

# Polygenic Risk Scores for SSNS, SRNS

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# Overview

- ▶ Completed PRS testing on a new setup
- ▶ Redid PRS testing on old setup
- ▶ Under the hood
  - ▶ Streamlined code
  - ▶ Added PC conditioning, which slightly increased correlations

# How PRS works

Score is generally a linear model:

$$\text{PRS}_j = \sum_i \beta_i x_{ij}.$$

- ▶  $i$ : variant index
- ▶  $j$ : individual index
- ▶  $\beta_i$ : coefficient of variant  $i$
- ▶  $x_{ij}$ : genotype (0,1,2) at variant  $i$ , individual  $j$

Challenge is about picking  $\beta_i$ :

- ▶ Not all variants are in all datasets
- ▶ If starting from GWAS, need to decorrelate (LD or clumping), shrink (p-value threshold or fancier models)

# Basics of PRS construction and evaluation

- ▶ PRS construction and validation requires 3 disjoint datasets:
  - ▶ Base set: Used to fit “GWAS summary statistics”: variant coefficients (betas), standard errors, p-values
  - ▶ Training set: Used to fit PRS parameters: p-value threshold, or heritability and sparsity
    - ▶ Modifies betas, usually by shrinking them to zero and reducing correlation due to LD
  - ▶ Testing set: Data where nothing was trained, reveals true performance (correlation to trait)

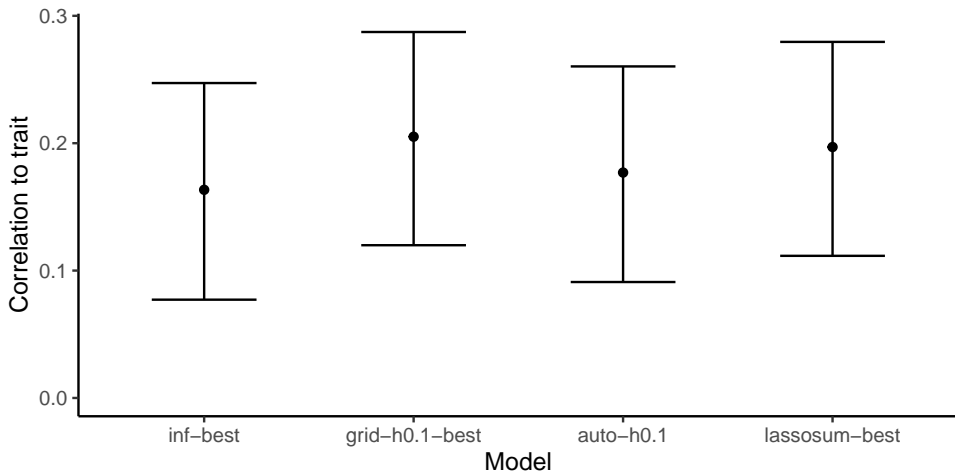
## Testing setups

Name	Base	Train	Test
Old SSNS-SRNS	Discov SSNS-SRNS (725/193)	Bristol SSNS-SRNS 70% (252/103)	Bristol SSNS-SRNS 30% (113/46)
Old SSNS-Ctrl	Discov SSNS-Ctrl (725/3553)	Bristol SSNS-SRNS 70% (252/103)	Bristol SSNS-SRNS 30% (113/46)
New SSNS-Ctrl	Discov SSNS-Ctrl (532/3553)	Discov SSNS-SRNS (193/193)	Bristol SSNS-SRNS 100% (365/149)

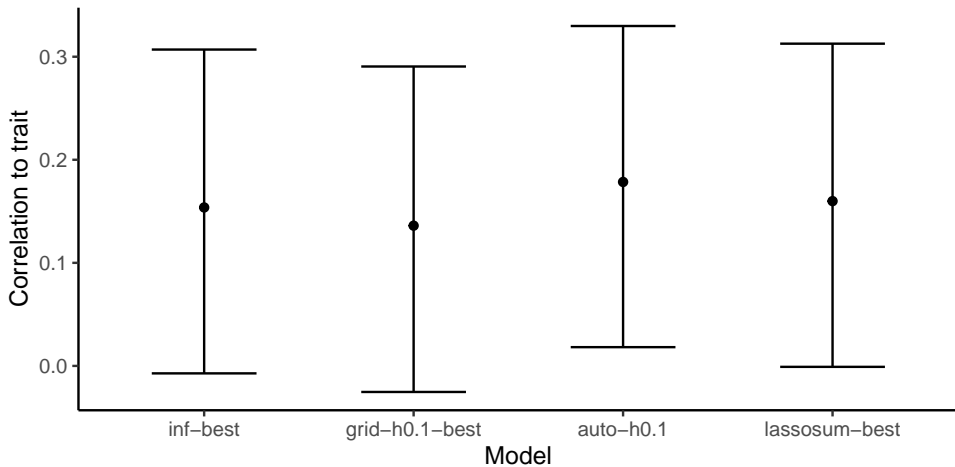
To incorporate soon, CureGN version SSNS-SRNS (250/170), based on these rules:

- ▶ SSNS: MCD and age  $\leq 21$
- ▶ SRNS: FSGS and age  $\leq 21$

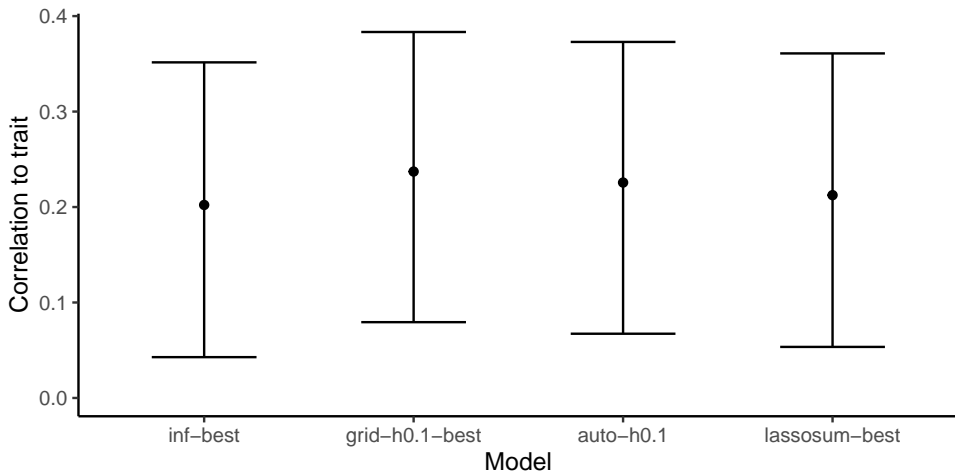
## Test results: New SSNS-Ctrl



## Test results: Old SSNS-Ctrl



## Test results: Old SSNS-SRNS

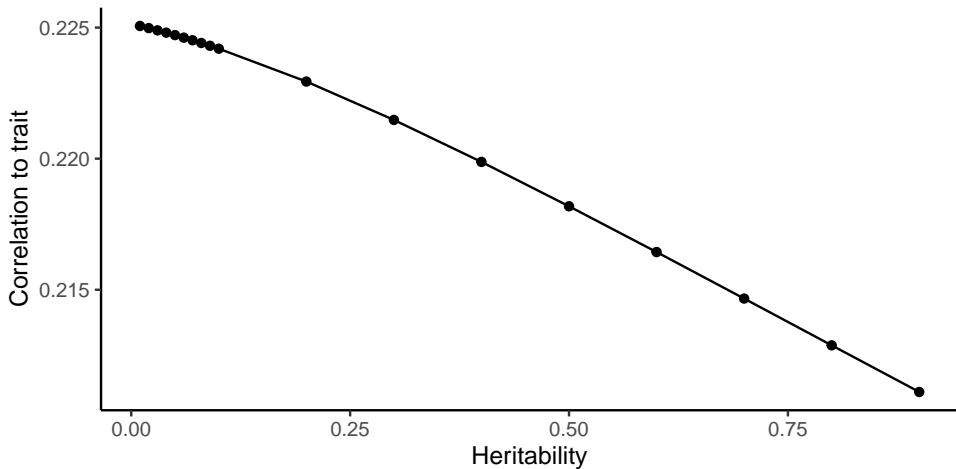




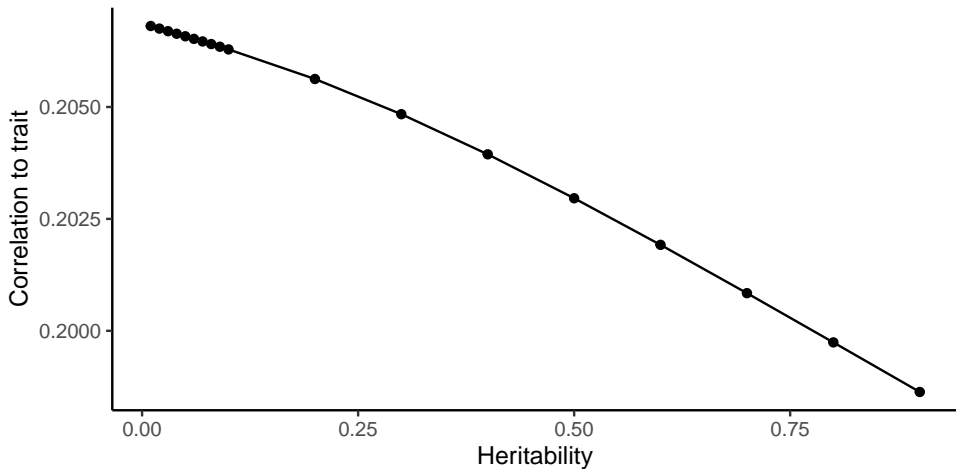
## Next steps

- ▶ Use LD of base data instead of training data
- ▶ Include clump and threshold method
- ▶ Include CureGN's SSNS/SRNS (allows base data to be for both SSNS-SRNS and SSNS-Ctrl, as with old setup)
- ▶ Use HLA haplotypes!
- ▶ Vary SNP set filters
  - ▶ Due to LD runtime, only using array SNPs right now
  - ▶ Could enrich for more significant ones or higher severity variants
- ▶ Try Barry et al., 2023 base data

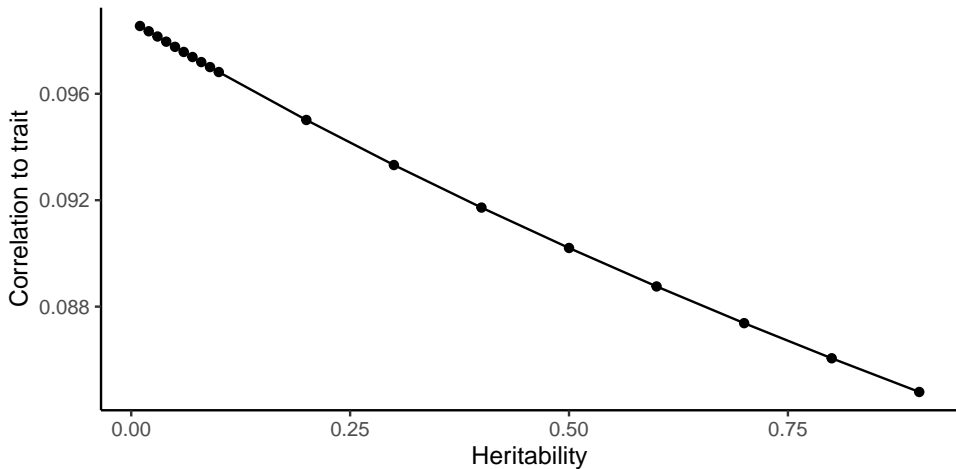
## Train results: New Idpred-inf



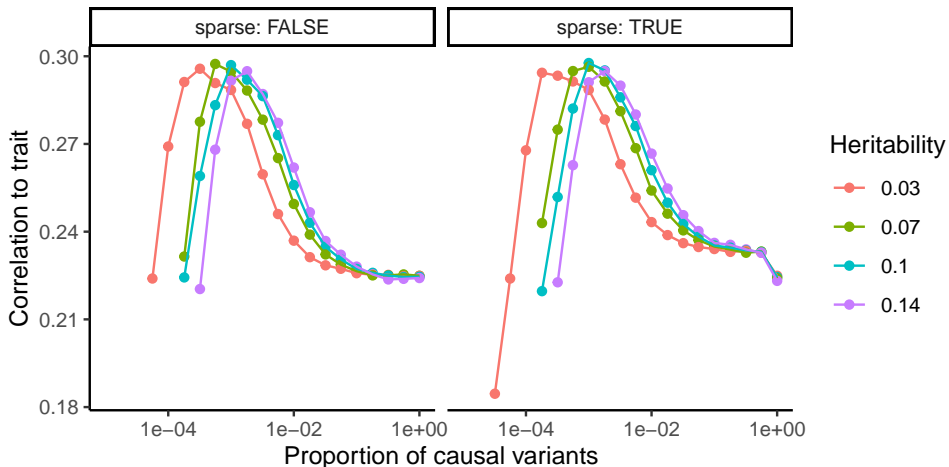
## Train results: Old SSNS-Ctrl Idpred-inf



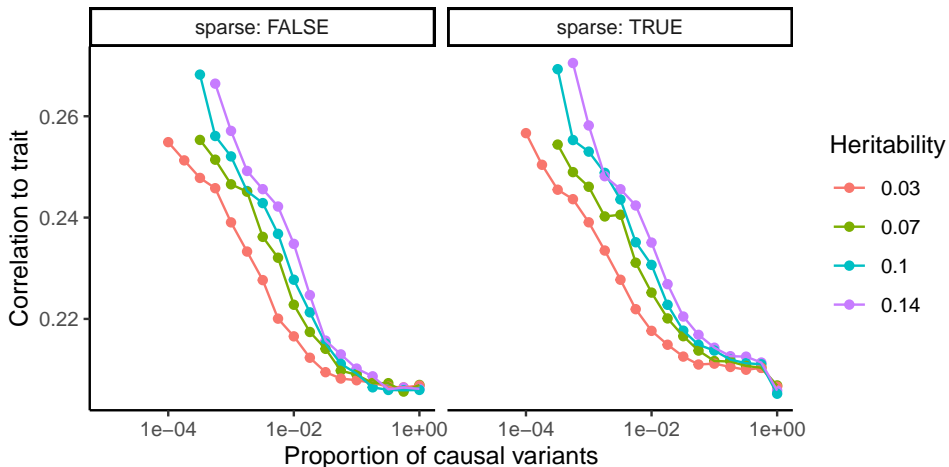
## Train results: Old SSNS-SRNS ldpred-inf



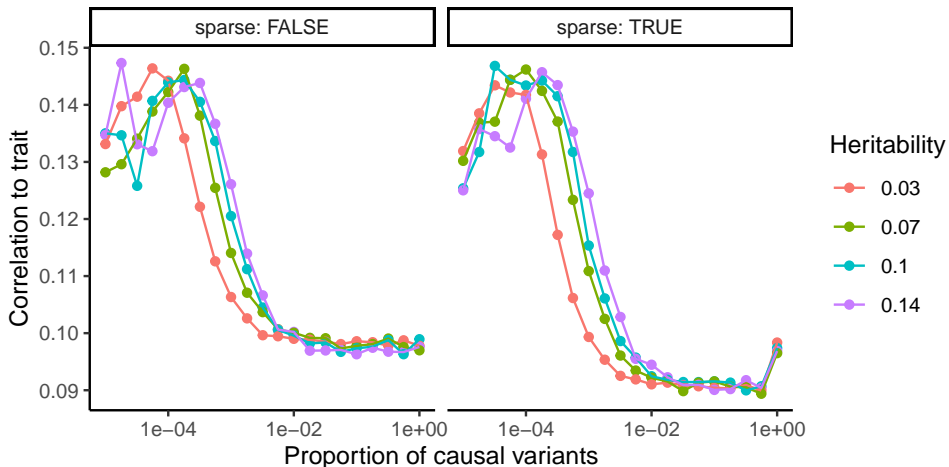
## Train results: New Idpred-grid-h0.1



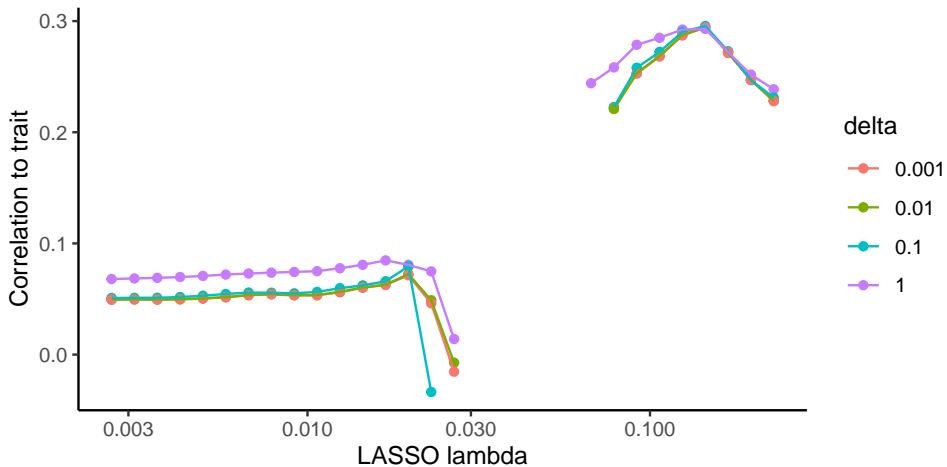
# Train results: Old SSNS-Ctrl ldpred-grid-h0.1



# Train results: Old SSNS-SRNS ldpred-grid-h0.1

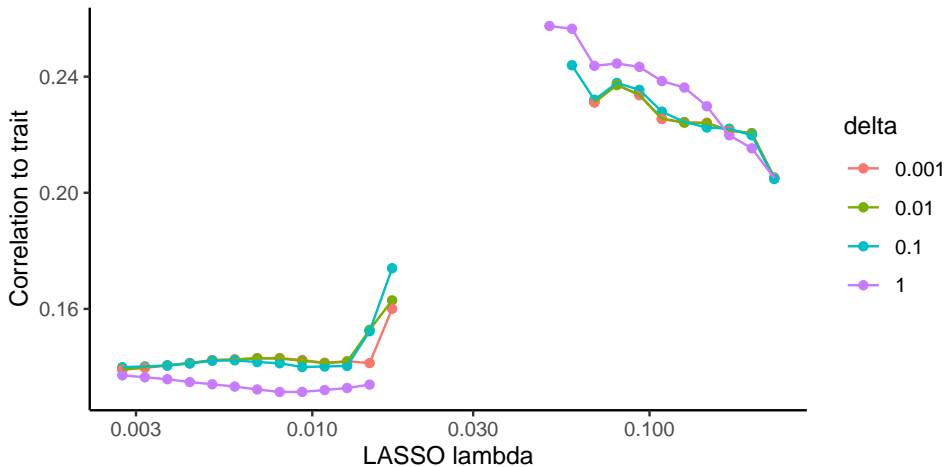


## Train results: New Idpred-lassosum





## Train results: Old SSNS-Ctrl Idpred-lassosum



## Train results: Old SSNS-SRNS ldpred-lassosum

