$

$$y_{i,j}^{\neg DEG} \sim Binomial(n_{i,j}^{\neg DEG}, f(\pi_{i,j}^{\neg DEG})) \qquad (1.2)$$

$$\pi_{i,j}^{DEG} = \pi_{i,j} + \frac{\alpha + \beta_i + \gamma_j + \epsilon_{i,j}}{2} \qquad (1.3)$$

$$\pi_{i,j}^{\neg DEG} = \pi_{i,j} - \frac{\alpha + \beta_i + \gamma_j + \epsilon_{i,j}}{2} \qquad (1.4)$$

$$\alpha \sim normal(0,1) \qquad (1.5)$$

$$\beta_i \sim multi-normal(\vec{0}, \sigma_{\beta}^2 \Sigma_i) \qquad (1.6)$$

$$\gamma_j \sim multi-normal(\mu_k, \sigma_{\gamma}^2 \Sigma_j) \qquad (1.7)$$

$$\epsilon_{i,j} \sim matrix-normal(0, \sigma_{\epsilon} \Sigma_i, \sigma_{\epsilon} \Sigma_j) \qquad (1.8)$$

$$\mu_k \sim normal(0, \sigma_{\mu}) \qquad (1.9)$$

$$\pi_{i,j} \sim matrix-normal(\eta_j, \sigma_{\pi} \Sigma_i, \sigma_{\pi} \Sigma_j) \qquad (1.10)$$

$$\eta_j \sim multi-normal(\lambda_k, \sigma_{\gamma}^2 \Sigma_j) \qquad (1.11)$$

$$\lambda_k \sim normal(\mu, \sigma_{\lambda}) \qquad (1.12)$$

$$\mu \sim normal(0, 2) \qquad (1.13)$$

$$\sigma_{\beta, \gamma, \epsilon, \mu, \pi, \eta, \lambda} \sim half-normal(0, 1) \qquad (1.14)$$

## Directionality Enrichment Model

$$y_{i,j} \sim Binomial(n_{i,j}, f(\pi_{i,j}))$$

$$\pi_{i,j} \sim normal(\vec{\mu_j}, \sigma_j)$$

$$(2.2)$$

$$\vec{\mu_j} \sim multi-normal(\vec{0}, SRS^T)$$

$$R = G_{SNP} \times \theta + I \times (1 - \theta)$$

$$\theta \sim Beta(1, 1)$$

$$diag(S) = \delta e^{\gamma_k}$$

$$\gamma_k \sim normal(0, \sigma_\gamma)$$

$$\sigma_j = \rho e^{\lambda_j}$$

$$\lambda_j \sim normal(0, \sigma_\lambda)$$

$$\rho, \delta \sim half-normal(0, 2)$$

$$\sigma_{\gamma,\lambda} \sim half-normal(0, 1)$$

$$(2.1)$$

Table 1: Intersect Enrichment Model Key

| Symbol                                | Support              | Interpretation  |
|---------------------------------------|----------------------|---|
| $\overline{i}$                        | $\{1, 2,, 15\}$      | tissue index  |
| j                                     | $\{1, 2,, 99\}$      | trait index   |
| k                                     | $\{1, 2,, 12\}$      | trait category index  |
| $n_{i,j}^{DEG}$                       | $\mathbb{N}_0$       | observed # of Differentially Expressed Genes (DEG) for tissue $i$ and trait $j$ |
| $n_{i,j}^{DEG} \\ n_{i,j}^{\neg DEG}$ | $\mathbb{N}_0$       | observed $\#$ of non-DEGs for tissue $i$ and trait $j$                          |
| $y_{i,j}$                             | $\{1, 2,, n_{i,j}\}$ | observed # of PrediXcan hits for tissue $i$ and trait $j$                       |
| f                                     |                      | $f: \mathbb{R} \to (0,1)$ , logit function (maps log-odds to probabilities)     |
| $\pi_{i,j}$                           | $\mathbb{R}$         | mean log-odds of observing a PrediXcan hit for tissue $i$ and trait $j$         |
| $\alpha$                              | $\mathbb{R}$         | average difference in log-odds between DEGs and non-DEGs                        |
| $eta_i$                               | $\mathbb{R}$         | relative deviation to difference in log-odds between DEGs and non-DEGs for      |
|                                       |                      | tissue $i$  |
| $\gamma_j$                            | $\mathbb{R}$         | relative deviation to difference in log-odds between DEGs and non-DEGs for      |
|                                       |                      | ${\rm trait}\ j$  |
| $\mu_k$                               | $\mathbb{R}$         | relative deviation to difference in log-odds between DEGs and non-DEGs for      |
|                                       |                      | trait category $k$  |
| $\epsilon_{i,j}$                      | $\mathbb{R}$         | relative deviation to difference in log-odds between DEGs and non-DEGs for      |
|                                       |                      | trait $i \times \text{tissue } j$   |
| $\sigma^*$                            | $\mathbb{R}_{>0}$    | various scale hyperparameters (for normal priors)                               |
| $\Sigma_*$                            |                      | externally estimated correlation matrix   |
| $\lambda_k$                           | $\mathbb{R}$         | mean log-odds of observing a PrediXcan hit for trait in category $k$            |
| $\eta_j$                              | $\mathbb{R}$         | mean log-odds of observing a PrediXcan hit for trait $j$                        |

Table 2: Directionality Enrichment Model Key

| Symbol  | Support              | Interpretation  |
|---|----------------------|---|
| $\overline{i}$  | $\{1, 2,, 15\}$      | tissue index  |
| j   | $\{1, 2,, 99\}$      | trait index   |
| $\tilde{k}$   | $\{1, 2,, 12\}$      | trait category index  |
| $n_{i,j}$   | $\mathbb{N}_0$       | observed $\#$ of Differentially Expressed Genes (DEG) $\cap$ PrediXcan hits for   |
| 7.5   |                      | tissue $i$ and trait $j$  |
| $y_{i,j}$   | $\{1, 2,, n_{i,j}\}$ | observed # of positive associations in the set of DEGs $\cap$ PrediXcan hits for  |
| ,,,   |                      | tissue $i$ and trait $j$  |
| f   |                      | $f: \mathbb{R} \to (0,1)$ , logit function (maps log-odds to probabilities)       |
| $\pi_{i,j}$   | $\mathbb{R}$         | mean log-odds of observing a positive association for tissue $i$ and trait $j$    |
| $egin{aligned} \pi_{i,j} \ ec{\mu_j} \ S \end{aligned}$ | $\mathbb{R}$         | mean log-odds of observing a positive association for trait $j$                   |
| $\mathring{S}$  | $\mathbb{R}_{>0}$    | diagonal matrix of standard deviations of trait-wise log-odds enrichments in      |
|   |                      | positive effects  |
| R   | Correlation Matrices | correlation matrix of mean positive association log-odds across traits            |
| G   | Correlation Matrices | externally estimated SNP correlation matrix across traits                         |
| I   |                      | $j \times j$ identity matrix  |
| heta  | $\in [0,1]$          | weight proportion between G and I   |
| $\delta$  | $\mathbb{R}_{>0}$    | geometric average standard deviation of trait-wise enrichment in positive effects |
| $\gamma_k$  | $\mathbb{R}$         | multiplicative category deviation to $\delta$ for trait category $k$              |
| ho  | $\mathbb{R}_{>0}$    | geometric average standard deviation of tissue-wise enrichment in positive ef-    |
|   |                      | fects for a given trait   |
| $\lambda_j$   | $\mathbb{R}_{>0}$    | multiplicative category deviation to $\rho$ for trait $j$                         |

Table 3: General Notation for Acronyms and Abbreviations

| Symbol          | Interpretation   |
|-----------------|--|
| MoTrPAC         | Molecular Transducers of Physical Activity Consortium                  |
| EET             | Endurance Exercise Training  |
| F344            | Fischer 344 Inbred Rats  |
| GTEx            | Genotype-Tissue Expression project                                     |
| GWAS            | Genome-Wide Association Study  |
| GCTA            | Genome-wide Complex Trait Analysis                                     |
| TWAS            | Transcriptome-Wide Association Study                                   |
| LDSC            | Linkage Disequilibrium Score Regression                                |
| SNP             | Single Nucleotide Polymorphism   |
| MESC            | Mediated Expression Score Regression                                   |
| eQTL            | Expression Quantitative Trait Loci                                     |
| $h_{SNP}^2$     | narrow-sense heritability captured by variation at SNPs                |
| $8w_F1_M1$      | upregulated DEGs in both males and females after 8 weeks of training   |
| $8w_F-1_M-1$    | downregulated DEGs in both males and females after 8 weeks of training |
| IHW             | Independent Hypothesis Weighting                                       |
| $\mathrm{BF}\%$ | Body Fat Percentage  |
| ADRNL           | Adrenals   |
| BAT             | Brown Adipose  |
| COLON           | Colon  |
| CORTEX          | Cortex   |
| SKM-GN          | Gastrocnemius  |
| HEART           | Heart  |
| HIPPOC          | Hippocampus  |
| HYPOTH          | Hypothalmus  |
| KIDNEY          | Kidney   |
| LIVER           | Liver  |
| LUNG            | Lung   |
| BLOOD           | Blood Rna  |
| SMLINT          | Small Intestine  |
| SPLEEN          | Spleen   |
| SKM-VL          | Vastus Lateralis   |
| WAT-SC          | White Adipose  |