

SUPPLEMENTARY DATA

Ancestry-Specific Genetic Risk Score Improves Prediction of Type 1 Diabetes

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Notebook Dependencies

Code in this notebook relies on the use of SAS Software, which is only accessible through a paid license.

-If you have SAS, then install the SAS Kernel for Jupyter Notebooks, found here: https://github.com/sassoftware/sas_kernel
-If you do not have access to SAS, there is a free version of it, currently called "SAS OnDemand for Academics: Studio" You can find out more about that here: https://www.sas.com/en_us/software/on-demand-for-academics/references/getting-started-with-sas-ondemand-for-academics-studio.html

Regardless of your experience with or access to SAS, all of the data files used for this analysis are provided here, including the data derived from SAS.

METHODS

A. Human Organ Donors

The Network for Pancreatic Organ Donors with Diabetes (nPOD) program coordinates with many organ procurement organizations in the United States to screen and identify potential donors using acceptance criteria posted [here](#) (1) Following acquisition of informed research consent from next of kin, pancreata, related tissues, and blood were obtained from deceased organ donors in the United States. All donations were then centrally shipped to the nPOD organ processing and pathology core at the University of Florida for baboon sharing, as previously described (2) All experimental data was acquired under an approval from the University of Florida Institutional Review Board.

B. DNA isolation and genotyping

DNA from snap-frozen spleen or pancreas tissue was isolated, as previously described (2) Donors were genotyped at 974,650 unique loci using a custom SNP array termed UFDchip, to which elsewhere (3) In brief, the base array consists of the AxiomTM Precision Medicine Research Array (ThermoFisher Scientific), to which all content from the ImmunoChip(4) was added, as well as all ATM reported credible T1D risk variants (5) UFDchips were processed on an Affymetrix Gene Titan instrument with external sample handling on a BioMek FX dual arm robotic workstation. Data processing and quality control procedures were performed at the SNP, sample, and plate levels using Axiom™ Analysis Suite 3.0 (ThermoFisher Scientific) set to the default stringency thresholds as recommended. An analysis of X chromosome heterozygosity found all samples to be concordant with reported sex.

C. GRS Calculation

EUR GRS was calculated as previously described (6,7) using 26 SNP genotypes extracted from UFDchip array data and 4 from imputed data. The 4 imputed SNPs were for rs12 (rs2097072, r² = 0.992), HLA-A*24 (rs254813, r² = 0.996), INS (rs69, r² = 0.9486), and UBASH3A (rs3788013, r² = 0.9967). AFR GRS was calculated as previously described (8) using 4 SNP genotypes extracted from the UFDchip array and 3 from imputed data. The 3 imputed SNPs were for rs9271594 (r² = 0.9498), rs34303755 (r² = 0.8325), INS (rs689, r² = 0.9210). The resultant datafiles are provided below. The 1000 Genomes Phase 3 dataset (version 5) was used for imputation.

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In [1]: /*****
/no files contain the EUR_GRS and AFR_GRS data
*****/

%let location =F:\Manuscripts\2021_06_11_Diab_Care_GRS\submission;

PROC import out=eurgrs datafile = "%location\data\EUR_GRS_nPOD.xlsx"
    DBMS = xlsx replace;
RUN;

PROC import out=afgrgrs datafile = "%location\data\AFR_GRS_nPOD.xlsx"
    DBMS = xlsx replace;
RUN;

NOTE: The import data set has 395 observations and 2 variables.
NOTE: WORK_EURGRS data set was successfully created.
NOTE: PROCEDURE IMPORT used (Total process time):
      real time           0.33 seconds
      cpu time            0.06 seconds

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```
Out[4]: /*****
post-cluster coding
*****/

DATA genetics3;
  set genetics2;
  member=" ";
  if cluster=1 then member="AFR";
  if cluster=2 then member="AMR";
  if cluster=3 then member="EUR";
  if cluster=4 then member="MIX";
  if cluster=5 then member="EURp";
  if cluster=6 then member="MIXp";
  if cluster=7 then member="EURp";
  if cluster=8 then member="EURp";
  if cluster=9 then member="EURp";
  if cluster=10 then member="EURp";
  if cluster=11 then member="EURp";
  if cluster=12 then member="EURp";
  if cluster=13 then member="EURp";
  if cluster=14 then member="MIX";
  if cluster=15 then member="AFRp";

  alpha=1;
  if cluster=1 then alpha=1;
  if cluster=2 then alpha=1;
  if cluster=3 then alpha=0.5;
  if cluster=4 then alpha=1;
  if cluster=5 then alpha=0.25;
  if cluster=6 then alpha=1;
  if cluster=7 then alpha=0.25;
  if cluster=8 then alpha=1;
  if cluster=9 then alpha=0.5;
  if cluster=10 then alpha=0.5;
  if cluster=11 then alpha=0.5;
  if cluster=12 then alpha=0.5;
  if cluster=13 then alpha=0.5;
  if cluster=14 then alpha=1;
  if cluster=15 then alpha=0.25;
RUN;

Data genetics3;
  set genetics3;
  if CoreLabel="member then flag=1;
run;

proc export
  data=genetics3
  dms=xlsx
  outfile="location\data\npod_admin_results_v2.xlsx"
  replace;
run;

PROC means data=genetics3 noprint nway n;
class CLUSTER member alpha;
var Can1;
output out=genetics3_can1 mean=Can1_mean;
run;

PROC means data=genetics3 noprint nway n;
class CLUSTER member alpha;
var Can2;
output out=genetics3_can2 mean=Can2_mean;
run;

DATA genetics4;
merge genetics3_can1 genetics3_can2;
by cluster;
rename_FREQ=count;
run;

proc export
  data=genetics4
  dms=xlsx
  outfile="location\data\npod_admin_results_v2_sum.xlsx"
  replace;
run;
```

```
Out[4]: 22:09 Thursday, September 16, 2021 The SAS System

101 ods listing close;ods html5 (id=saspy_internal) file=_tomods1 options(bitmap_mode='inl
ine') device=svg style=HTMLBlue;
102 ! ods graphics on / outputfmt=png;
NOTE: Writing HTML5(SASPY_INTERNAL) Body file: _TOMODS1
103
104 /*****
105 *****/
106
107 DATA genetics3;
108   set genetics2;
109   member=" ";
110   if cluster=1 then member="AFR";
111   if cluster=2 then member="AMR";
112   if cluster=3 then member="EURp";
113   if cluster=4 then member="MIX";
114   if cluster=5 then member="AMRp";
115   if cluster=6 then member="MIX";
116   if cluster=7 then member="EURp";
117   if cluster=8 then member="EURp";
118   if cluster=9 then member="EURp";
119   if cluster=10 then member="EURp";
120   if cluster=11 then member="AFRp";
121   if cluster=12 then member="EURp";
122   if cluster=13 then member="EURp";
123   if cluster=14 then member="MIX";
124   if cluster=15 then member="AFRp";
125
126   alpha=1;
127   if cluster=1 then alpha=1;
128   if cluster=2 then alpha=1;
129   if cluster=3 then alpha=0.5;
130   if cluster=4 then alpha=1;
131   if cluster=5 then alpha=0.25;
132   if cluster=6 then alpha=1;
133   if cluster=7 then alpha=0.25;
134   if cluster=8 then alpha=1;
135   if cluster=9 then alpha=0.5;
136   if cluster=10 then alpha=1;
137   if cluster=11 then alpha=0.5;
138   if cluster=12 then alpha=0.5;
139   if cluster=13 then alpha=0.5;
140   if cluster=14 then alpha=1;
141   if cluster=15 then alpha=0.25;
142
143   RUN;

NOTE: There were 377 observations read from the data set WORK.GENETICS3.
NOTE: The data set WORK.GENETICS3 has 377 observations and 17 variables.
NOTE: DATA statement used (Total process time):
      real time           0.05 seconds
      cpu time             0.06 seconds

144
145   DATA genetics3;
146   set genetics3;
147   if corelabel="member then flag=1;
148   run;

NOTE: There were 377 observations read from the data set WORK.GENETICS3.
NOTE: The data set WORK.GENETICS3 has 377 observations and 17 variables.
NOTE: DATA statement used (Total process time):
      real time           0.03 seconds
      cpu time             0.03 seconds

149
150   proc export
151   data=genetics3
152   dms=xlsx
153   outfile="location\data\npod_admin_results_v2.xlsx"
154   replace;
155   run;

NOTE: The export data set has 377 observations and 17 variables.
NOTE: "P:\Manuscripts\2021_06_11_Diab_Care_GRS\submission\data\npod_admin_results_v2.xlsx" file w
as successfully created.
NOTE: PROCEDURE EXPORT used (Total process time):
      real time           2.03 seconds
      cpu time             0.14 seconds

156
157
158   PROC means data=genetics3 noprint nway n;
159   class CLUSTER member alpha;
160   var Can1;
161   output out=genetics3_can1 mean=Can1_mean;
162   run;

NOTE: There were 377 observations read from the data set WORK.GENETICS3.
NOTE: The data set WORK.GENETICS3_CAN1 has 15 observations and 6 variables.
NOTE: PROCEDURE MEANS used (Total process time):
      real time           0.07 seconds
      cpu time             0.06 seconds

163
164   PROC means data=genetics3 noprint nway n;
165   class CLUSTER member alpha;
166   var Can2;
167   output out=genetics3_can2 mean=Can2_mean;
168   run;

NOTE: There were 377 observations read from the data set WORK.GENETICS3.
NOTE: The data set WORK.GENETICS3_CAN2 has 15 observations and 6 variables.
NOTE: PROCEDURE MEANS used (Total process time):
      real time           0.05 seconds
      cpu time             0.06 seconds

169
170
171   DATA genetics4;
172   merge genetics3_can1 genetics3_can2;
173   by cluster;
174   rename_FREQ=count;
175   run;

NOTE: There were 15 observations read from the data set WORK.GENETICS3_CAN1.
NOTE: The data set WORK.GENETICS4 has 15 observations and 7 variables.
NOTE: DATA statement used (Total process time):
      real time           0.03 seconds
      cpu time             0.04 seconds

176
177
178   proc export
179   data=genetics4
180   dms=xlsx
181   outfile="location\data\npod_admin_results_v2_sum.xlsx"
182   replace;
183   run;

NOTE: The export data set has 15 observations and 7 variables.
NOTE: "P:\Manuscripts\2021_06_11_Diab_Care_GRS\submission\data\npod_admin_results_v2_sum.xlsx" fi
le was successfully created.
NOTE: PROCEDURE EXPORT used (Total process time):
      real time           2.00 seconds
      cpu time             0.10 seconds

184
185
186   ods html5 (id=saspy_internal) close;ods listing;
187
188
189
190
```

D.3 Statistical Analysis

Statistical testing was performed for differences in GRSs between non-diabetic and T1D individuals within each ancestry using a two-sample t test with a pooled or Satterthwaite corrected p-value if parametric, or the Kruskal-Wallis test if non-parametric. Normalized testing was performed using the Shapiro Wilks method. The Hodges-Lehmann estimation was used to obtain median differences and 95% CIs.

Testing was performed using both the EUR GRS and AFR GRS. Multiple comparison corrections are denoted with an * within the main text and are only significant at a nominal alpha of <0.025. All reported p-values are 2-sided.

```
In [5]: /*****
demographics, GRS data analysis
*****/

DATA genetics3;
  set genetics3;
  caseid=idv;
  idl=put(ID, 4.);
RUN;

PROC import out=demographics datafile = "location\data\Demographics_2021-05-20_13-42-23.xlsx"
  dms = xlsx replace;
RUN;

DATA demographics;
  set demographics;
  idl=put('nP0D CaseID'n, 4.);
  rename 'Donor Type'n=donortype;
RUN;

DATA eurgrsl;
  set eurgrsl;
  idl=put('nP0D CaseID'n, 4.);
RUN;

DATA afrgrsl (keep = idl grsl);
  set eurgrsl;
RUN;

DATA afrgrsl;
  set afrgrsl;
  idl=put(FID, 4.);
RUN;

DATA afrgrsl (keep = idl grsl);
  set afrgrsl;
  idl=put(FID, 4.);
RUN;

PROC sort data=genetics3; by idl; run;
PROC sort data=demographics; by idl; run;
PROC sort data=eurgrsl; by idl; run;
PROC sort data=afrgrsl; by idl; run;

DATA all;
merge genetics3 (in=a) demographics(in=b) eurgrsl (in=c) afrgrsl(in=d);
by idl;
if a;
RUN;

proc export
  data=all
  dms=xlsx
  outfile="location\data\data_for_figures_analysis_all.xlsx"
  replace;
run;

DATA all2;
  SET ALL;
  if donortype="T1D" and donortype="No Diabetes" then delete;
  if member="AFR" and member="EUR" and member="AMR" then delete;
run;

proc export
  data=all2
  dms=xlsx
  outfile="location\data\data_for_figures_analysis_analyzed.xlsx"
  replace;
run;

Out[5]: 22:09 Thursday, September 16, 2021 The SAS System

193 ods listing close;ods html5 (id=saspy_internal) file=_tomods1 options(bitmap_mode='inl
ine') device=svg style=HTMLBlue;
194 ! ods graphics on / outputfmt=png;
NOTE: Writing HTML5(SASPY_INTERNAL) Body file: _TOMODS1
195
196 /*****
197 *****/
198
199 DATA genetics3;
200   set genetics3;
201   caseid=idv;
202   idl=put(ID, 4.);
203   RUN;

NOTE: There were 377 observations read from the data set WORK.GENETICS3.
NOTE: The data set WORK.GENETICS3 has 377 observations and 19 variables.
NOTE: DATA statement used (Total process time):
      real time           0.02 seconds
      cpu time             0.03 seconds

204
205   PROC import out=demographics datafile = "location\data\Demographics_2021-05-20_13-42-
23.xlsx"
206   dms = xlsx replace;
207   RUN;

NOTE: The import data set has 653 observations and 11 variables.
NOTE: WORK.DEMOGRAPHICS data set was successfully created.
NOTE: PROCEDURE IMPORT used (Total process time):
      real time           0.46 seconds
      cpu time             0.14 seconds

208
209   DATA demographics;
210   set demographics;
211   idl=put('nP0D CaseID'n, 4.);
212   rename 'Donor Type'n=donortype;
213   RUN;

NOTE: There were 653 observations read from the data set WORK.DEMOGRAPHICS.
NOTE: The data set WORK.DEMOGRAPHICS has 653 observations and 12 variables.
NOTE: DATA statement used (Total process time):
      real time           0.02 seconds
      cpu time             0.03 seconds

214
215   DATA eurgrsl;
216   set eurgrsl;
217   idl=put('nP0D CaseID'n, 4.);
218   RUN;

NOTE: There were 295 observations read from the data set WORK.EURGRS.
NOTE: The data set WORK.EURGRS1 has 295 observations and 3 variables.
NOTE: DATA statement used (Total process time):
      real time           0.04 seconds
      cpu time             0.04 seconds

219
220   DATA eurgrsl (keep = idl grsl);
221   set eurgrsl;
222   RUN;

NOTE: There were 295 observations read from the data set WORK.EURGRS1.
NOTE: The data set WORK.EURGRS1 has 295 observations and 2 variables.
NOTE: DATA statement used (Total process time):
      real time           0.03 seconds
      cpu time             0.03 seconds

223
224   DATA afrgrsl;
225   set afrgrsl;
226   idl=put(FID, 4.);
227   RUN;

NOTE: There were 377 observations read from the data set WORK.AFRGRS.
NOTE: The data set WORK.AFRGRS1 has 377 observations and 9 variables.
NOTE: DATA statement used (Total process time):
      real time           0.03 seconds
      cpu time             0.03 seconds

228
229   DATA afrgrsl (keep = idl grsl);
230   set afrgrsl;
231   RUN;

NOTE: There were 377 observations read from the data set WORK.AFRGRS1.
NOTE: The data set WORK.AFRGRS1 has 377 observations and 2 variables.
NOTE: DATA statement used (Total process time):
      real time           0.03 seconds
      cpu time             0.03 seconds

232
233   PROC sort data=genetics3; by idl; run;

NOTE: There were 377 observations read from the data set WORK.GENETICS3.
NOTE: The data set WORK.GENETICS3 has 377 observations and 19 variables.
NOTE: PROCEDURE SORT used (Total process time):
      real time           0.02 seconds
      cpu time             0.03 seconds

234
235   PROC sort data=demographics; by idl; run;

NOTE: There were 653 observations read from the data set WORK.DEMOGRAPHICS.
NOTE: The data set WORK.DEMOGRAPHICS has 653 observations and 12 variables.
NOTE: PROCEDURE SORT used (Total process time):
      real time           0.02 seconds
      cpu time             0.03 seconds

236
237   PROC sort data=eurgrsl; by idl; run;

NOTE: There were 295 observations read from the data set WORK.EURGRS1.
NOTE: The data set WORK.EURGRS1 has 295 observations and 3 variables.
NOTE: PROCEDURE SORT used (Total process time):
      real time           0.01 seconds
      cpu time             0.01 seconds

238
239   PROC sort data=afrgrsl; by idl; run;

NOTE: There were 295 observations read from the data set WORK.EURGRS1.
NOTE: The data set WORK.AFRGRS1 has 295 observations and 2 variables.
NOTE: PROCEDURE SORT used (Total process time):
      real time           0.01 seconds
      cpu time             0.01 seconds

240
241   DATA all;
242   merge genetics3 (in=a) demographics(in=b) eurgrsl (in=c) afrgrsl(in=d);
243   by idl;
244   if a;
245   RUN;

NOTE: There were 377 observations read from the data set WORK.GENETICS3.
NOTE: There were 653 observations read from the data set WORK.DEMOGRAPHICS.
NOTE: There were 295 observations read from the data set WORK.EURGRS1.
NOTE: There were 377 observations read from the data set WORK.AFRGRS1.
NOTE: The data set WORK.ALL has 377 observations and 32 variables.
NOTE: DATA statement used (Total process time):
      real time           0.03 seconds
      cpu time             0.03 seconds

246
247   proc export
248   data=all
249   dms=xlsx
250   outfile="location\data\data_for_figures_analysis_all.xlsx"
251   replace;
252   run;

NOTE: The export data set has 377 observations and 32 variables.
NOTE: "P:\Manuscripts\2021_06_11_Diab_Care_GRS\submission\data\data_for_figures_analysis_all.xls
x" file was successfully created.
NOTE: PROCEDURE EXPORT used (Total process time):
      real time           2.03 seconds
      cpu time             0.17 seconds

253
254   DATA all2;
255   SET ALL;
256   if donortype="T1D" and donortype="No Diabetes" then delete;
257   if member="AFR" and member="EUR" and member="AMR" then delete;
258   RUN;

NOTE: There were 377 observations read from the data set WORK.ALL.
NOTE: The data set WORK.ALL2 has 207 observations and 32 variables.
NOTE: DATA statement used (Total process time):
      real time           0.05 seconds
      cpu time             0.06 seconds

259
260   proc export
261   data=all2
262   dms=xlsx
263   outfile="location\data\data_for_figures_analysis_analyzed.xlsx"
264   replace;
265   run;

NOTE: The export data set has 207 observations and 32 variables.
NOTE: "P:\Manuscripts\2021_06_11_Diab_Care_GRS\submission\data\data_for_figures_analysis_analyse
d.xlsx" file was successfully created.
NOTE: PROCEDURE EXPORT used (Total process time):
      real time           2.11 seconds
      cpu time             0.18 seconds

266
267   ods html5 (id=saspy_internal) close;ods listing;
268
269
270
271
```



```
data special_comp;
set all2;
if member='AMR' then delete;
if donortype='No Diabetes' then delete;
run;

proc NPARIWAY data=special_comp wilcoxon hl alpha=0.05; /*HL for hodge-lehmann estimates and alpha to set the CIs*/
class member;
var GRS1;
run;

proc NPARIWAY data=special_comp wilcoxon hl alpha=0.05; /*HL for hodge-lehmann estimates and alpha to set the CIs*/
class member;
var GRS;
run;
```

Out[8]:

The SAS System

The NPARIWAY Procedure

Wilcoxon Scores (Rank Sums) for Variable GRS1 Classified by Variable member					
member	N	Sum of Scores	Expected Under H0	Std Dev Under H0	Mean Score
AFR	6	47.0	282.0	63.945289	7.833333
EUR	87	4324.0	4089.0	63.945289	49.701149

Wilcoxon Two-Sample Test	
Statistic	47.0000
Normal Approximation	
Z	-3.6672
One-Sided Pr < Z	0.0001
Two-Sided Pr > Z	0.0002
t Approximation	
One-Sided Pr < Z	0.0002
Two-Sided Pr > Z	0.0004
Z includes a continuity correction of 0.5.	

Kruskal-Wallis Test	
Chi-Square	13.5057
DF	1
Pr > Chi-Square	0.0002



Hodges-Lehmann Estimation			
Location Shift (AFR - EUR) -0.0463			
95% Confidence Limits		Interval Midpoint	Asymptotic Standard Error
-0.0634		-0.0273	-0.0453
			0.0092

The SAS System

The NPARIWAY Procedure

Wilcoxon Scores (Rank Sums) for Variable GRS Classified by Variable member					
member	N	Sum of Scores	Expected Under H0	Std Dev Under H0	Mean Score
AFR	6	170.0	282.0	63.860796	28.333333
EUR	87	4201.0	4089.0	63.860796	48.287356
Average scores were used for ties.					

Wilcoxon Two-Sample Test	
Statistic	170.0000
Normal Approximation	
Z	-1.7460
One-Sided Pr < Z	0.0404
Two-Sided Pr > Z	0.0808
t Approximation	
One-Sided Pr < Z	0.0421
Two-Sided Pr > Z	0.0842
Z includes a continuity correction of 0.5.	

Kruskal-Wallis Test	
Chi-Square	3.0759
DF	1
Pr > Chi-Square	0.0795



Hodges-Lehmann Estimation			
Location Shift (AFR - EUR) -1.6880			
95% Confidence Limits		Interval Midpoint	Asymptotic Standard Error
-3.5800		0.2470	-1.6665
			0.9763

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