## Proteome Association Studies in Populations of Diverse Ancestries

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## Introduction

Most genome-wide association studies (GWAS) have been conducted in populations of European ancestries, but these results do not reflect the global population or replicate well in non-European populations.
Additionally, investigating traits at the proteome level may provide more insight to biological mechanisms than at the genome level. Using data from the Trans-Omics for Precision Medicine (TOPMed) consortium, we have built protein models to perform proteome-wide association studies (PWAS) using S-PrediXcan in published multiethnic GWAS data from the
Population Architecture using Genomics and Epidemiology (PAGE) study (Wojcik et al 2019). This output reveals significant associations between genes and a variety of complex traits in non-European populations.

## Methods

- S-PrediXcan: statistical analysis software, takes GWAS summary statistics, protein level models, and phenotype data to find associations between proteome and traits
- Bonferroni significance threshold used to find the most significant associations
- The PAGE study: the most diverse GWAS to date, collecting data in 28 phenotypes in a sample size of ${ }^{\sim} 50,000$ non-European individuals; publicly available summary statistics used for our discovery population

| - Body mass index | - Hypertension |
| :--- | :--- |
| - Chronic kidney disease | - LDL cholesterol levels |
| - Cigarettes per day (smoking) | - Mean corpuscular hemoglobin |
| - Coffee consumption | - PR interval |
| - C-reactive protein levels | - Platelet count |
| - Diabetes (type II) | - QRS interval |
| - Diastolic blood pressure | - QT interval |
| - End-stage renal failure | - Systolic blood pressure |
| - Fasting glucose levels | - Total cholesterol |
| - Fasting insulin levels | - Triglyceride levels |
| - Glomerular protein levels | - Waist-hip ratio |
| - Height | - Waist-hip ratio (female) |
| - Hemoglobin levels | - Waist-hip ratio (male) |
| - HDL cholesterol levels | - White blood cell count |

- TOPMed models: made with relatively diverse dataset from the TOPMed project
- PWAS is a new method compared to more common TWAS (transcriptome); we are still refining these protein models
- AFA: African American, $n=183$
- CHN: Chinese, $n=77$
- EUR: European, $n=414$
- HIS: Hispanic, $n=301$
- ALL: all groups, $n=975$
- Coloc: software tool used to determine the colocalization of genes in a GWAS, provides insight to which of the significant S-PrediXcan results may be causal
- Replication datasets: taken from published GWAS summary statistics from the UK Biobank, other studies publicly available in the GWAS Catalog

Results


- I94 Bonferroni significant, colocalized, and replicated protein-trait pairs - In non-European PAGE data: more significant results when using the AFA (dark blue) and HIS (red) training models than the EUR (yellow) models, significance threshold shown as the dotted line

Discussion
7 - I94 total associations across all training models 27 unique protein-trait pairs

| Gene | Protein | Phenotype |
| :---: | :---: | :---: |
| CRP | CRP | C-reactive <br> HDL cholesterol <br> LDL cholesterol <br> Total cholesererl <br> C-reactive |
| APOE | Apo E | HDL cholesterol <br> LDL cholesterol <br> Total cholesterol <br> C-reactive |
|  | Apo E2 | HDL cholesterol <br> LDL cholesterol <br> Total cholesterol <br> C-reactive |
|  | Apo E3 | HDL cholesterol <br> LDL cholesterol <br> Total cholesterol <br> C-reactive <br> Triglycerides |
| HP | Apo E4 | LDL cholesterol <br> Total cholesterol |
| CD36 | Mixed-type haptoglobin | C-reactive <br> HDL cholesterol <br> Platelet count |
| CSF3 | CD36 antigen | WBC count <br> C-reactive |
| IL6R | G-CSF | C-reactive |
| IL1RN | IL-6 sRa | Height |
| FRZB | IL-1Ra |  |



- Published literature supports these associations and provides evidence to the validity of our proteome models. Only one pair, $\mathrm{CD}_{3} 6$ antigen $\left(\mathrm{CD}_{3} 6\right.$ gene) and C-reactive protein level, is a novel finding among published GWAS. We plan to continue refining our training models and conducting more PAS in the future.
- Finding more significant associations in non-European populations with non-European models supports previous work that shows prediction improves with population-matched data. This further emphasizes the need for more diverse GWAS in the future


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