

Prof. Colin Palmer Dr Radha Venkatesan

Gittu George



- iPheGWAS <- PheGWAS + Heuristic Method
- Application of iPheGWAS to Inspired Data
- Limitations
- Future Work

### COMPUTATIONAL APPROACHES DEVELOPED



iPheGWAS

PheGWAS

Heuristic Method to order traits based on genetic similarity

### PheGWAS



Original Pape

- PheGWAS was developed with the broad aim of developing a visualization approach to explore 'many variants-many phenotypes' in one plot
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- PheGWAS is capable of identifying independent signals
- Provides insights to
  - Pleiotropy
  - Local genetic correlation

#### Genetics and population analysis

### PheGWAS: a new dimension to visualize GWAS across multiple phenotypes

Gittu George\*, Sushrima Gan<sup>†</sup>, Yu Huang<sup>†</sup>, Philip Appleby, A. S. Nar, Radha Venkatesan, Viswanathan Mohan, Colin N. A. Palmer and Alex S. F. Doney\*

NIHR Global Health Research Unit on Global Diabetes Outcomes Research, Division of Population Health and Genomics, University of Dundee, Ninewells Hospital and Medical School, Dundee, UK

\*To whom correspondence should be addressed. <sup>†</sup> The authors wish it to be known that these authors contributed equally. Associate Editor: Russell Schwartz

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#### Abstract

**Motivation:** PheGWAS was developed to enhance exploration of phenome-wide pleiotropy at the genome-wide level through the efficient generation of a dynamic visualization combining Manhattan plots from GWAS with PheWAS to create a 3D 'landscape'. Pleiotropy in sub-surface GWAS significance strata can be explored in a sectional view plotted within user defined levels. Further complexity reduction is achieved by confining to a single chromosomal section. Comprehensive genomic and phenomic coordinates can be displayed. **Results:** PheGWAS is demonstrated using summary data from Global Lipids Genetics Consortium GWAS across

- PheGWAS takes ~12 sec to complete(running in a 8 GB RAM machine).
  - Tested on 4 summary statistics files (HDL,LDL,TRIGS,TC from GLGC) having ~2.5 million SNPs



### Heuristic Approach

- This heuristic approach provide insights about the pattern of genetic relationship among phenotypes
- We have shown that order of clustering of traits computed were consistent with the order produced by the genetic correlations calculated by the LDSC.

• Our method takes 1.5 minutes for computation as compared to 12 minutes in LDSC for ordering 14 traits based on their genetic similarity

iPheGWAS





## iPheGWAS retina traits in GoDARTS

#### University of Dundee

#### Genome View



- Exploring all chromosomes suggest that there is no pleiotropic regions across the genome
- Seems reasonable that veins and artery measurements would cluster together in each of the measurement categories.
- Veluchamy et al .[] showed rs7991229 is associated with TortA which is in LD with rs9559797 that was found in chromosome 13 (r2 0.91). But this is not an independent confirmation.
- No other signals where identified in the literature





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### Comparison of iPheGWAS of Clinical risk factors in GoDARTS & MDRF



**GoDARTS** - Genome View

**MDRF** - Entire Genome View





### Comparison of iPheGWAS of Clinical risk factors in GoDARTS & MDRF



#### GoDARTS – Chromosome 8 View

MDRF – Chromosome 8 View





in chromosome 8, Position group 19, HDL and triglycerides shows pleiotropy in GoDARTS & MDRF

• From previous literatures rs3916027 and LPL gene in this region is associated with triglycerides\*

\* K. Musunuru et al., "Multi-ethnic analysis of lipid-associated loci: The NHLBI CARe project," PLoS One, vol. 7, no. 5, May 2012.

# Comparison of iPheGWAS of Clinical risk factors in GoDARTS & MDRF GoDARTS – Chromosome 11 View MDRF – Chromosome 11 View





In chromosome 11, Position group 116, HDL and triglycerides shows pleiotropy in GoDARTS. But for the same position group within the MDRF significance was only found with triglycerides.

• rs964184 and APOA5, APOC3, ZNF259 are associated with lipid traits [1]–[3].

S. Kathiresan et al., "Common variants at 30 loci contribute to polygenic dyslipidemia," Nat. Genet., vol. 41, no. 1, pp. 56–65, Jan. 2009.
D. M. Waterworth et al., "Genetic variants influencing circulating lipid levels and risk ofcoronary artery disease," Arterioscler. Thromb. Vasc. Biol., vol. 30, no. 11, pp. 2264–2276, Nov. 2010.
C. T. Johansen et al., "Mutation skew in genes identified by genome-wide association study of hypertriglyceridemia," Nat Genet, vol. 42, no. 8, pp. 684–687, 2010.

### Comparison of dendrograms of Clinical risk factors in GoDARTS & MDRF



#### GoDARTS – Dendrograms

MDRF – Dendrograms



- These population differences that our tool is capable of capturing might be useful for biomedical researchers to open up avenues for further investigations.
- Previous literature shows that genetic architecture of lipid traits differs by ethnicity and more ethnicity specific studies need to be conducted to clarify the underlying causes of such differences\*

### PhePheWAS of retina traits in GoDARTS and MDRF

rrelatio



Displays the phenome-phenome associations. This provides insights to explore the phenotypic multiple relationship variables between simultaneously.

0.1

0.05

0

-0.05

CRAE

Retina Traits

CRVE

FDa FDV

> TOTA TON

Correlation



## LIMITATIONS



• iPheGWAS is considered to be an avenue for hypothesis generation, but for further assessments have to rely on other statistical softwares

• Our Heuristic method doesn't show the sign of the genetic similarity. It only gives the strength of the association

• MDRF and GoDARTS (NHS data) are completely different health care systems and that can introduce some bias

## FUTURE WORK



- Integrating other statistical softwares into iPheGWAS will take researchers towards "ONE-STOP-SHOP" concept
- Implementation of iPheGWAS along with other GWAS tools in HIC Hadoop-Spark cluster
- Applying PheGWAS on many traits (e.g. PheGWAS to prescription data in GoDARTS)
- It would be interesting to investigate more on the dendrogram difference in GoDARTS and MDRF populations.



GWAS/FIGIWAS	≡			University of Dundee
👥 gwas				
<b>FIGIWAS</b>		GWAS/FIGIWAS	≡	
Platform:		<b>III</b> GWAS		
Phenotype File Path:		FIGIWAS		
/user/ggeorge/LpPLA2_trunc.		Select Phenotypes:		
Outcome Of Interest:		cholestrol		
fdfdf		sbp		
Covariates:		dbp HDL TRIG		
GWAS IT		Select Chromosome:		
		Entire Chromosome 🔹		
		PheGWAS IT		

PheGWAS



• Endocrine system

• Eye

#### 20 18 -log 10(P) 16 14 12 10 8 TreatmentOfHypogly TreatmentOfGlau ThyroidHormon ReplacementTher PosteriorPituitaryHormone OtherAntiInflammatoryP OcularDiagnosPeriopPrepr MydritticsAndCyclop Insulin GlacocorticoidTher DiabeticDiagnosticMonitorin Corticosteroids 9 <sup>10</sup> <sup>11</sup> <sup>12</sup> <sup>13</sup> <sup>14</sup> <sup>15</sup> <sup>16</sup> <sup>17</sup> <sup>18</sup> <sup>19</sup> <sup>20</sup> <sup>21</sup> <sup>22</sup> BisphosphonatesandOther Antivirals AntithyroidDrugs AntidiabeticDrugs Chromosomes S 2 6 S ------8

### Prescription



## Thanks Inspired Team and

Dr. Yu Huang Dr. Andrew Brown