

# Negative selection in humans and fruit flies involves synergistic epistasis

Mashaal Sohail, Olga A. Vakhrusheva, Jae Hoon Sul, Sara L. Pulit, Laurent C. Francioli, Genome of the Netherlands Consortium, Alzheimer's Disease Neuroimaging Initiative, Leonard H. van den Berg, Jan H. Veldink, Paul I. W. de Bakker, Georgii A. Bazykin, Alexey S. Kondrashov, Shamil R. Sunyaev

Science, 5 May 2017

**Thibault Latrille**

**RAGE meeting - January 17 2018**

# Outline of the presentation

**I. Why are we talking about epistasis in a RAGE meeting?**

**III. Sohail *et al.* - *Theory***

**III. Sohail *et al.* - *Results***

**IV. Reproducibility of the study.**

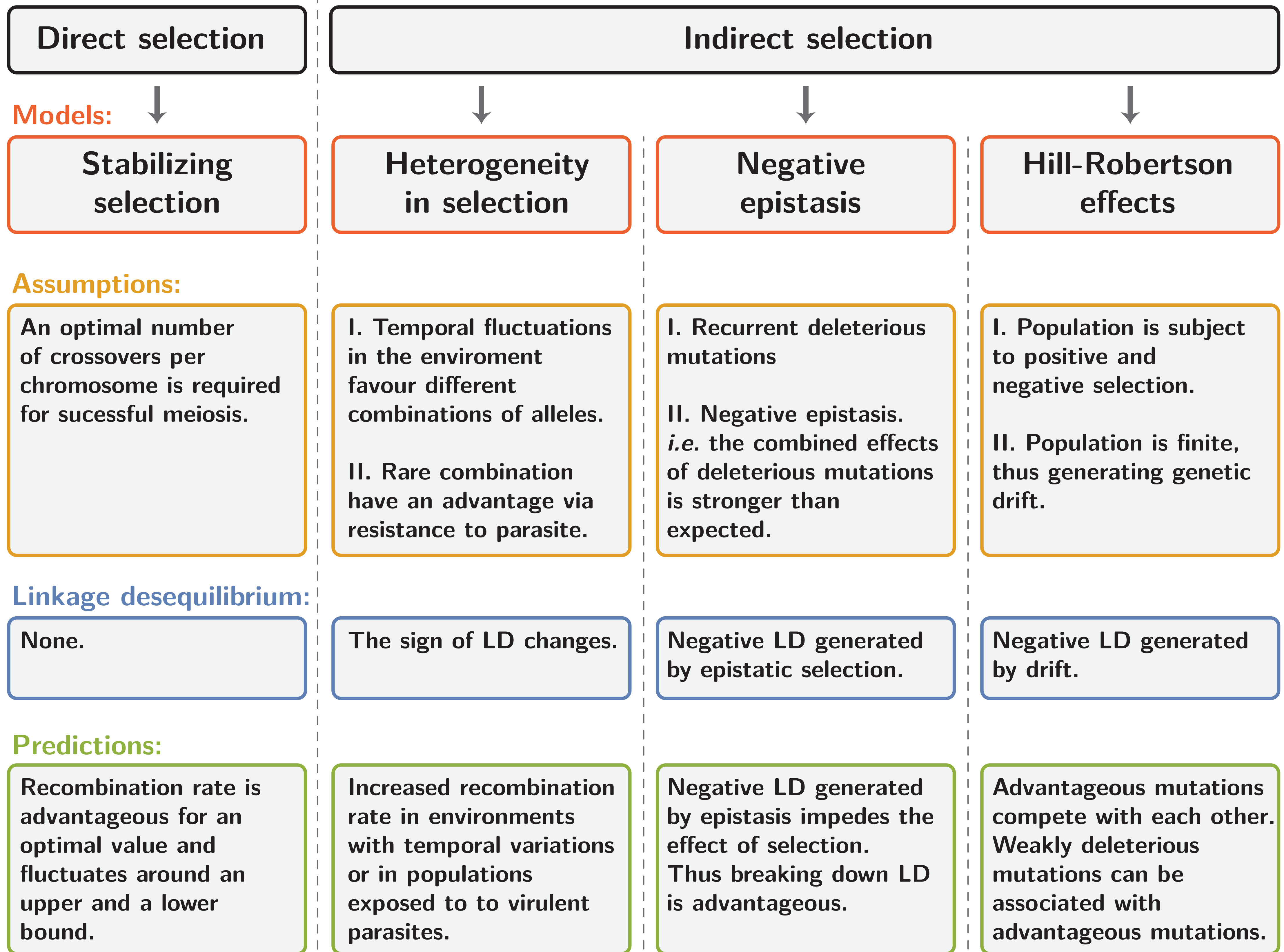
# Part I.

**Why are we talking  
about epistasis in a  
RAGE meeting?**

*“[...] Sohail et al. found that deleterious loss-of-function mutations are further away from each other in the genome than expected by chance, which suggests that genetic interactions are driving selection. [...] **This explains why high levels of variation can be maintained and why sex and recombination are advantageous.**”*

*Science report, 2017*

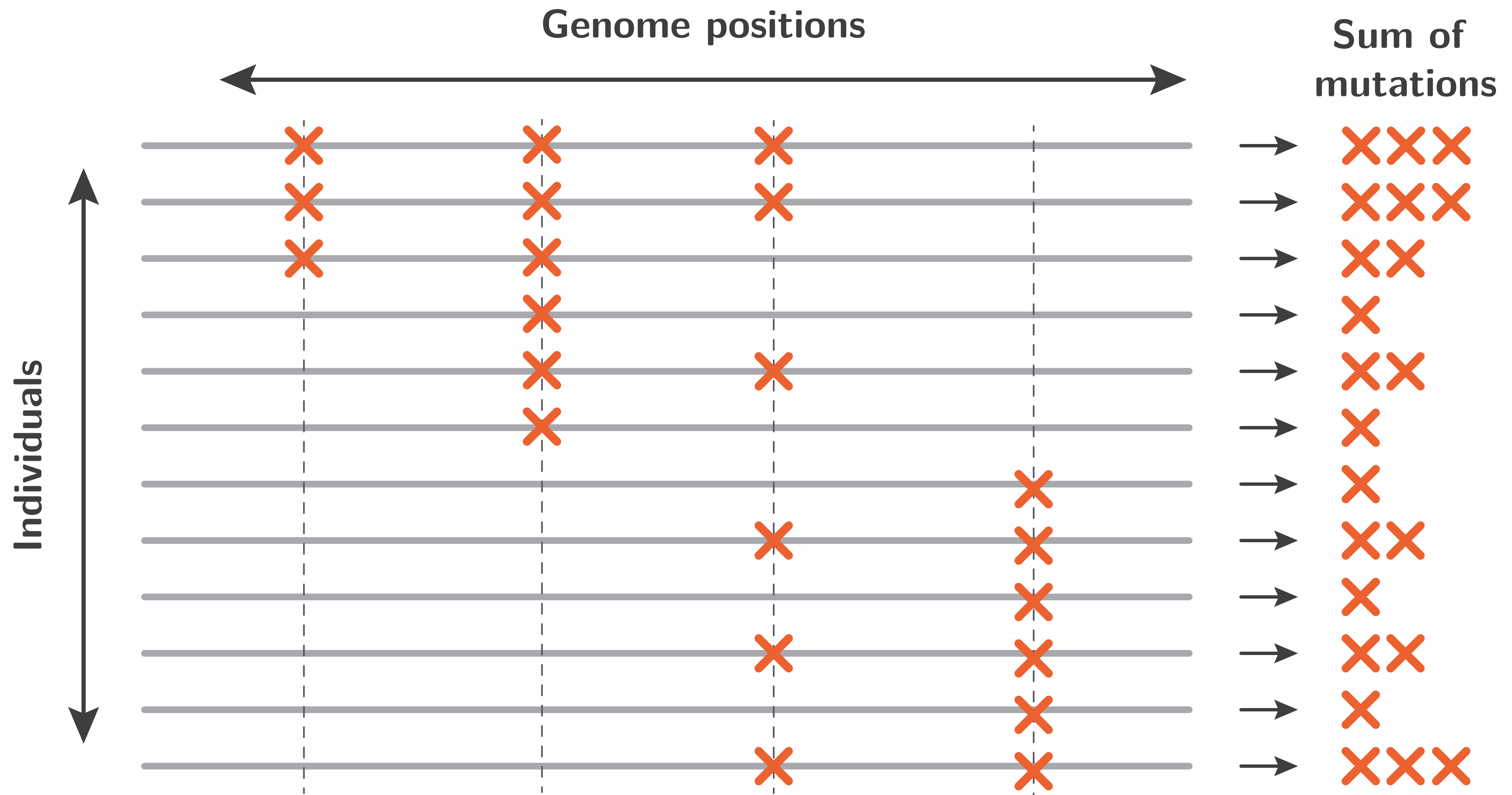
# Is recombination advantageous ?



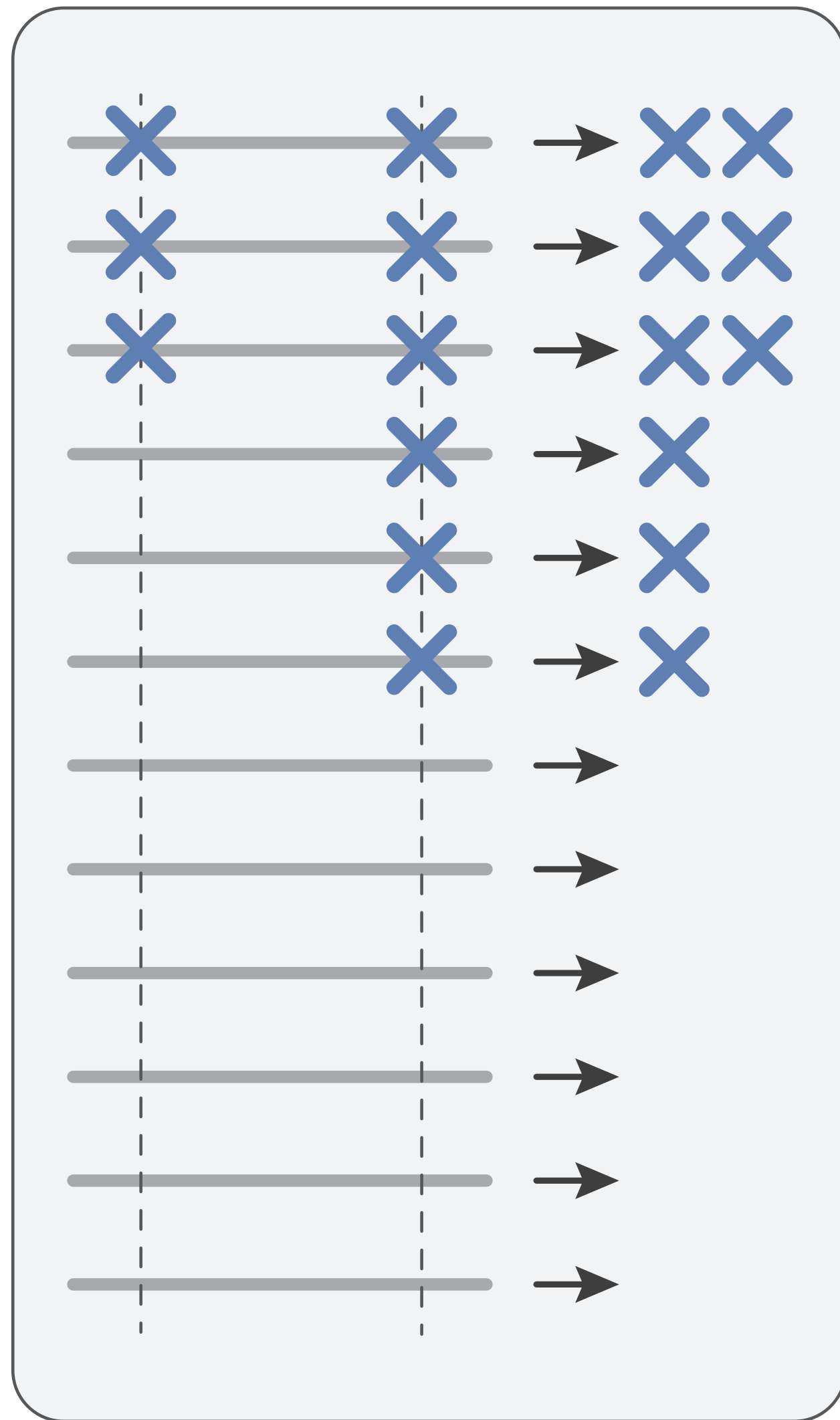
# Part II.

## Sohail *et al.* - Theory

# How to measure linkage disequilibrium (LD) at the genome-wide level?

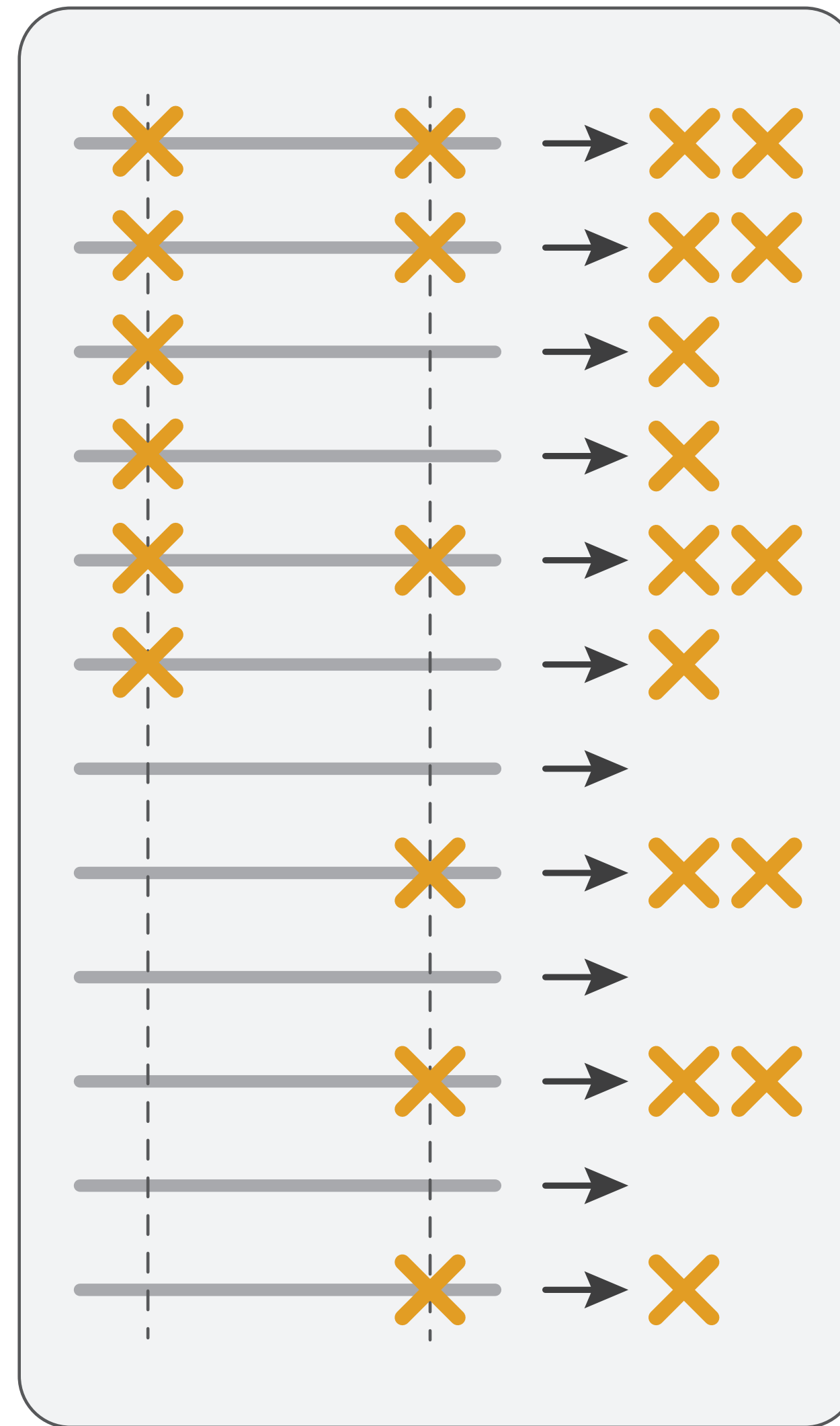


# Pair-wise LD

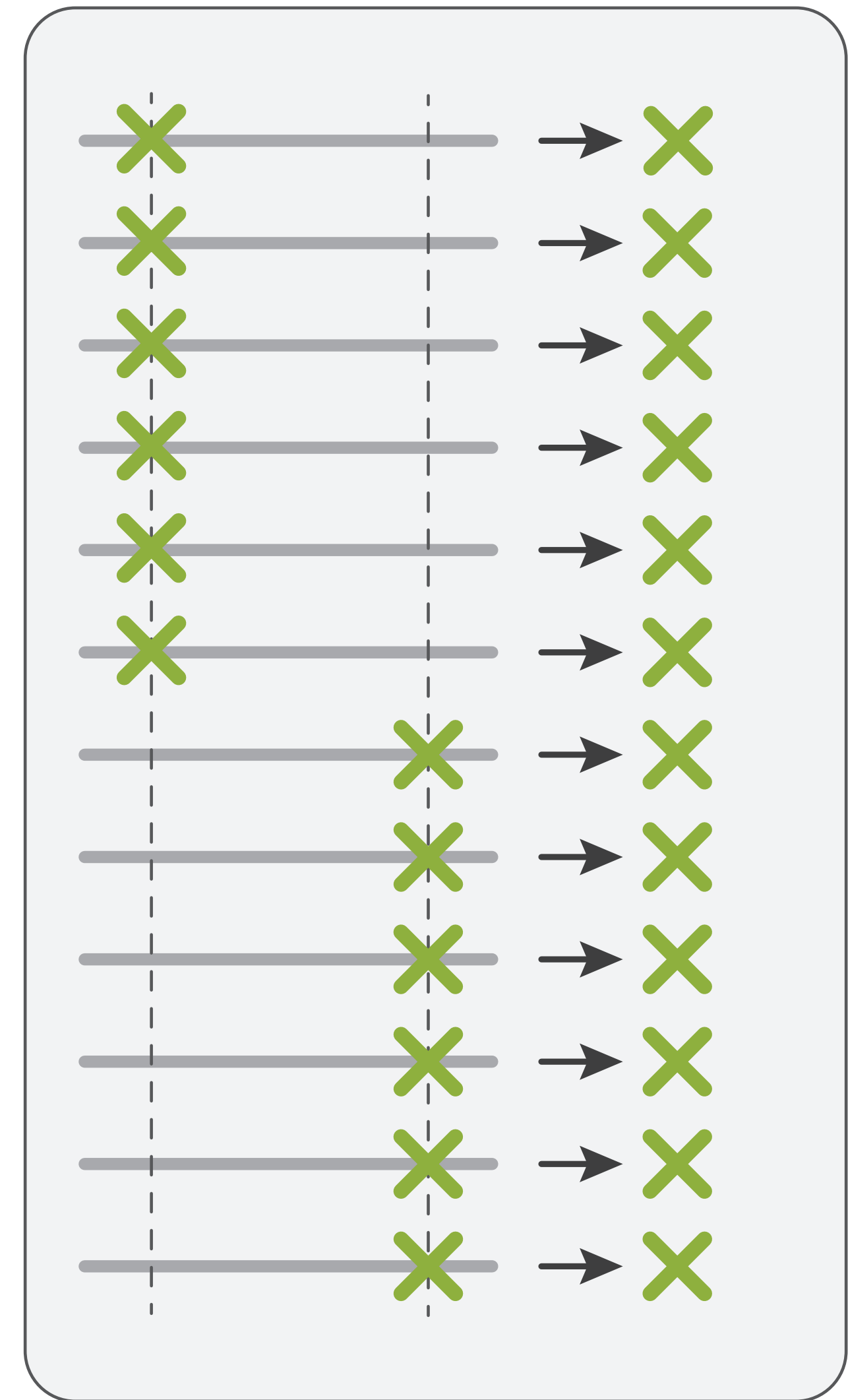


Association

Antagonistic epistasis



Independence



Repulsion

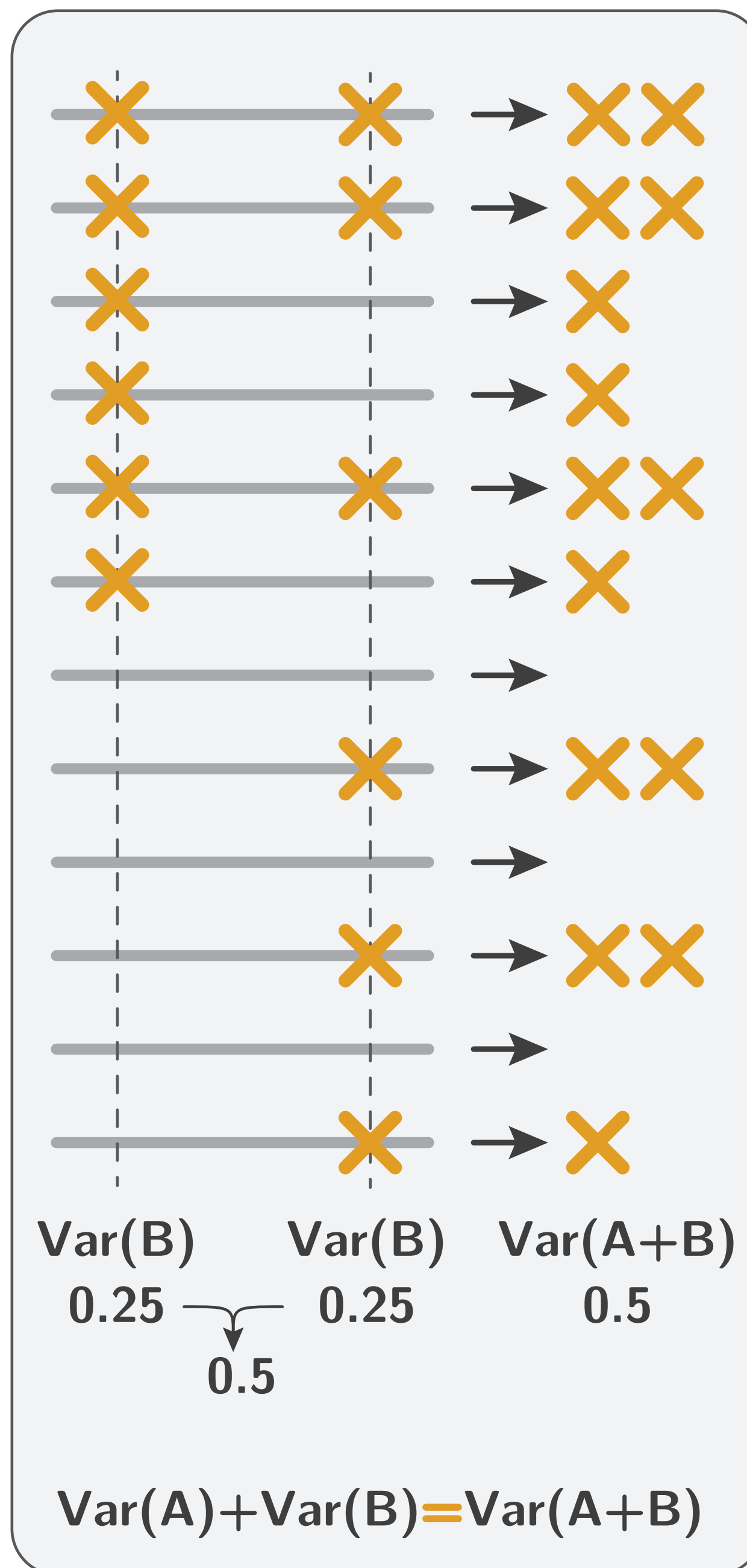
Synergistic epistasis



# Measure of pair-wise LD



**Association**  
Antagonistic epistasis

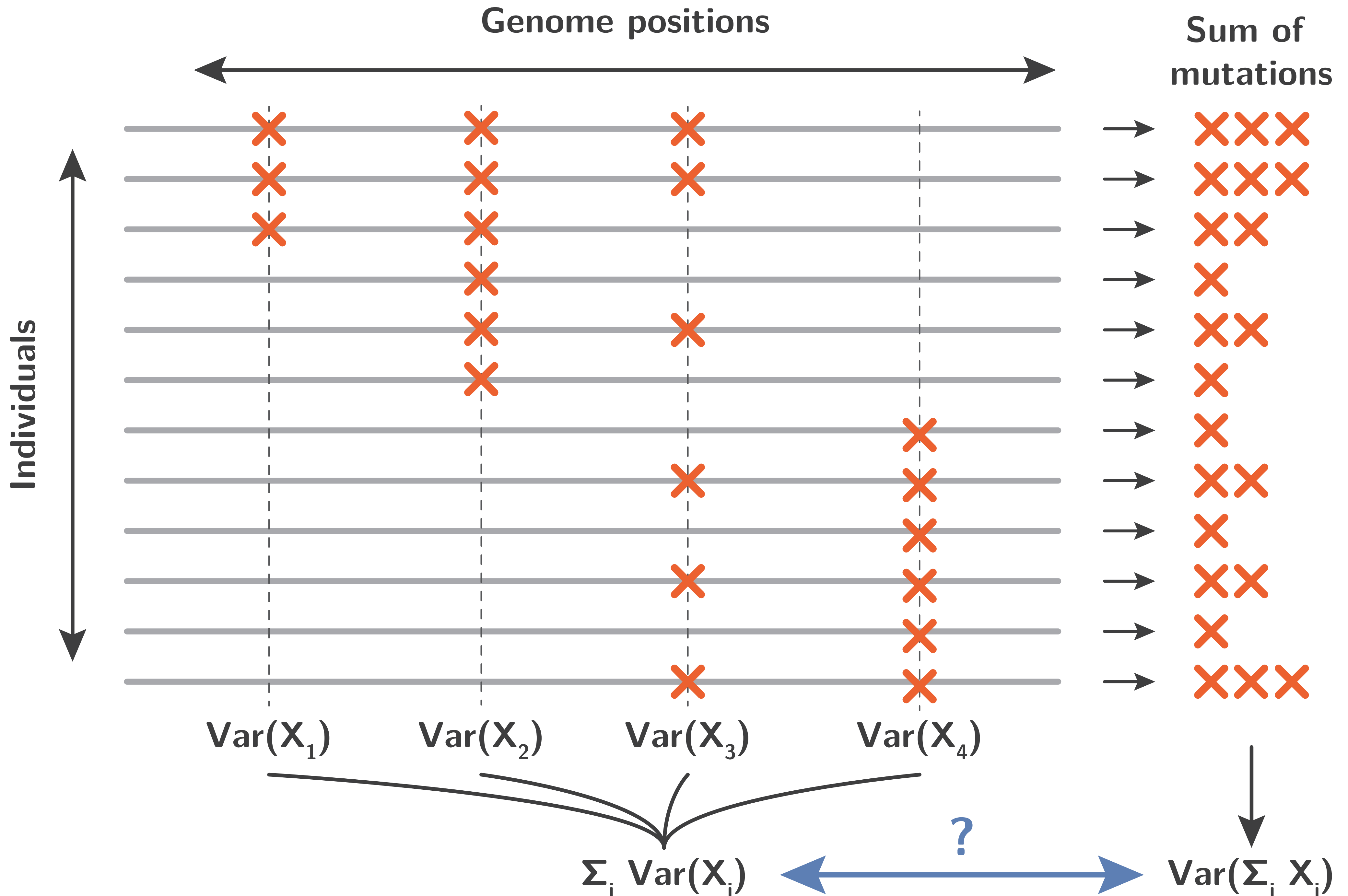


**Independence**



**Repulsion**  
Synergistic epistasis

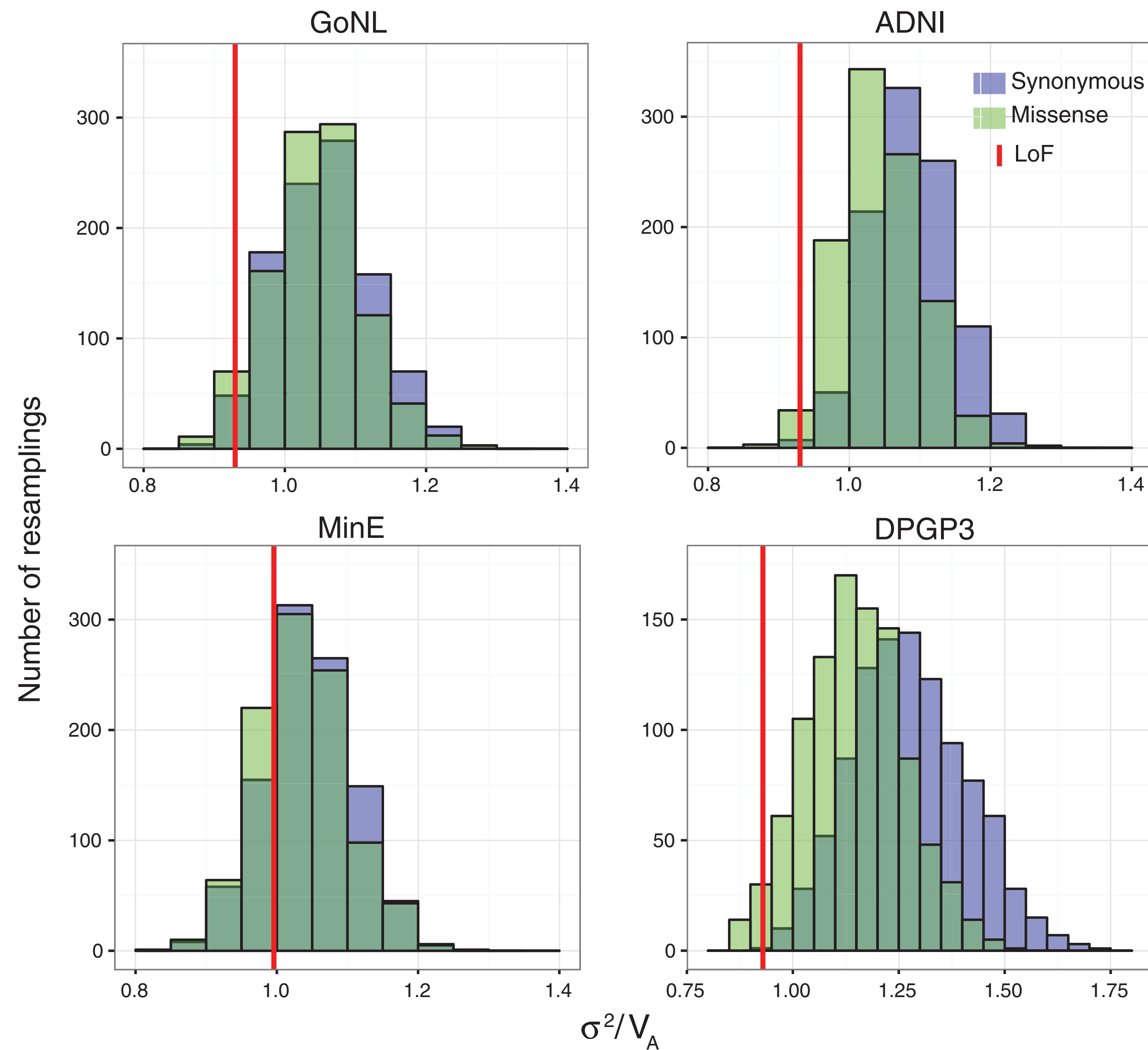
# Measure of genome-wide LD



# Part III.

## **Sohail *et al.* - *Results***

# Loss-of-function (LOF) mutations compared to missense and synonymous mutations.



**Fig. 3. Resampling distributions of  $\sigma^2/V_A$  for rare LoF mutation burden in humans and *D. melanogaster*.** Synonymous (purple) and missense (green) alleles were resampled at the same allele frequency as LoF alleles to obtain empirical null distributions for  $\sigma^2/V_A$  in each data set. For humans, only singletons, and for flies, only alleles up to a minor allele count of 5, are included. A one-sided  $P$  value for  $\sigma^2/V_A$  of the rare LoF mutation burden (red) was obtained, and a joint  $P$  value for all three human data sets shown (GoNL, ADNI, MinE) was computed by meta-analysis using Stouffer's method (11) ( $P = 0.0003$ ).

# Genome-wide LD compared to pair-wise LD

**Table 1. Negative linkage disequilibrium (LD) between rare LoF alleles in human and *D. melanogaster* genomes.** For humans, only singletons, and for flies, only alleles up to a minor allele count of 5, are included (see tables S2 and S3 for other frequency cut-offs). Net LD is normalized per pair of alleles and per pair of loci (11). A one-sided *P* value was obtained for  $\sigma^2/V_A$  by permutation, and a joint *P* value for all three human data sets shown (GoNL, ADNI, MinE) was computed by meta-analysis using Stouffer's method (11) (coding synonymous *P* = 0.999, missense *P* =  $5.155 \times 10^{-4}$ , LoF *P* = 0.002). The number of samples is given in parentheses for each data set.

Variant type	Mean	$\sigma^2/V_A$	Net LD	
			Per pair of derived alleles	Per pair of loci
<b>Humans</b>				
<i>Genome of the Netherlands GoNL (495)</i>				
Synonymous	30.26	1.675	0.022	$4.554 \times 10^{-8}$
Missense	60.88	2.077	0.018	$3.609 \times 10^{-8}$
Nonsense	1.67	0.929	-0.039	$-8.013 \times 10^{-8}$
Splice	0.90	0.953	-0.049	$-1.008 \times 10^{-7}$
LoF	2.58	0.930	-0.029	$-5.848 \times 10^{-8}$
<i>European ancestry ADNI (714)</i>				
Synonymous	38.99	2.077	0.028	$2.709 \times 10^{-8}$
Missense	77.98	2.008	0.013	$1.268 \times 10^{-8}$
Nonsense	2.10	0.933	-0.032	$-3.126 \times 10^{-8}$
Splice	1.16	0.878	-0.104	$-1.020 \times 10^{-7}$
LoF	3.26	0.930	-0.022	$-2.126 \times 10^{-8}$
<i>Dutch MinE (601)</i>				
Synonymous	42.93	1.749	0.017	$2.414 \times 10^{-8}$
Missense	79.34	1.960	0.012	$1.675 \times 10^{-8}$
Nonsense	1.89	1.057	0.028	$3.898 \times 10^{-8}$
Splice	0.95	0.972	-0.033	$-4.641 \times 10^{-8}$
LoF	2.83	0.996	-0.001	$-1.727 \times 10^{-9}$
<b><i>D. melanogaster</i></b>				
<i>Zambian DPGP3 (191)</i>				
Synonymous	3577.06	57.473	0.016	$1.658 \times 10^{-6}$
Missense	2051.52	18.536	0.008	$6.710 \times 10^{-7}$
Nonsense	10.21	0.928	-0.007	$-4.139 \times 10^{-7}$
Splice	2.60	0.948	-0.020	$-1.308 \times 10^{-6}$
LoF	12.81	0.929	-0.005	$-3.298 \times 10^{-7}$

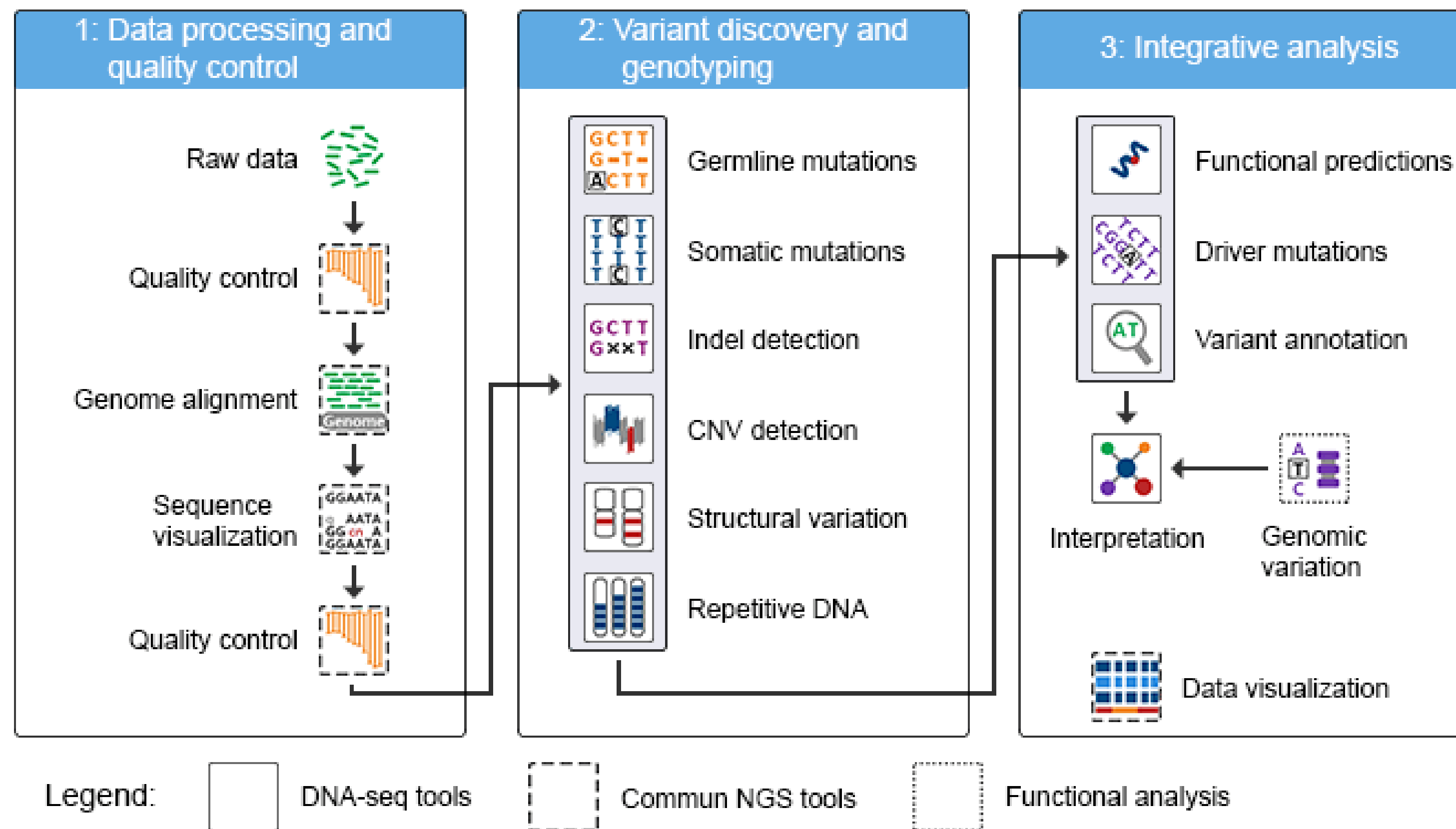
## **Part IV.**

# **Reproducibility of the study**

# Next-Generation Sequencing

ENS de Lyon - Carine Rey & Marie Semon

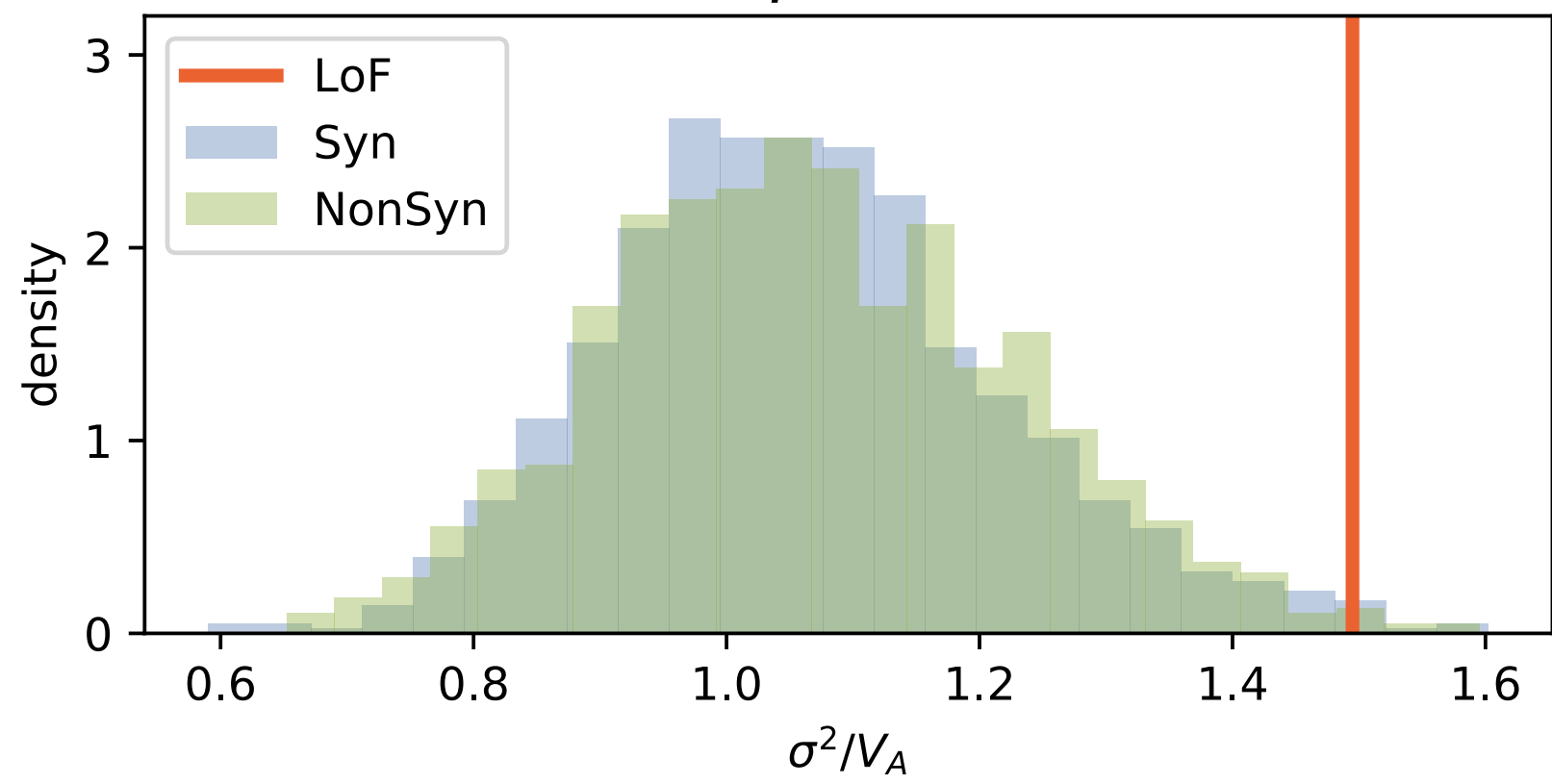
## Part I (3 days): from raw data to variant calling in humans.



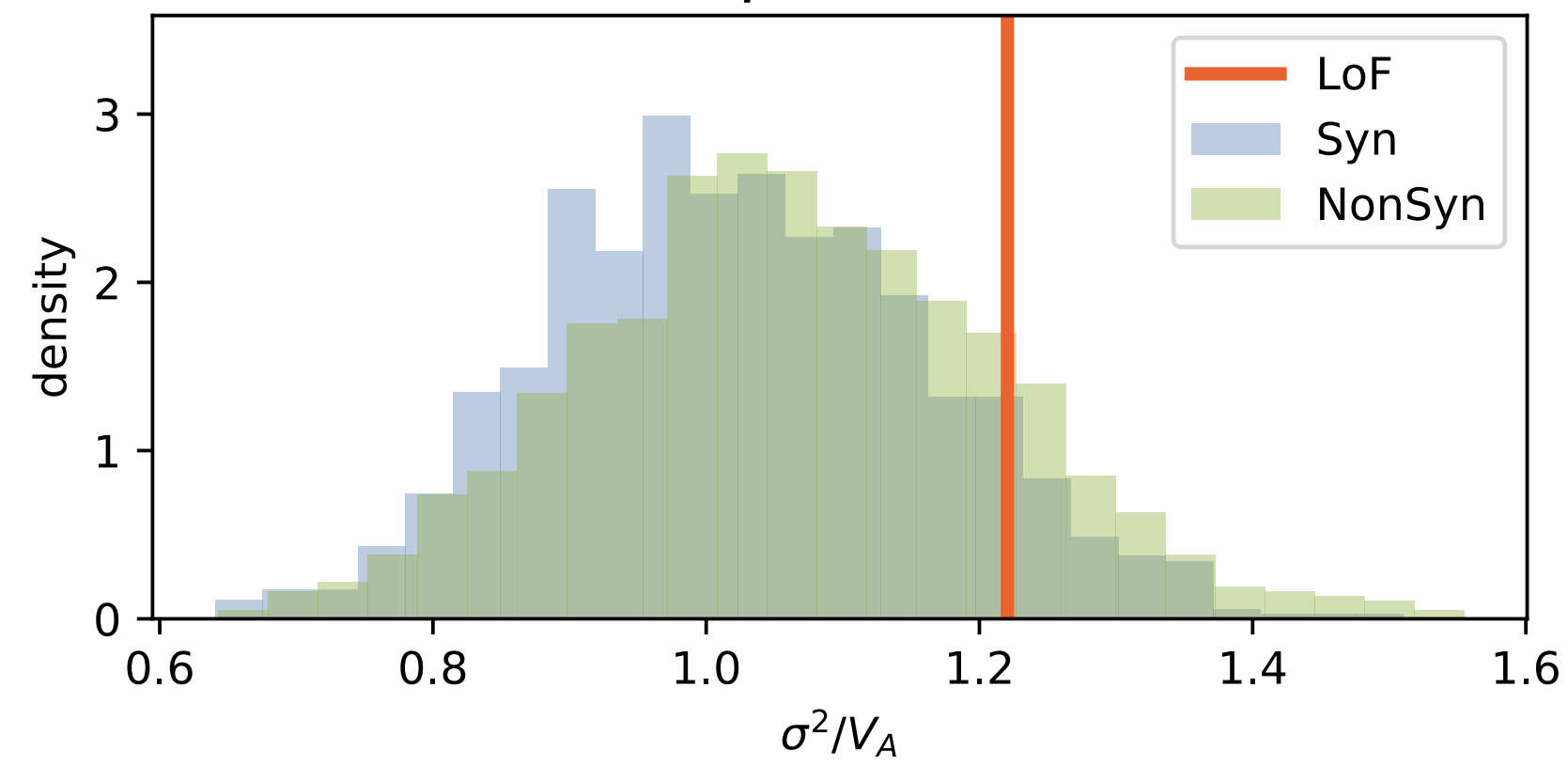
## Part II (3 days): reproducing Sohail *et al* using 1000 genomes SNP dataset

# Reproducing Sohail *et al* on 1000G dataset (1/3)

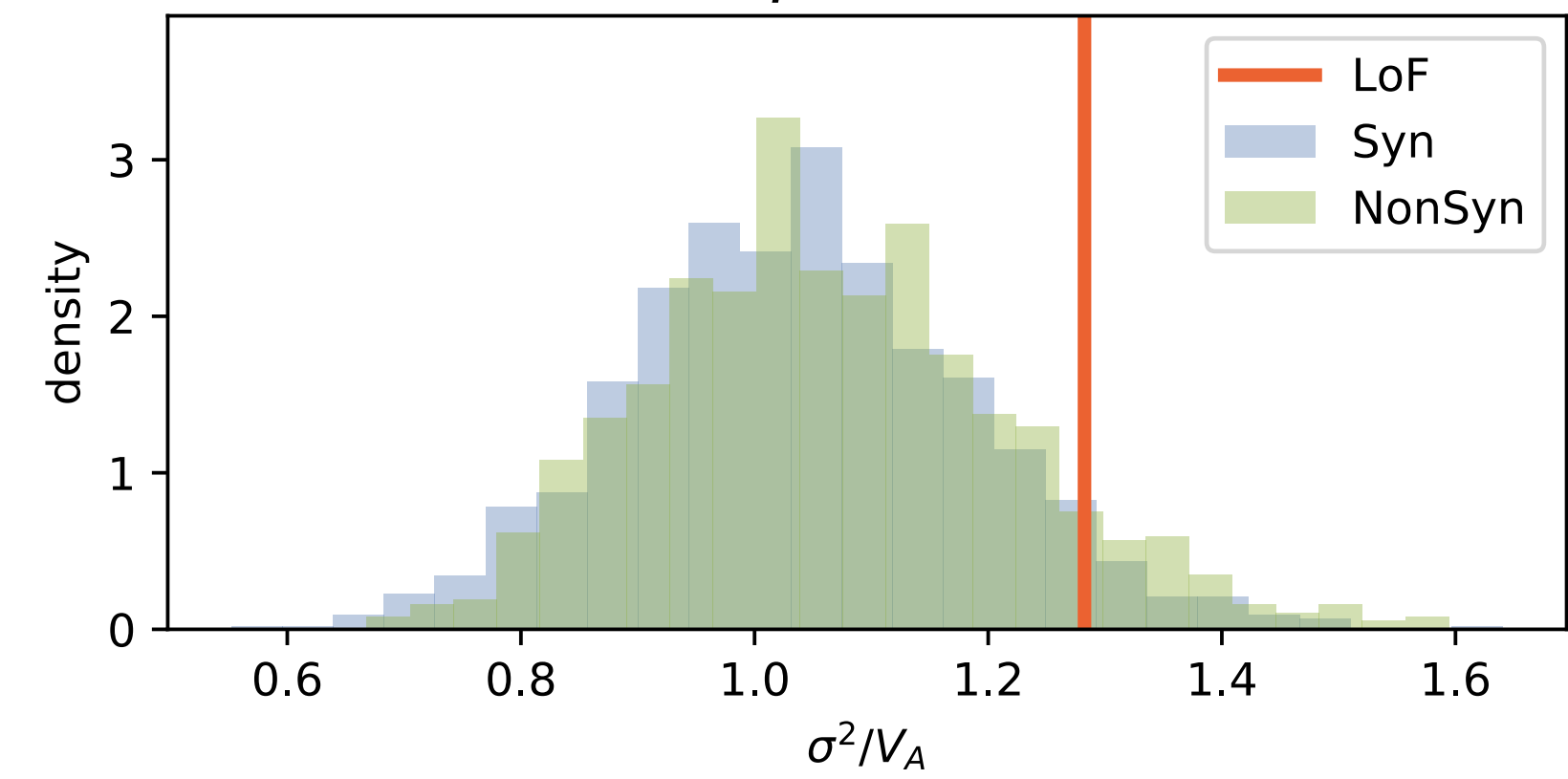
GBR ( $p = 0.991$ )



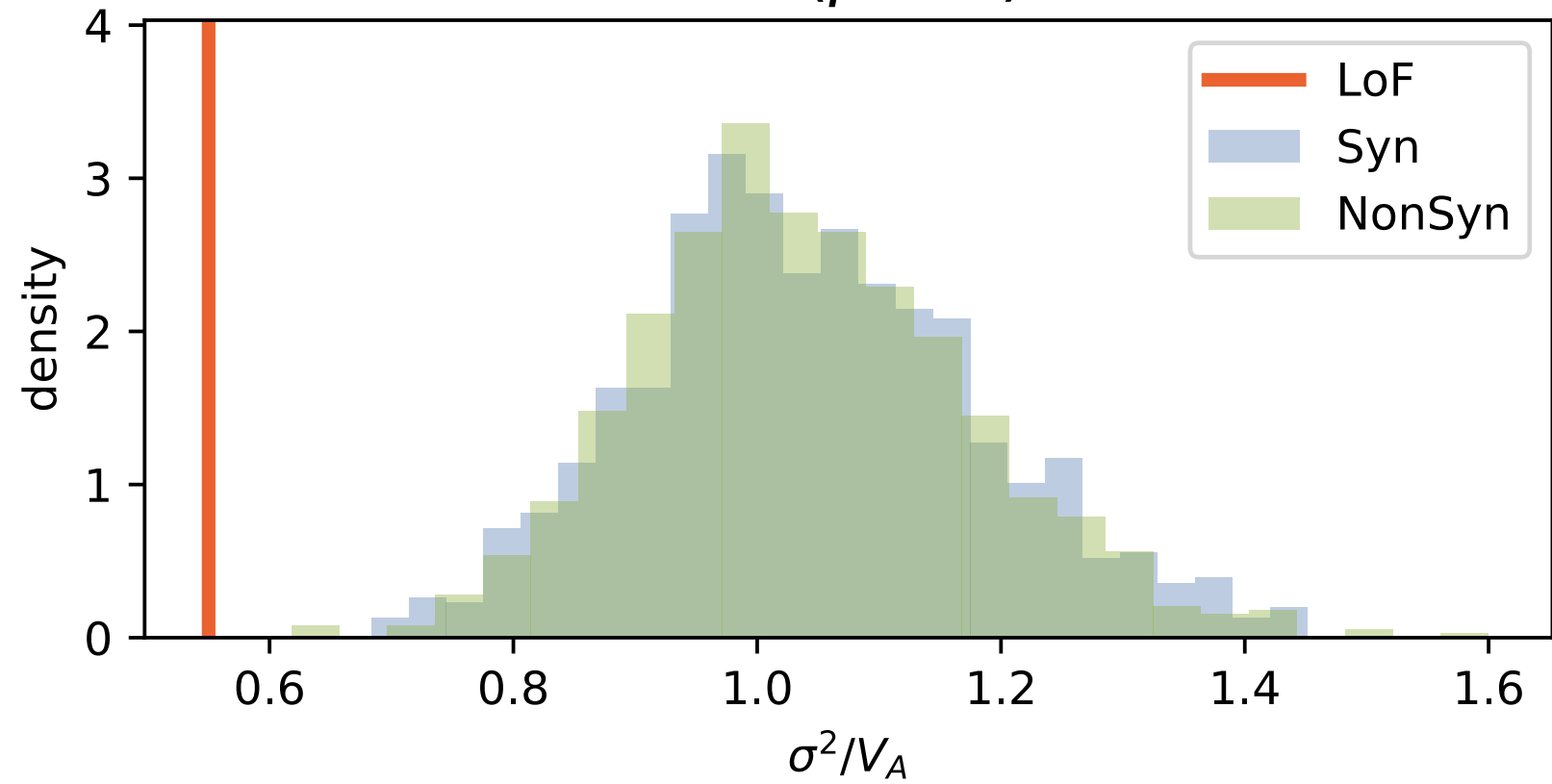
TSI ( $p = 0.911$ )



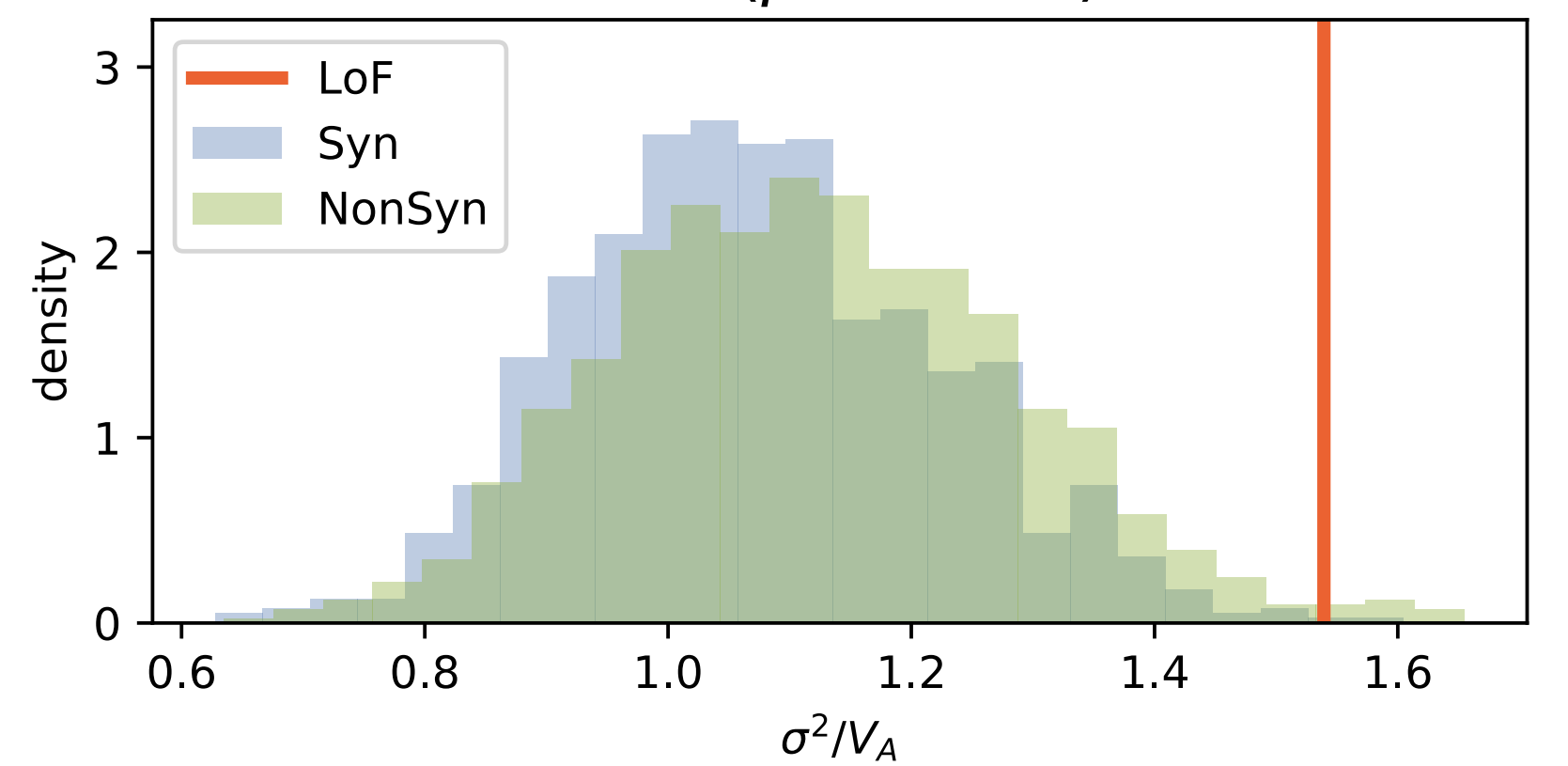
FIN ( $p = 0.948$ )



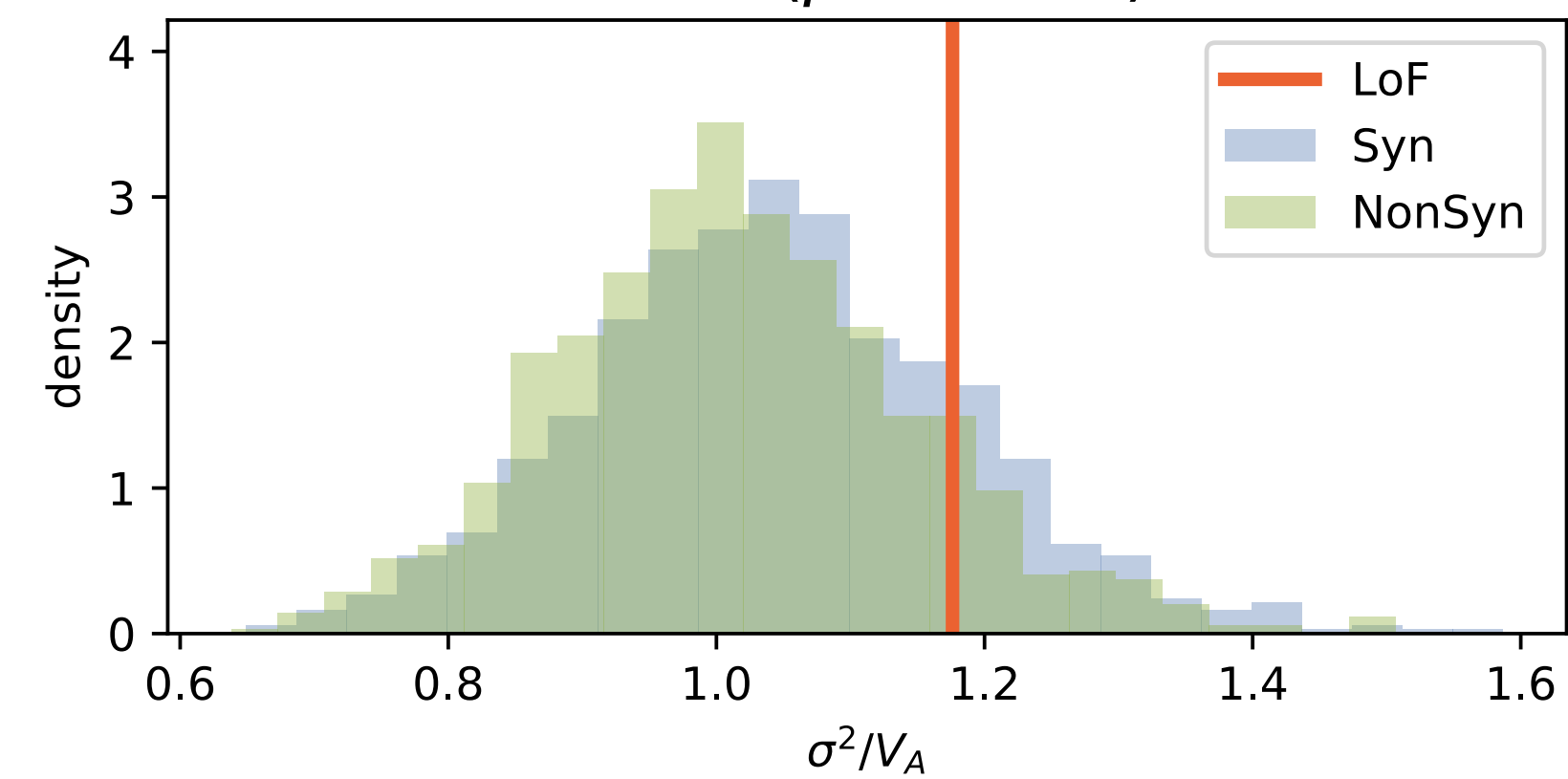
IBS ( $p = 0$ )



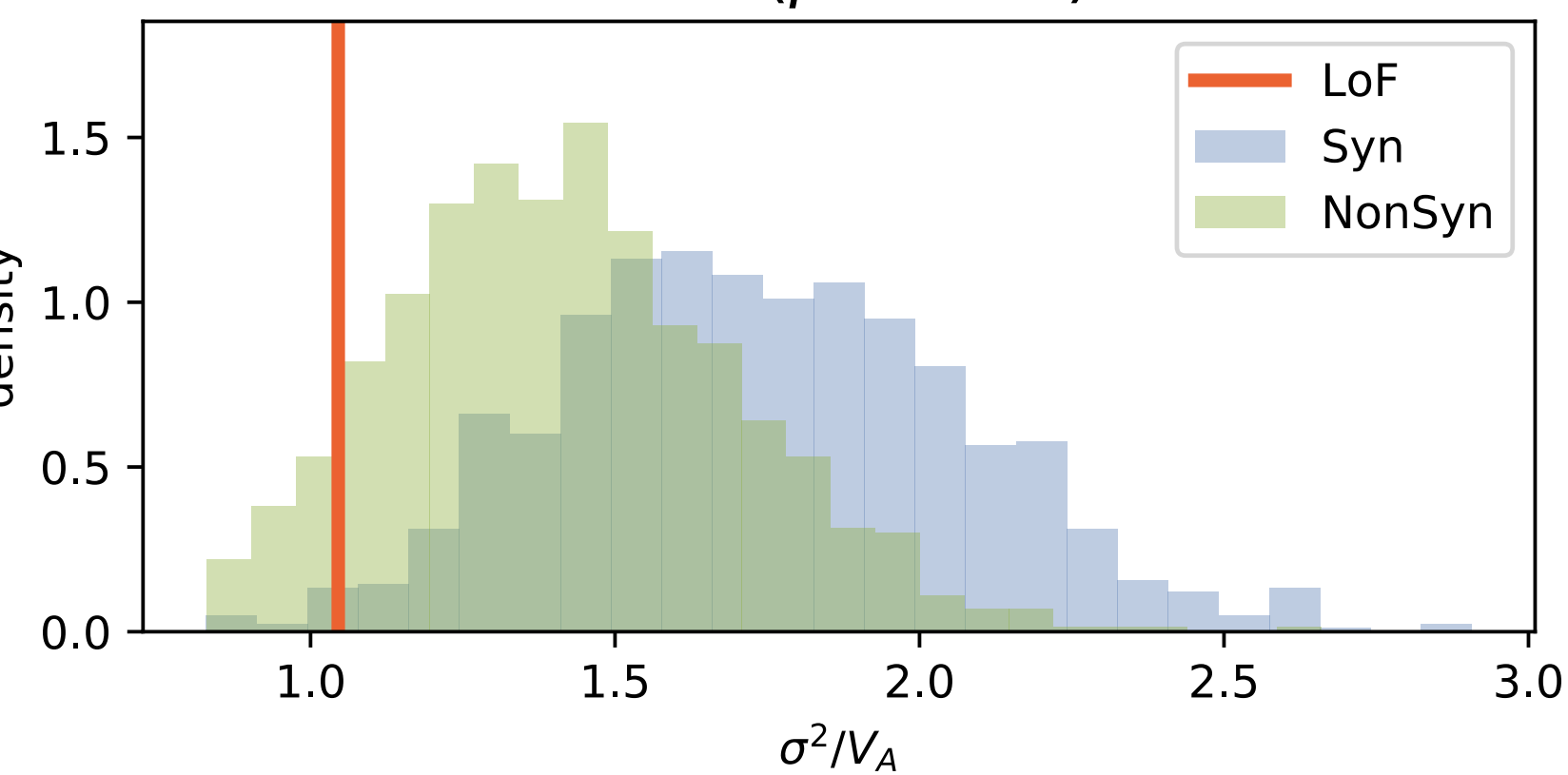
CEU ( $p = 0.999$ )



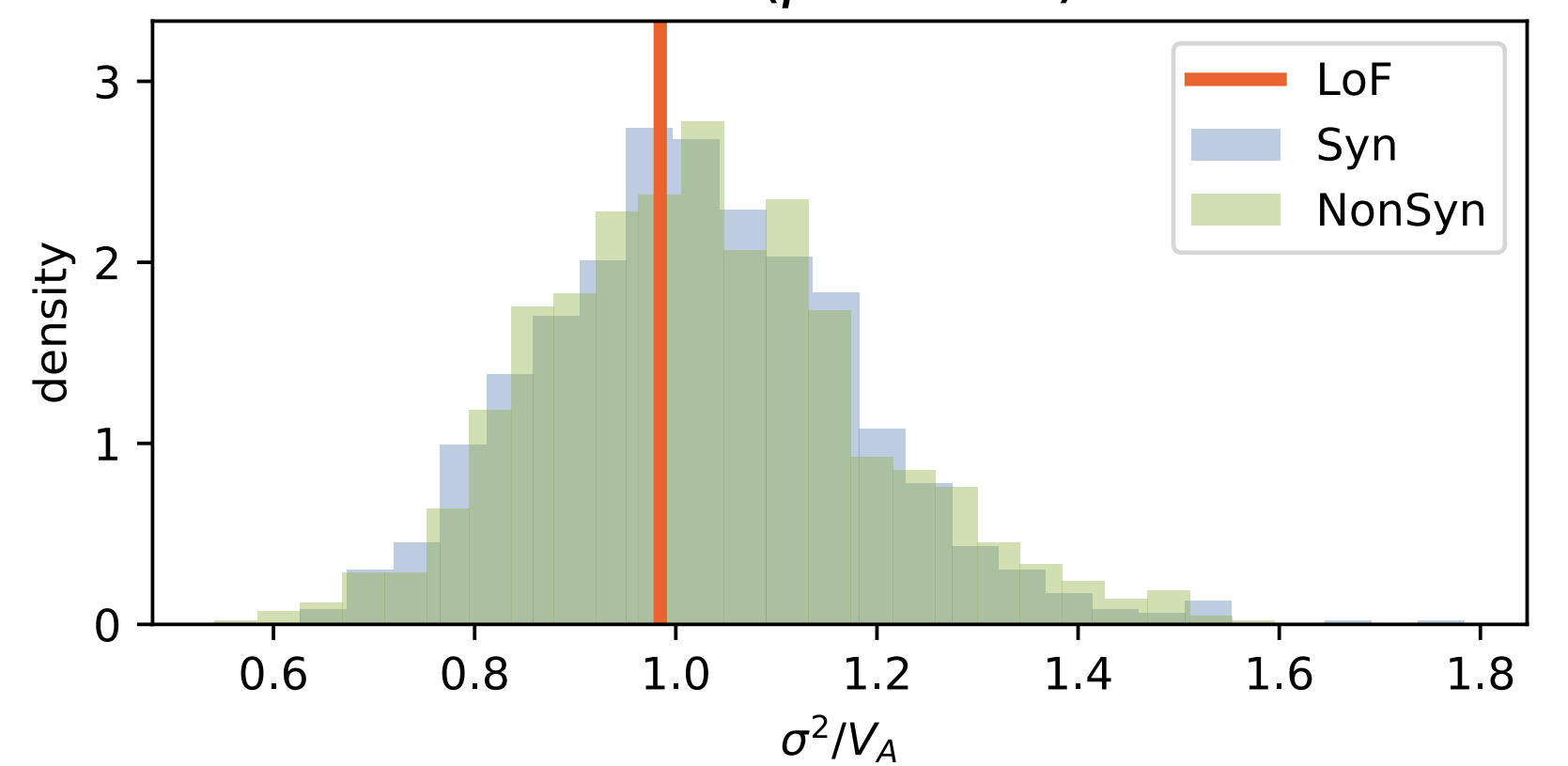
GWD ( $p = 0.824$ )



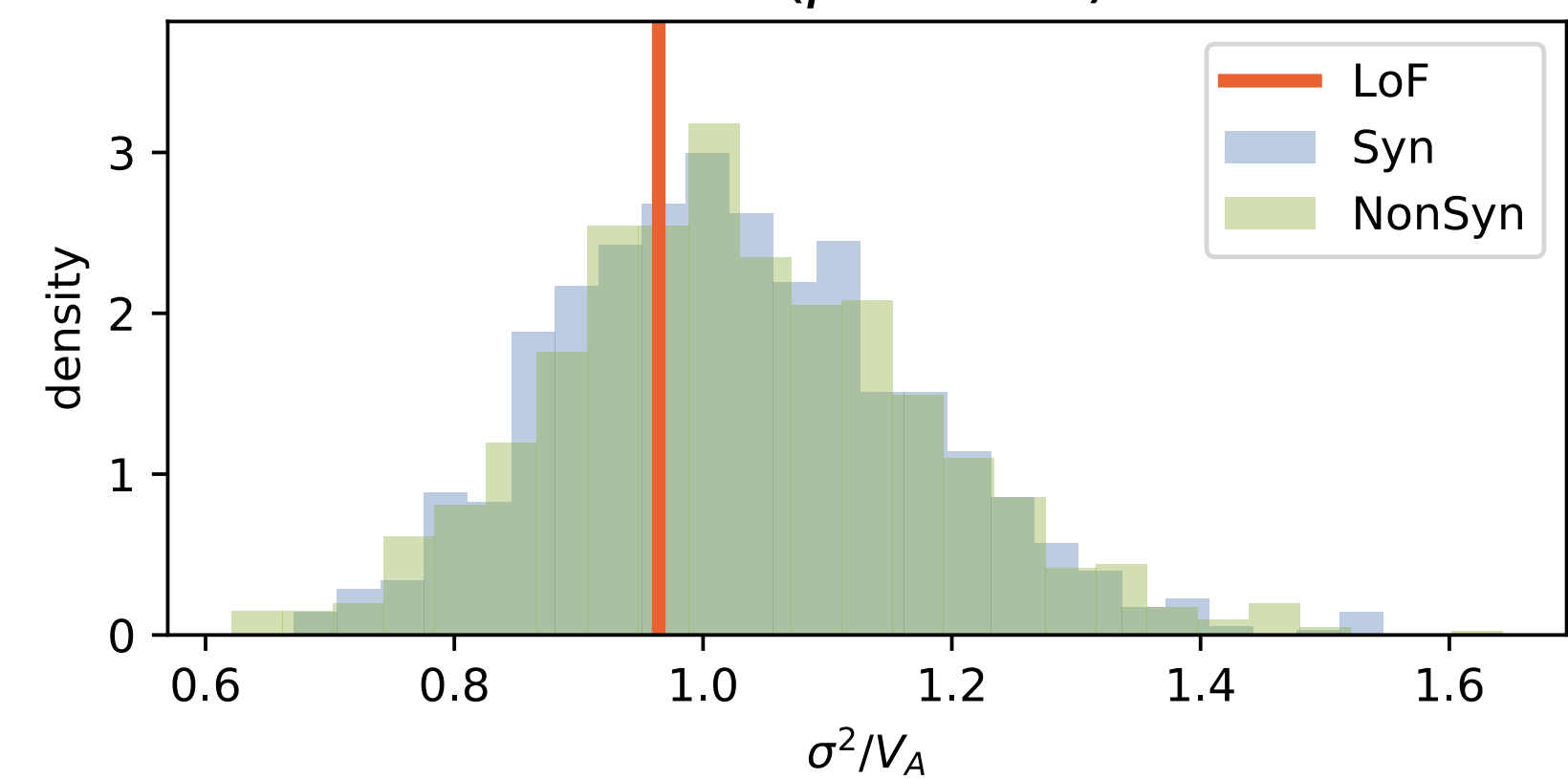
ASW ( $p = 0.01$ )



MSL ( $p = 0.41$ )



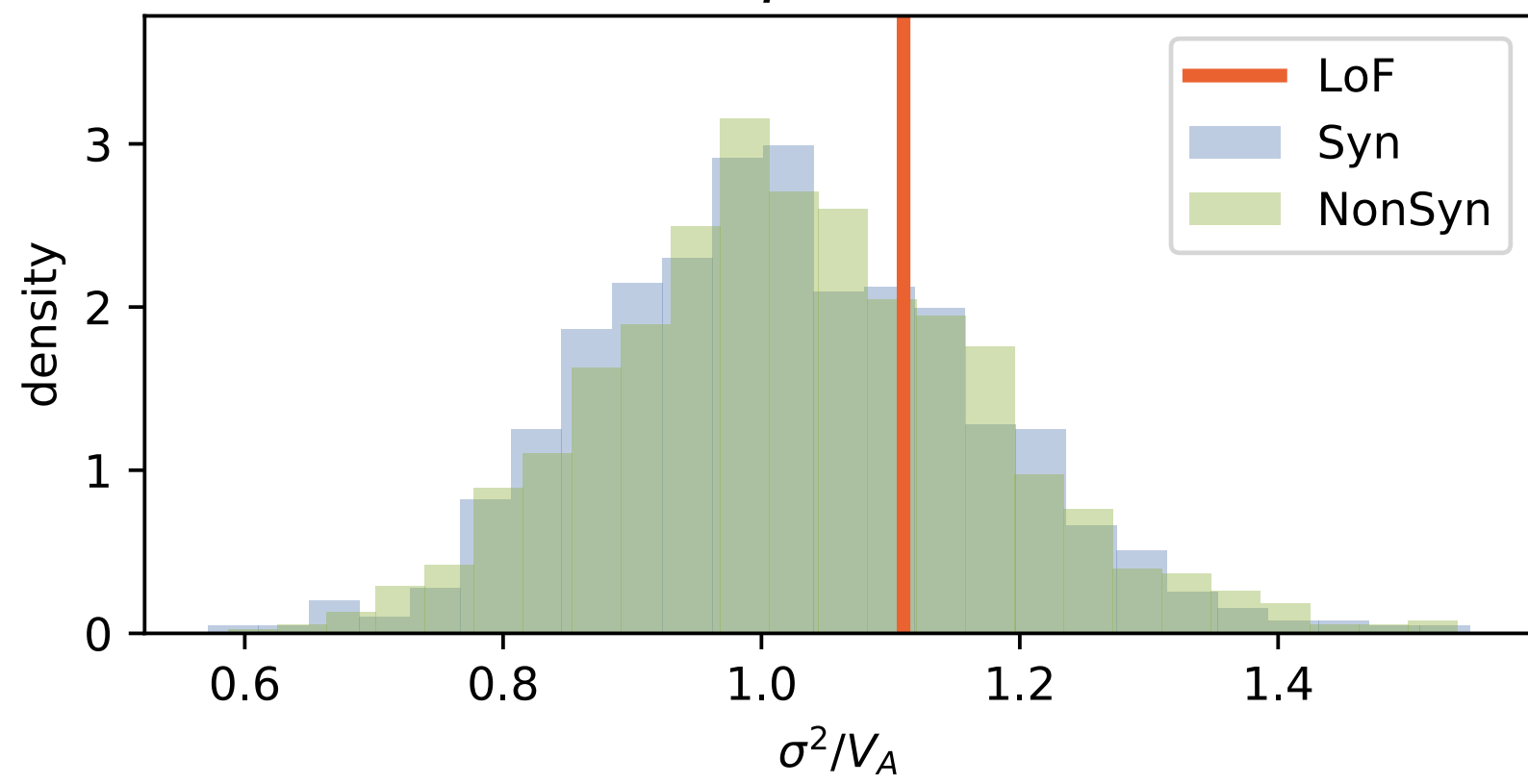
ESN ( $p = 0.35$ )



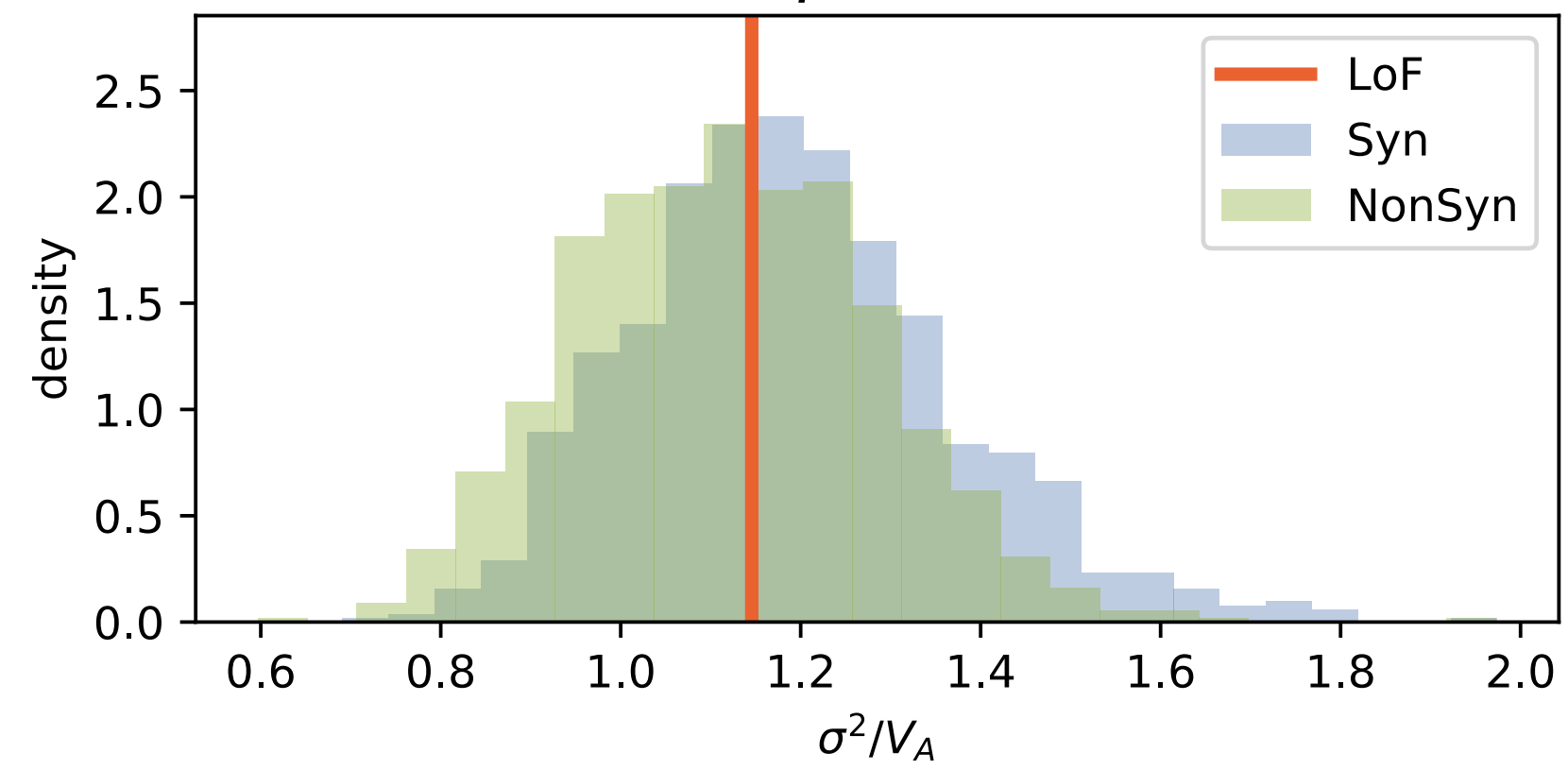


# Reproducing Sohail *et al* on 1000G dataset (2/3)

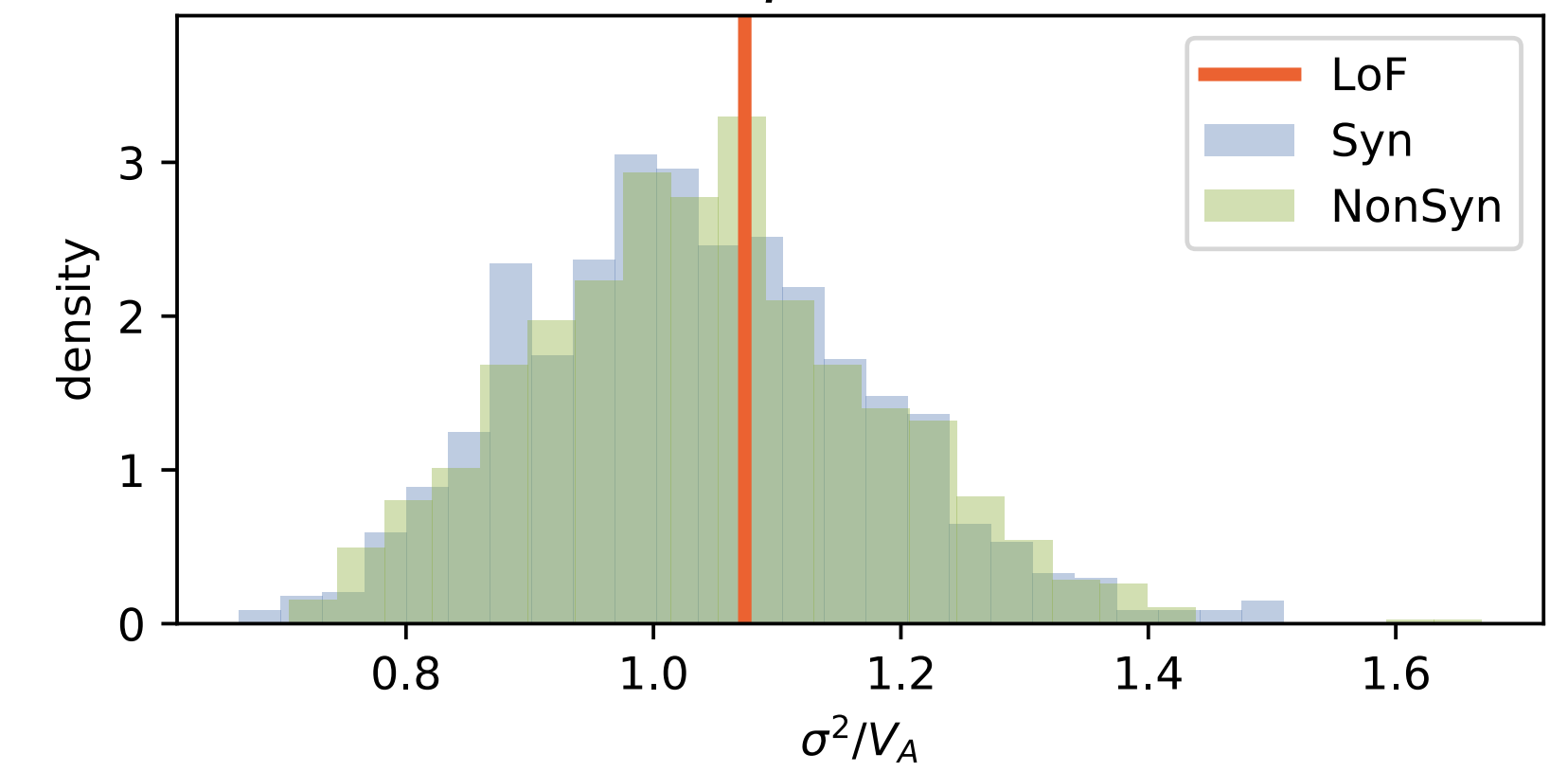
LWK ( $p = 0.735$ )



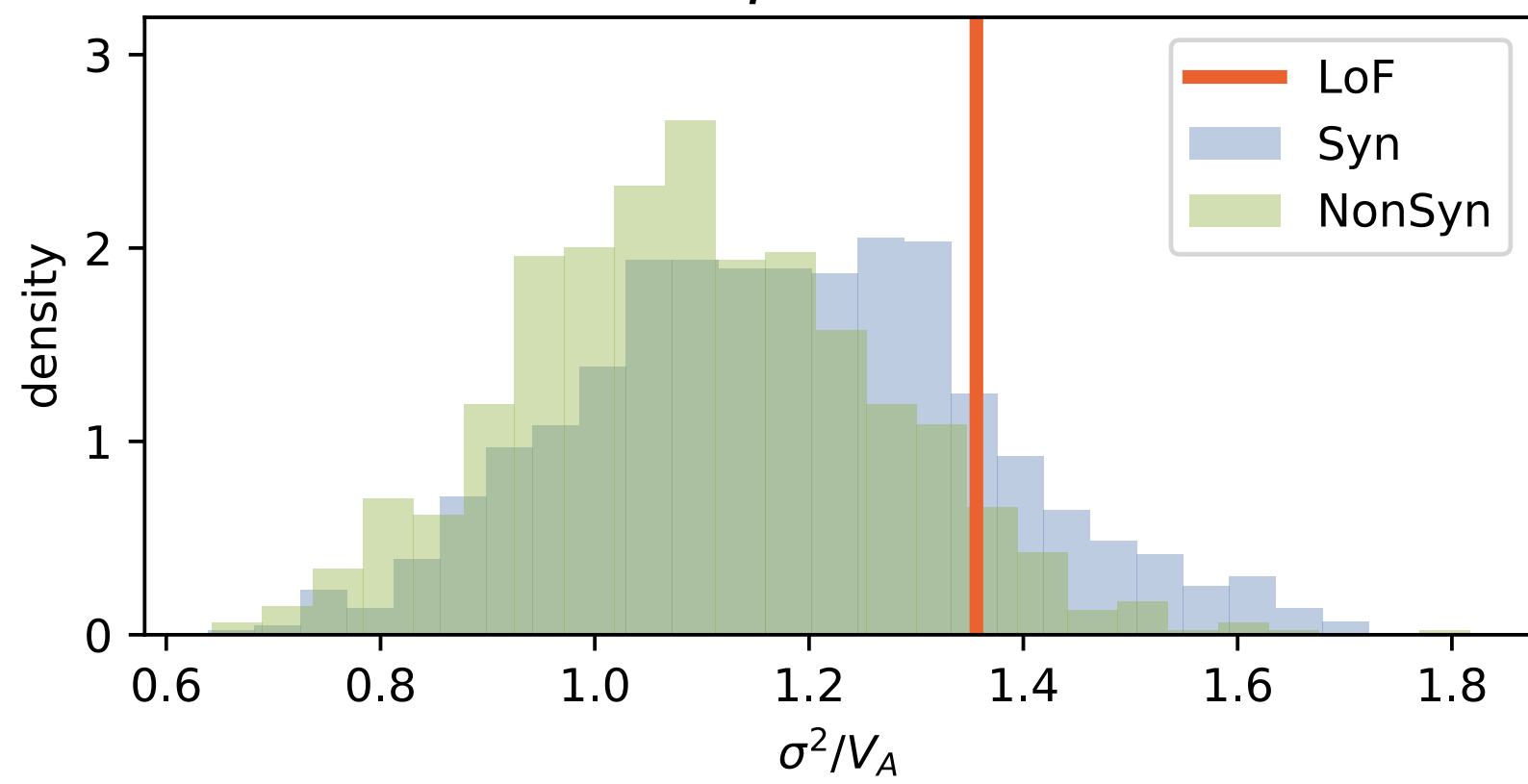
ACB ( $p = 0.418$ )



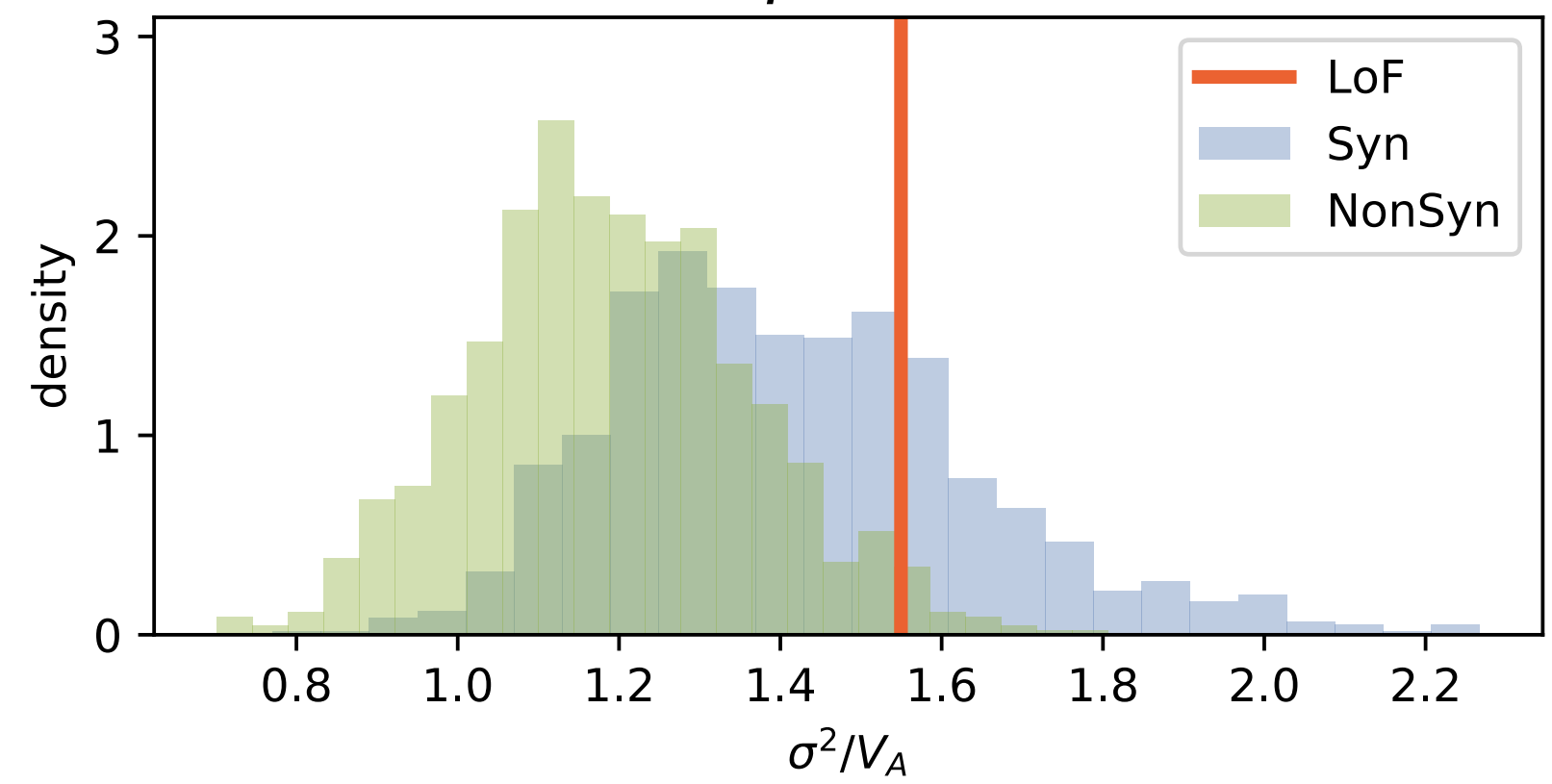
YRI ( $p = 0.621$ )



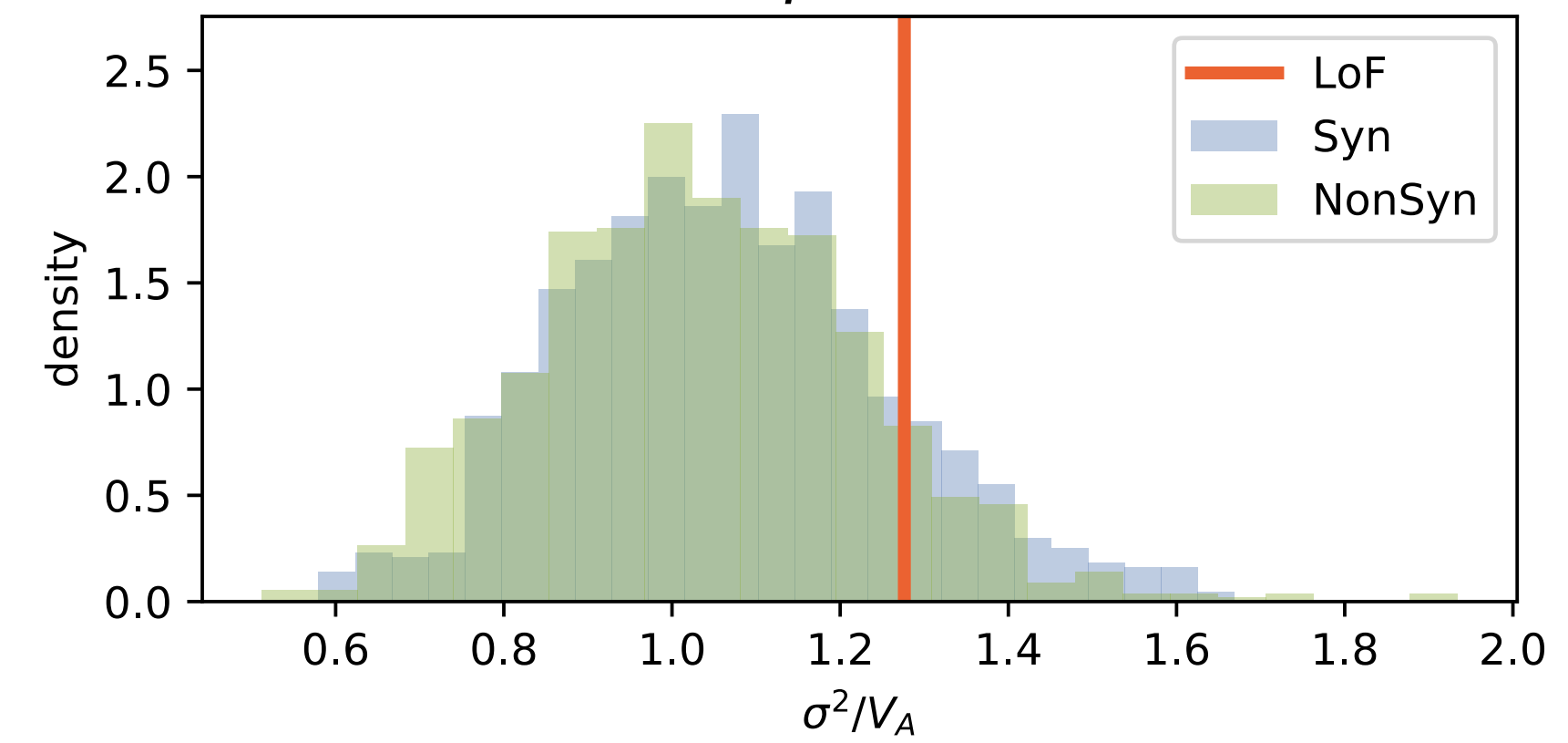
PEL ( $p = 0.833$ )



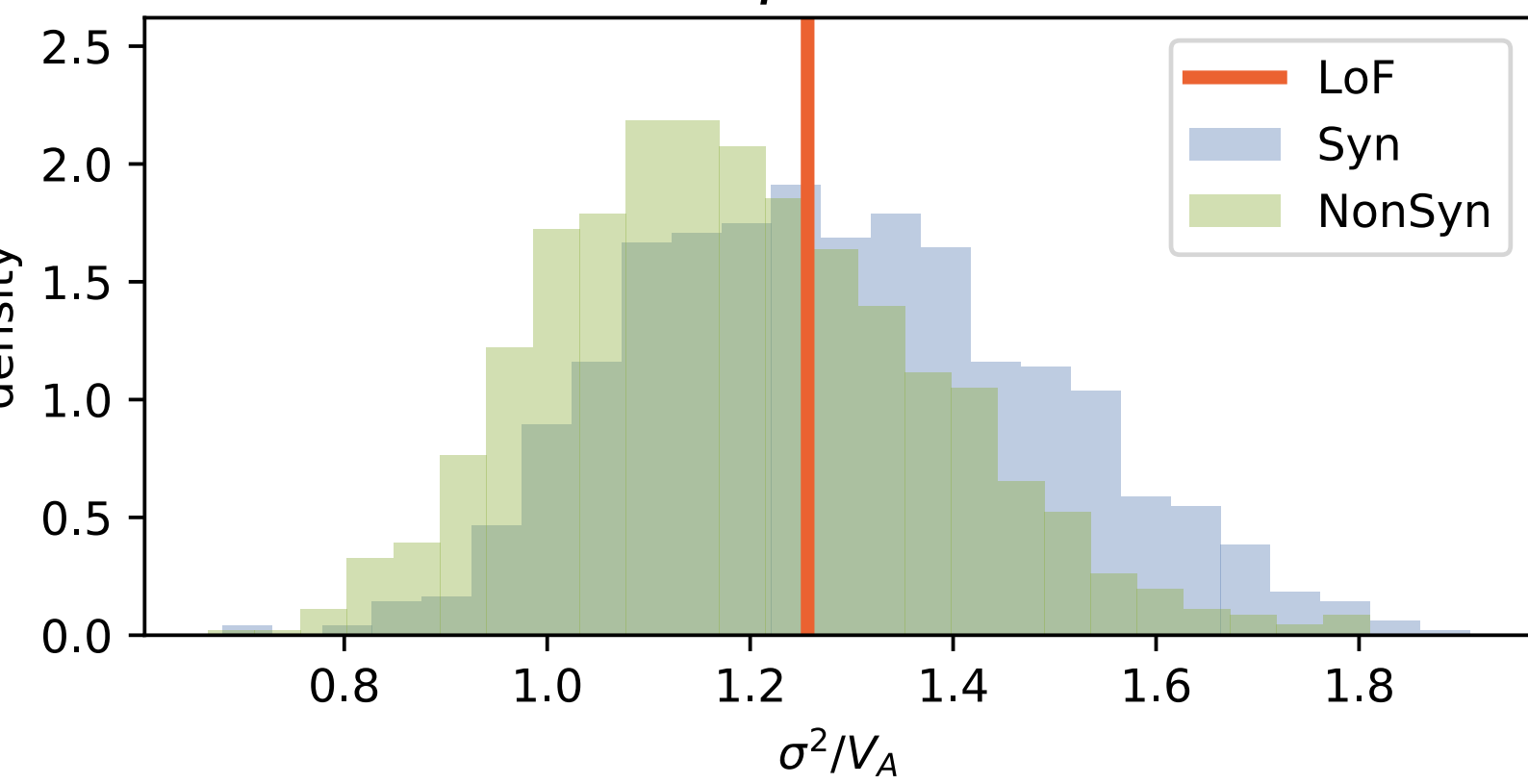
PUR ( $p = 0.743$ )



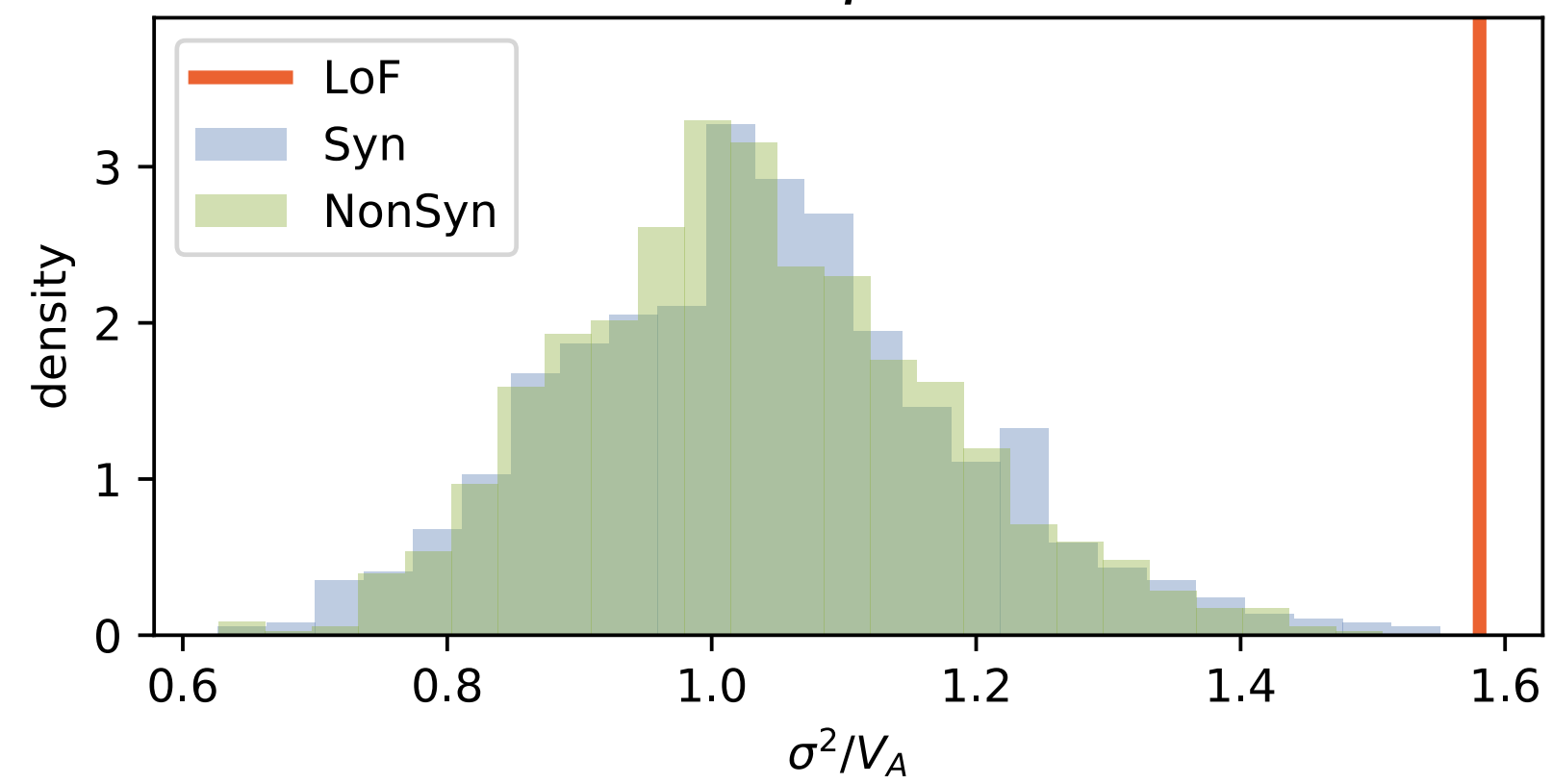
MXL ( $p = 0.859$ )



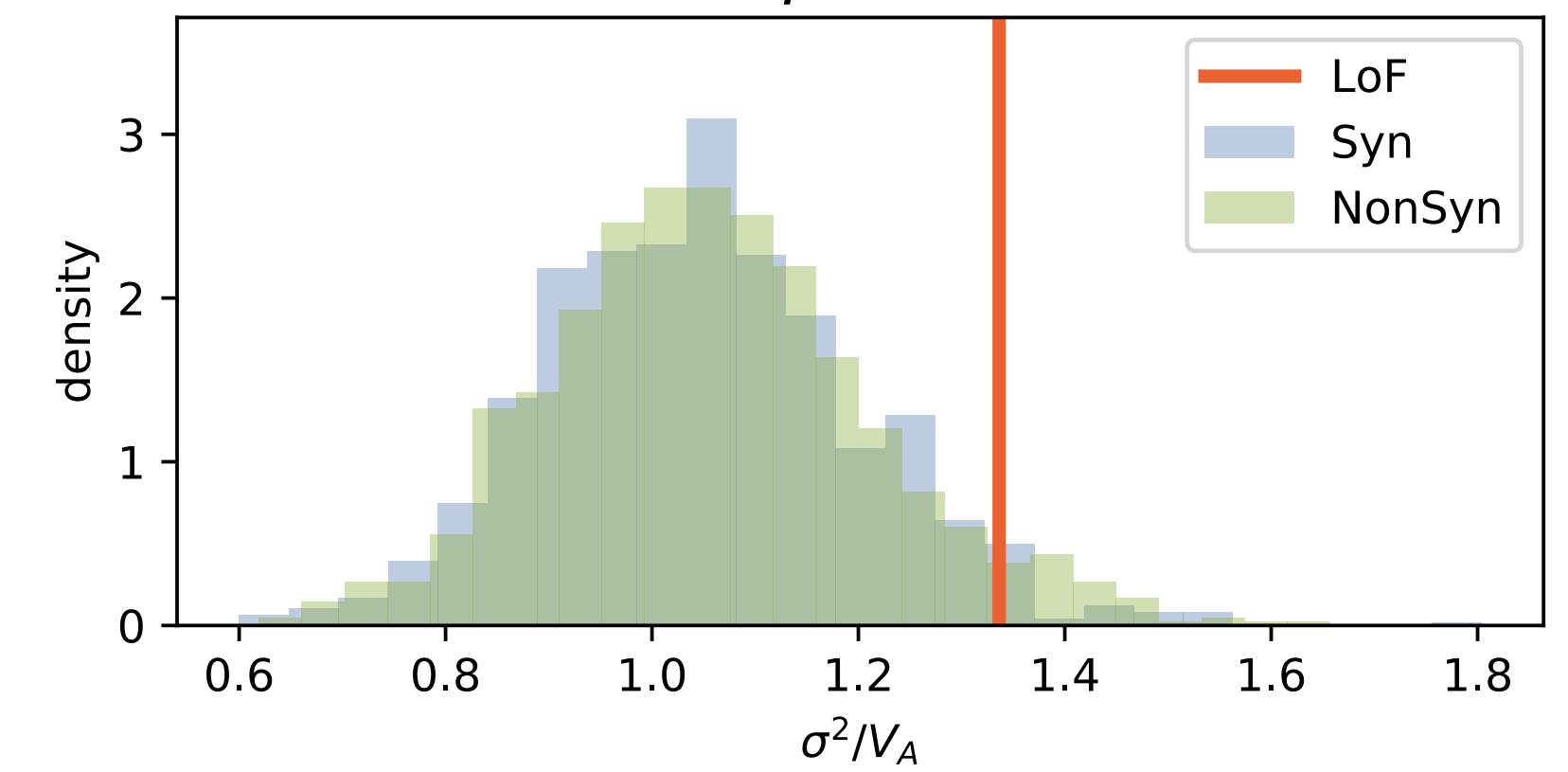
CLM ( $p = 0.464$ )



CHS ( $p = 1$ )

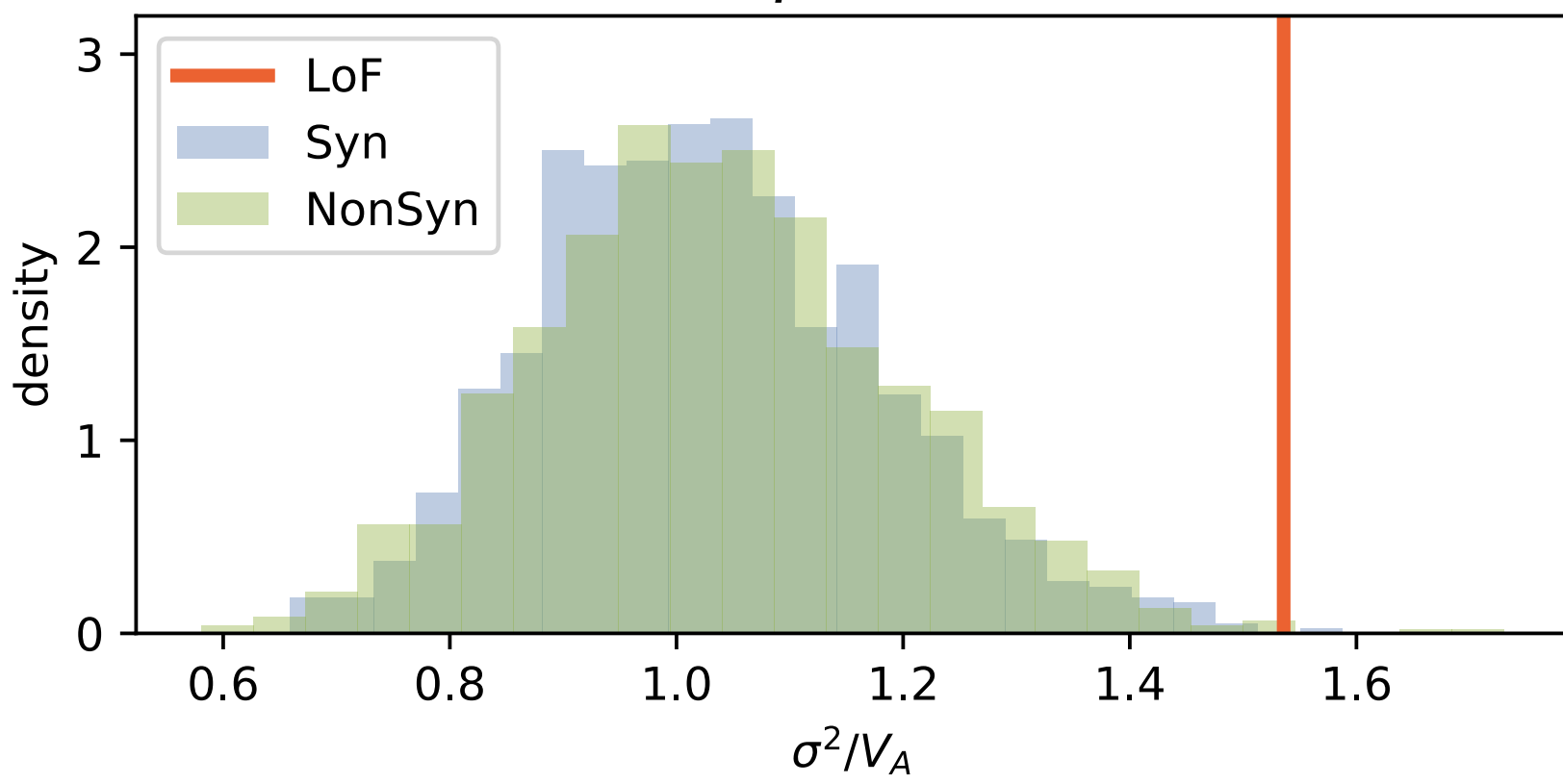


CHB ( $p = 0.966$ )

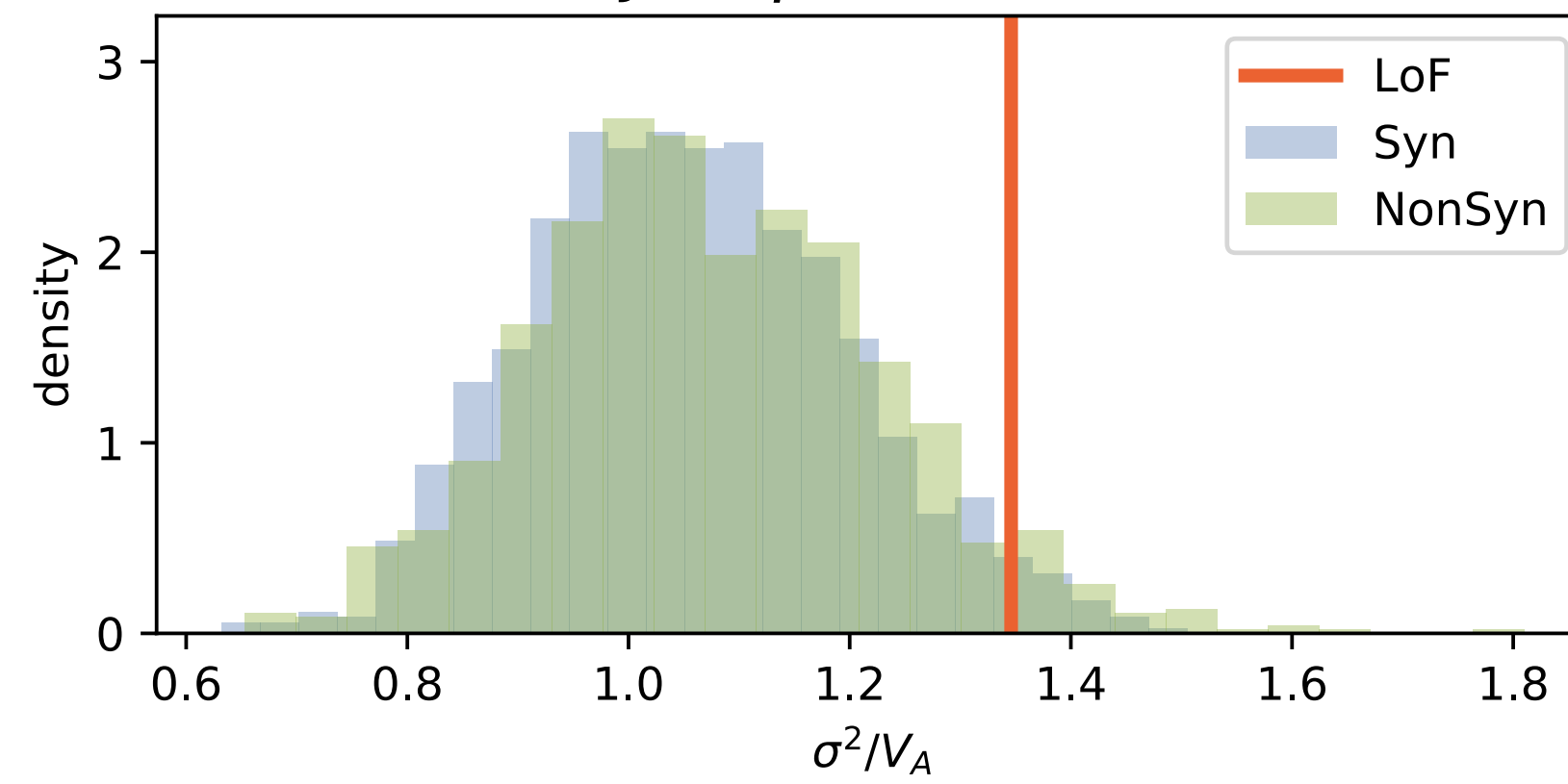


# Reproducing Sohail *et al* on 1000G dataset (3/3)

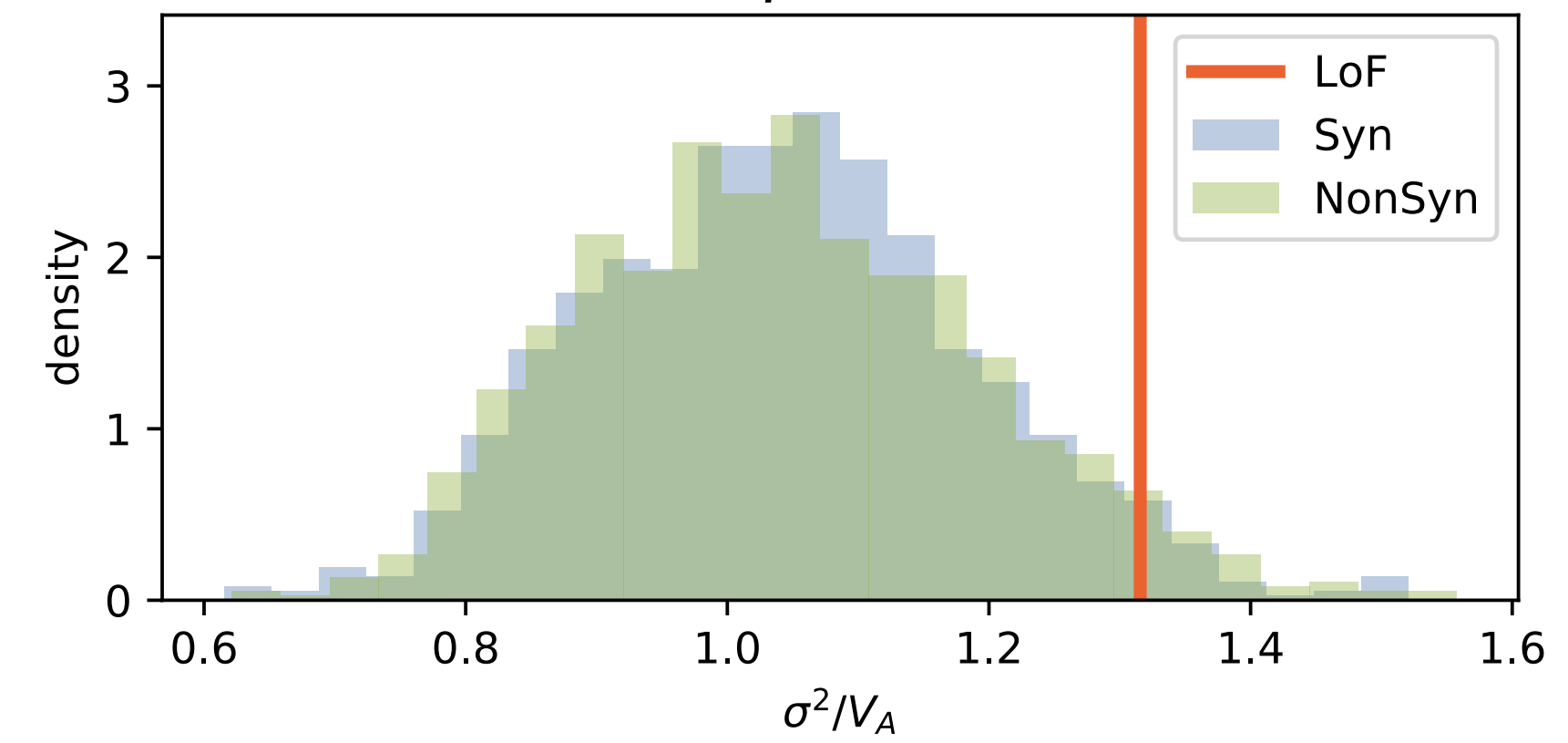
CDX ( $p = 0.999$ )



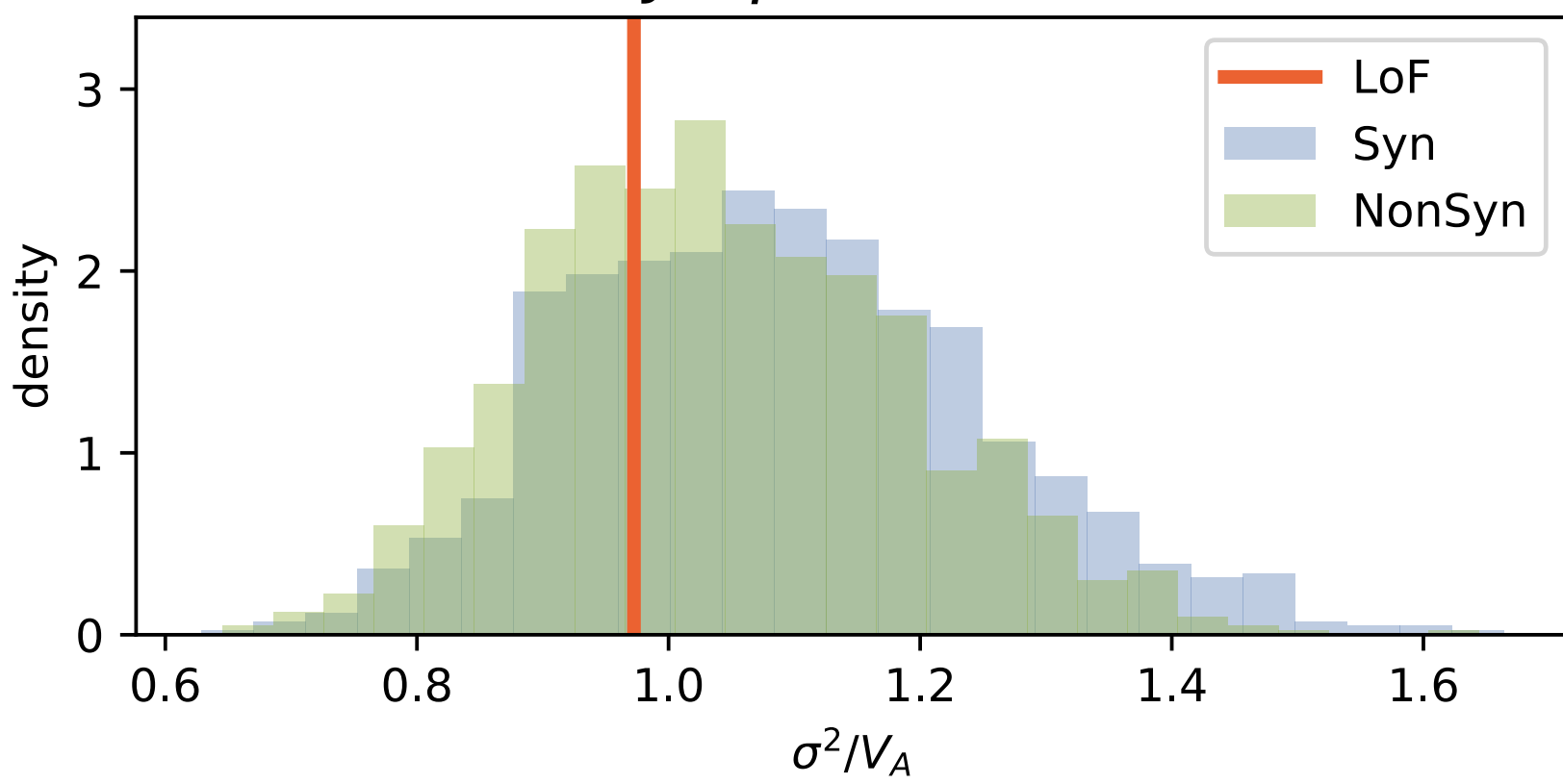
JPT ( $p = 0.975$ )



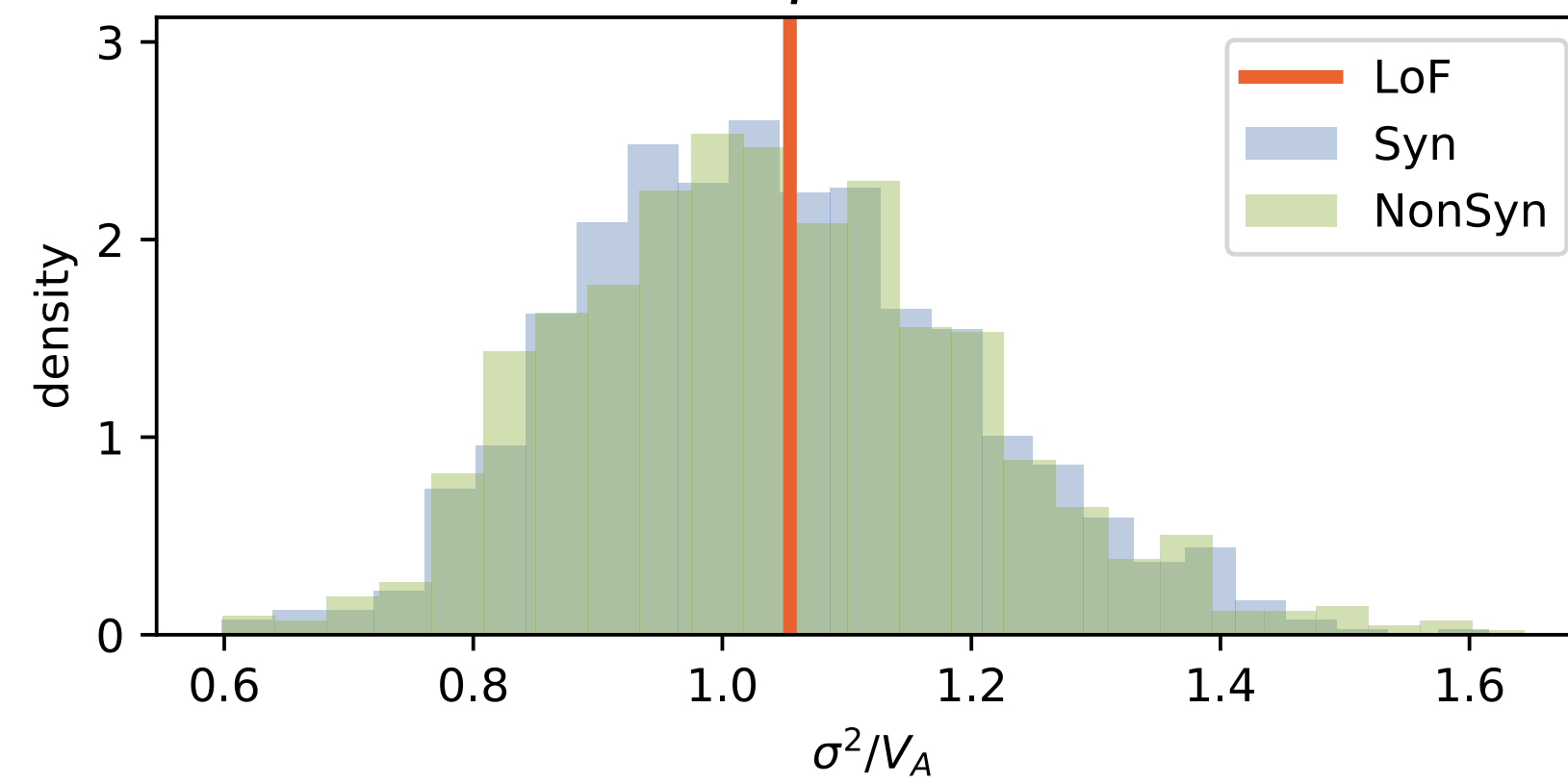
KHV ( $p = 0.963$ )



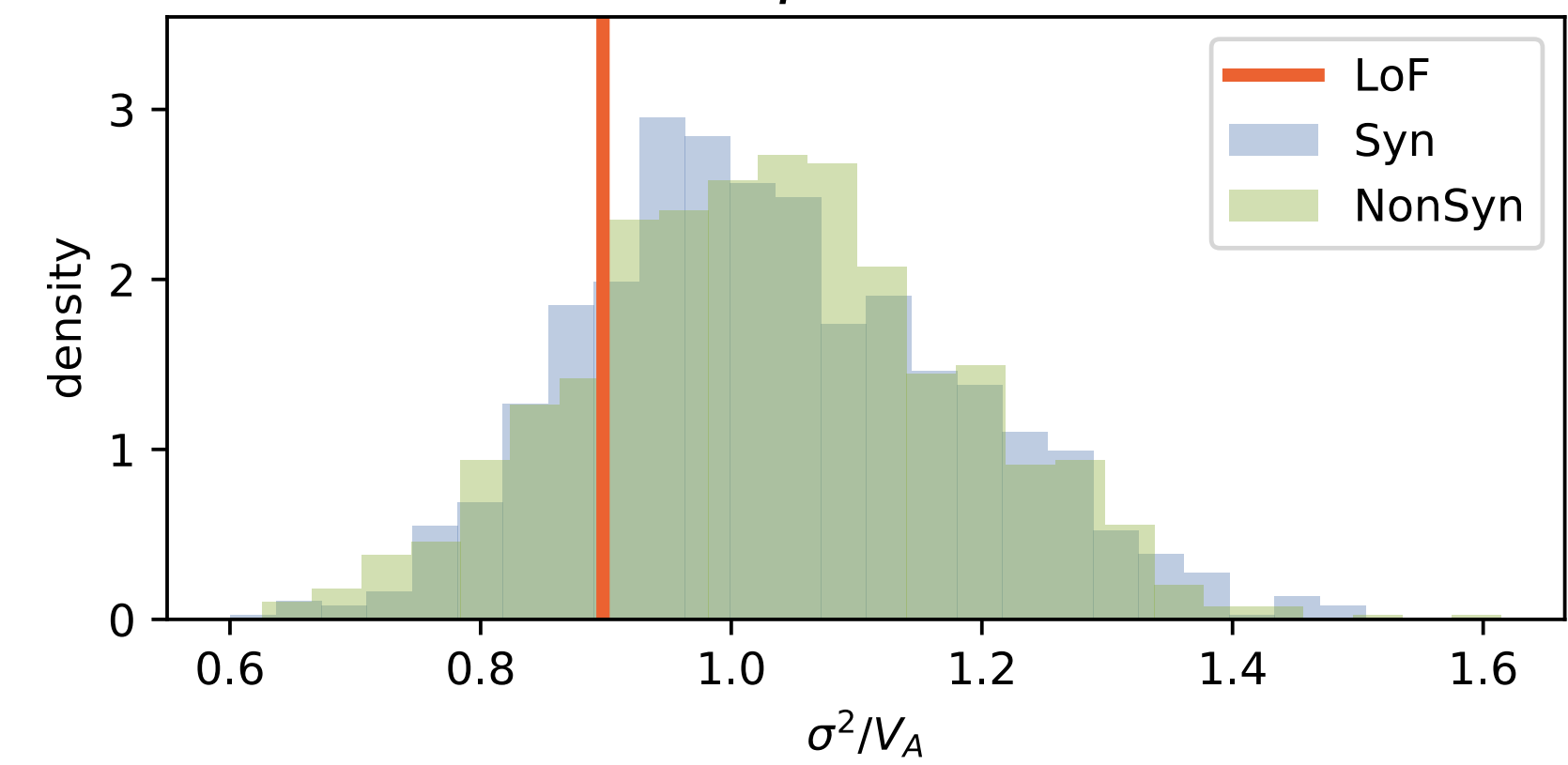
PJL ( $p = 0.263$ )



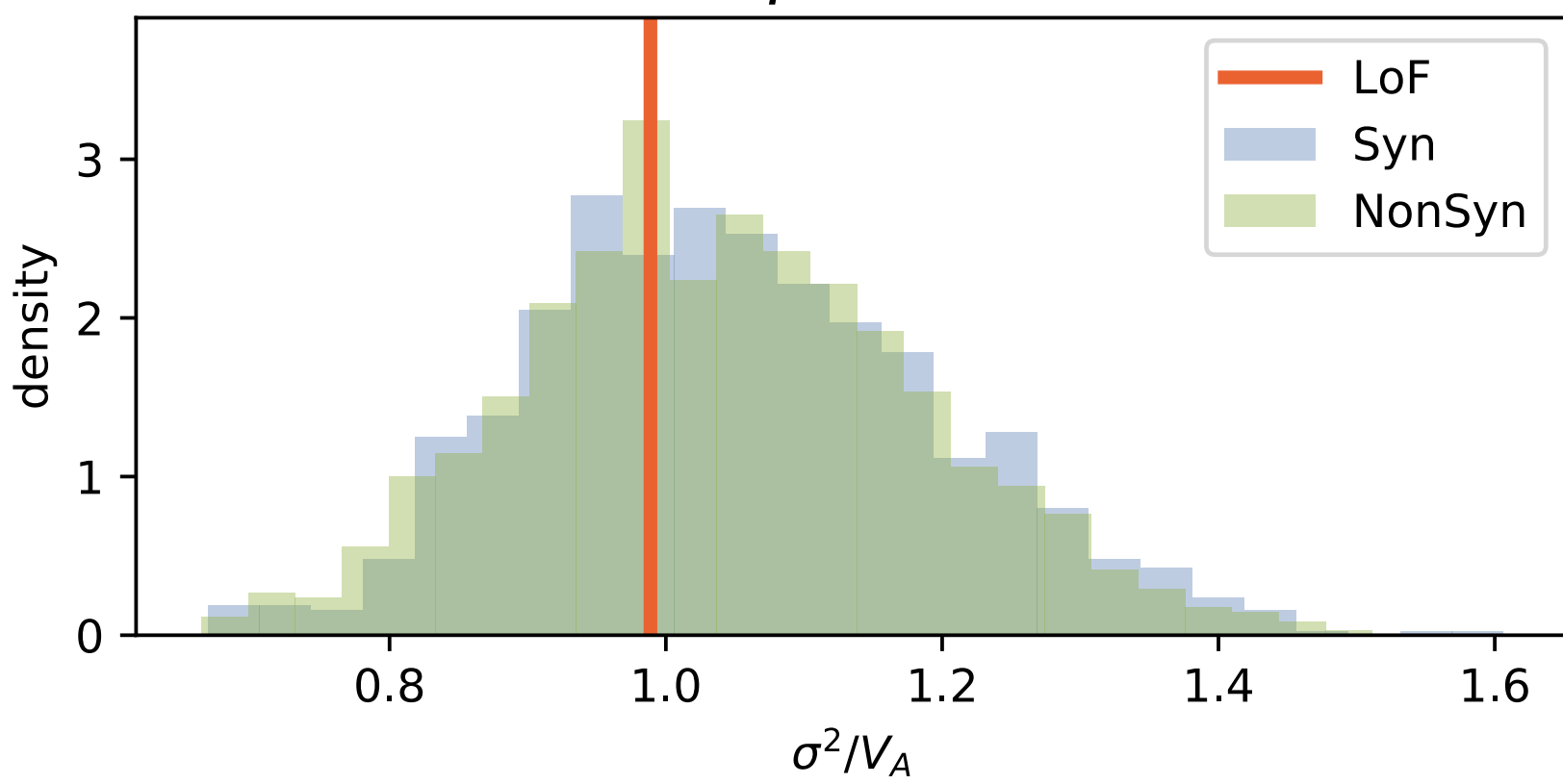
BEB ( $p = 0.567$ )



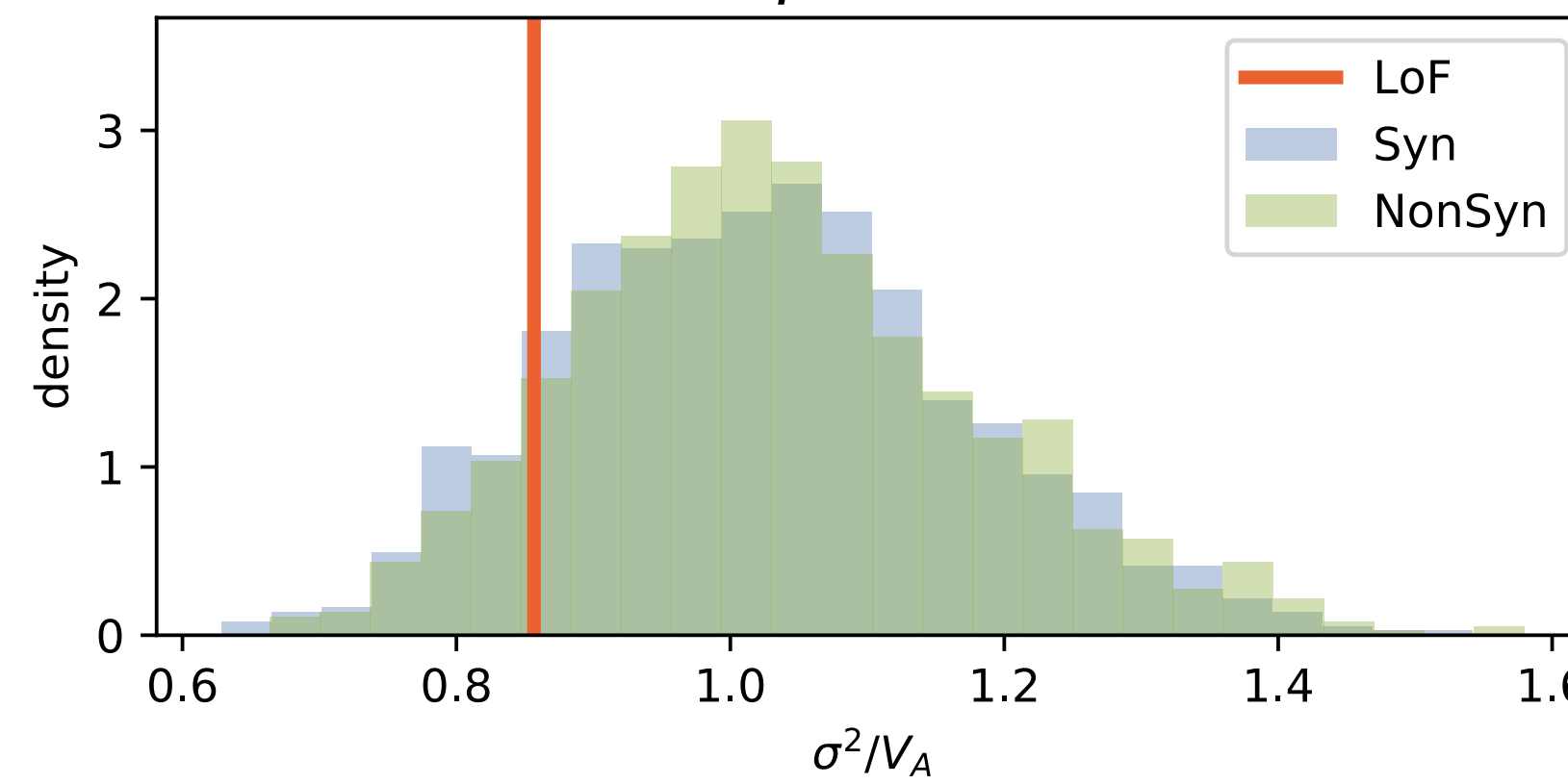
GIH ( $p = 0.185$ )



STU ( $p = 0.363$ )



ITU ( $p = 0.127$ )



# Conclusions

**I. Not so sure that epistasis is negative genome-wide in humans as stated in Sohail *et al.***

**II. The evolutionary advantage of recombination is still an open question. Negative epistasis is not a fundamentally necessary assumption.**

**III. Discrepancy between theory and data in the field of recombination.**

**“Models that address the evolution of recombination rate were generated to explain the evolutionary advantage of recombination, rather than quantitative differences in rate among individuals.”**

**Dapper & Payseur, 2017**