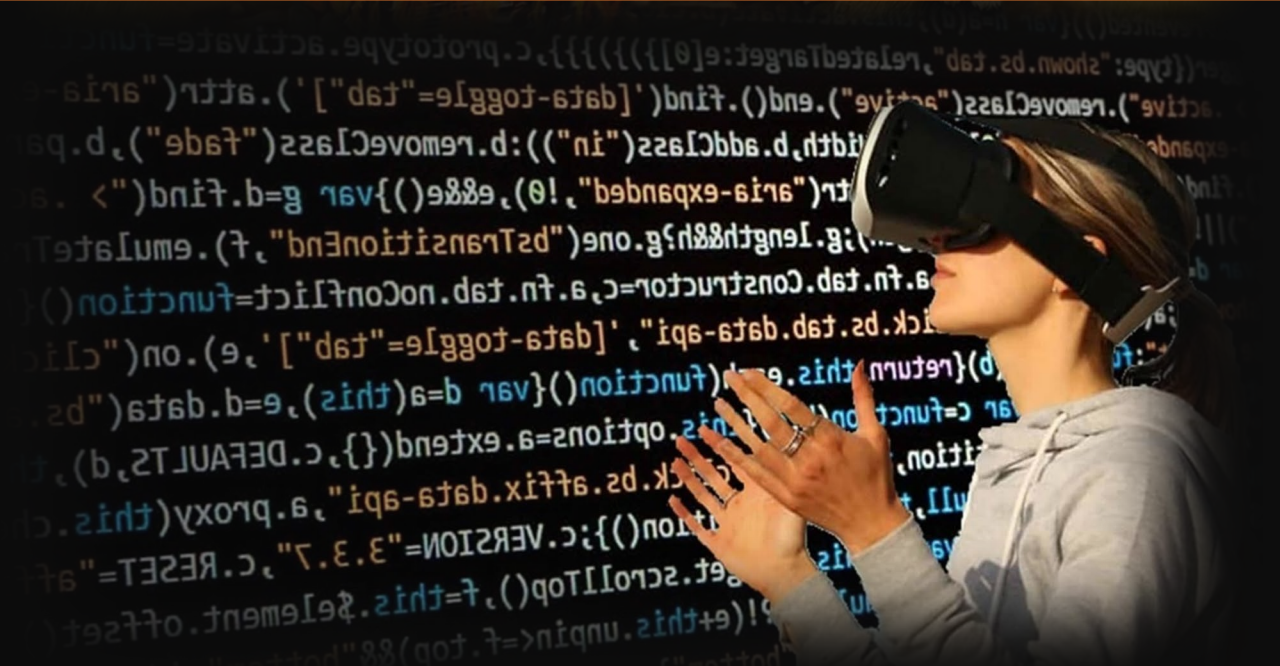


From prehistoric time to the futuristic age of AI

A human genetic perspective

Linh Tran

University of Arizona



Presenter Financial Disclosure

I do not have any relationships to report within the last 24 months with ACCME defined ineligible companies.

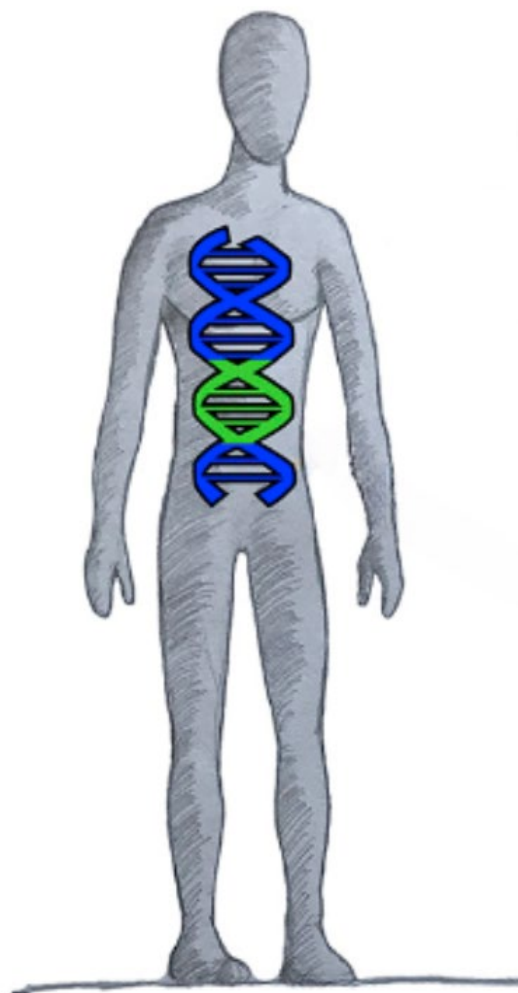
Unlabeled/Investigational Uses

I will not be discussing unlabeled/investigational uses of medical devices or pharmaceuticals during this presentation.



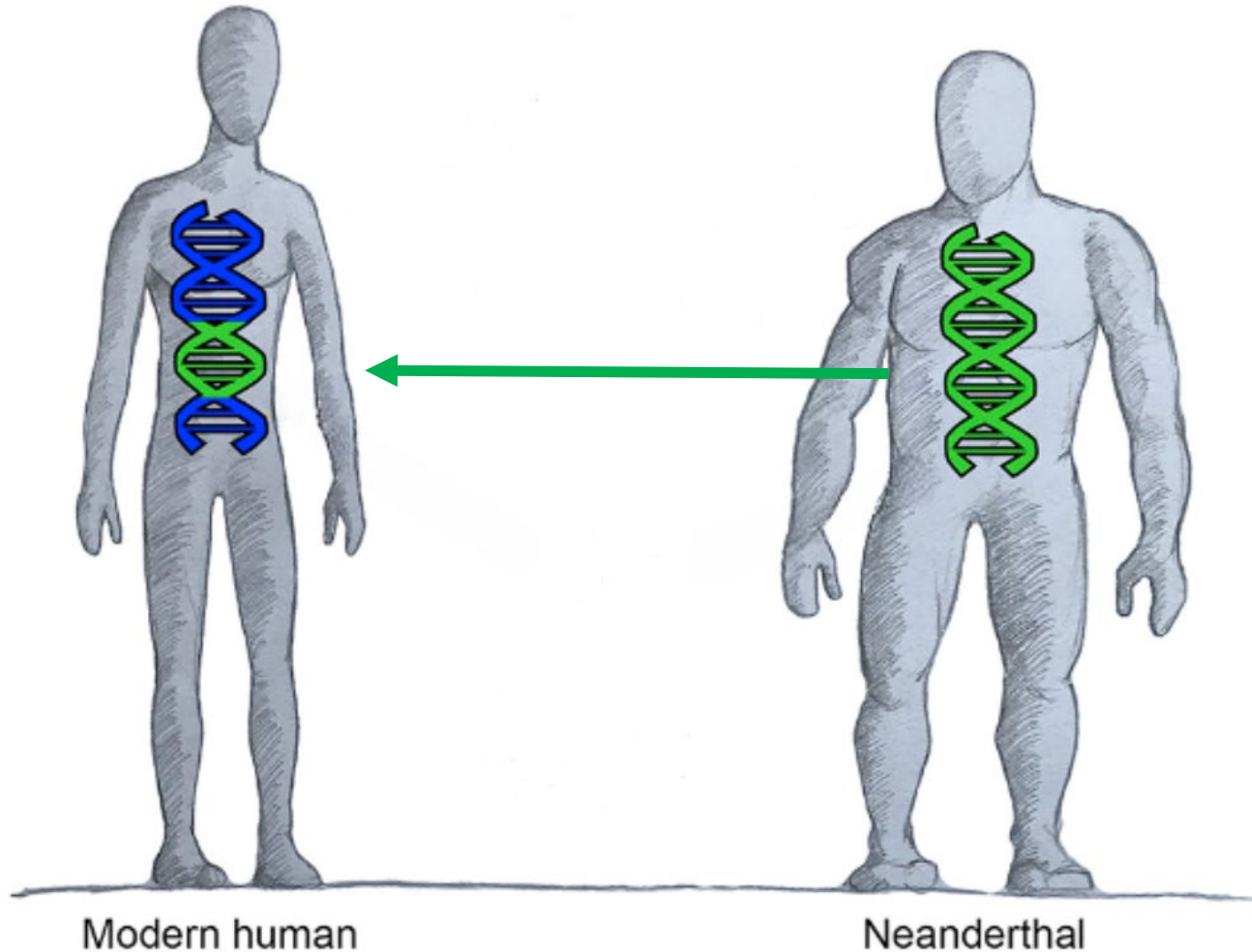
Study the past
if you would define
the future.

Confucius

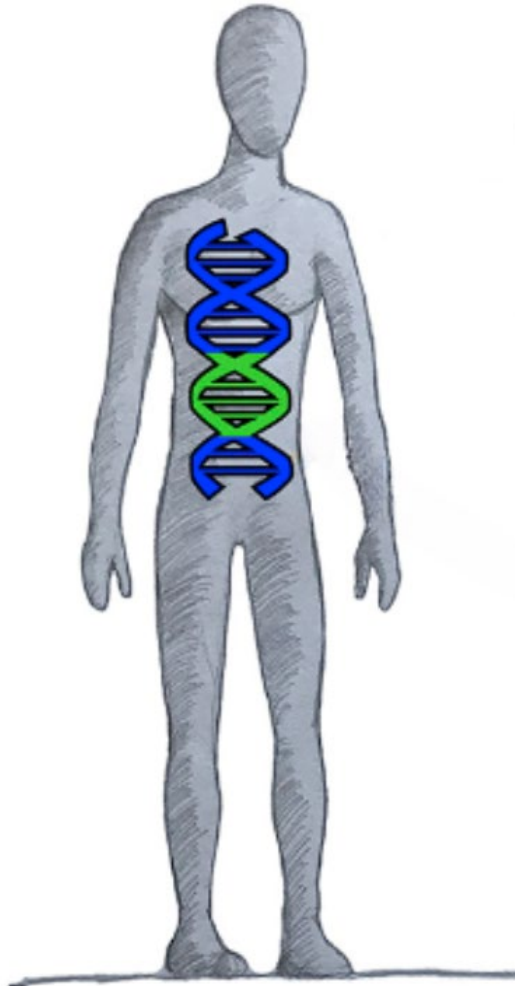


Modern human

Up to 4% of Eurasian descent genomes are of Neanderthals origin



Some Neanderthals-originated variants are associated with disease risk

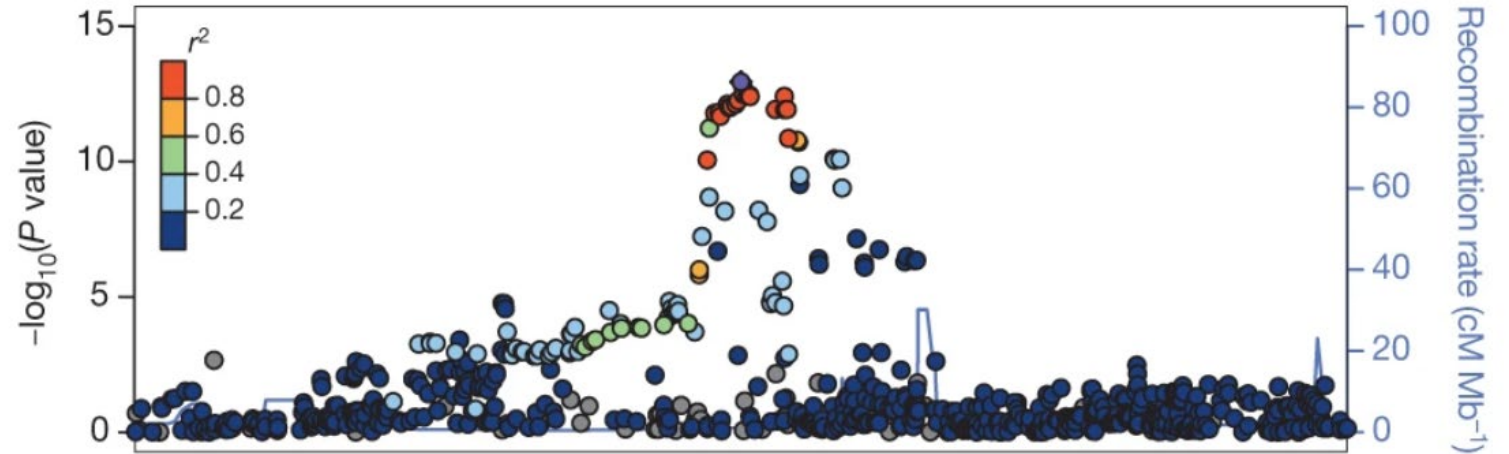


Modern human

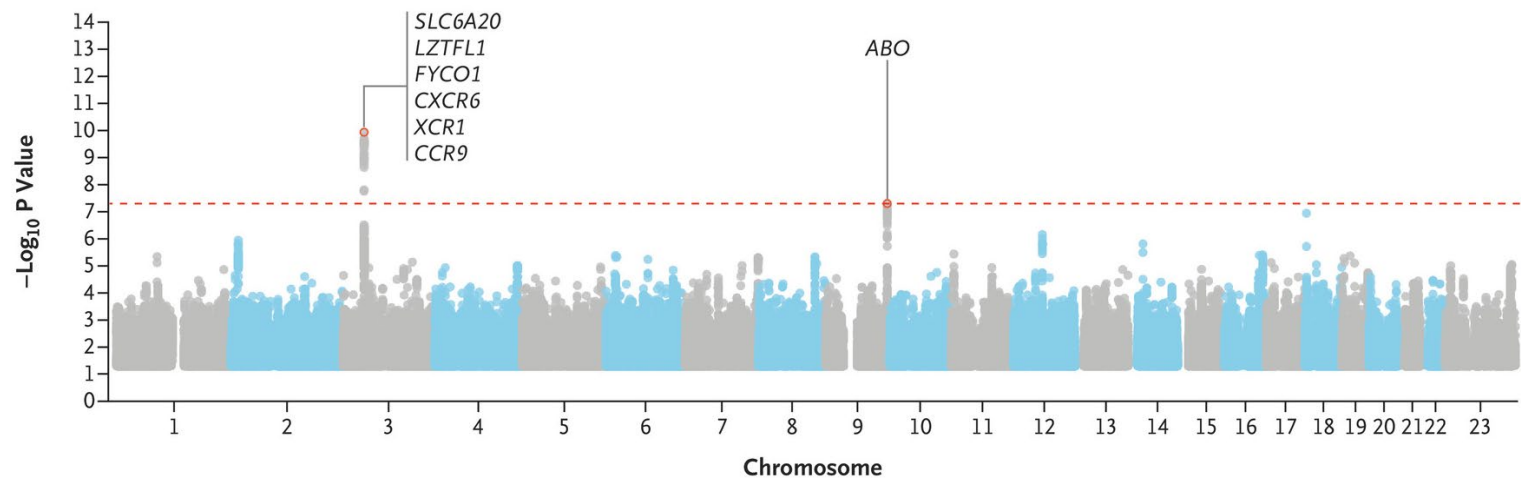
Adapted from Enard & Petrov (2018) Cell

Chromosome 17p13 at *SLC16A11/13* locus

Plotted SNPs

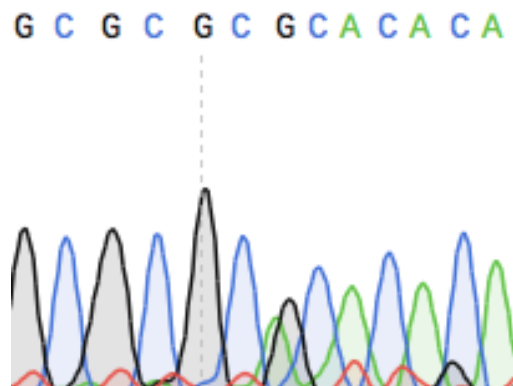
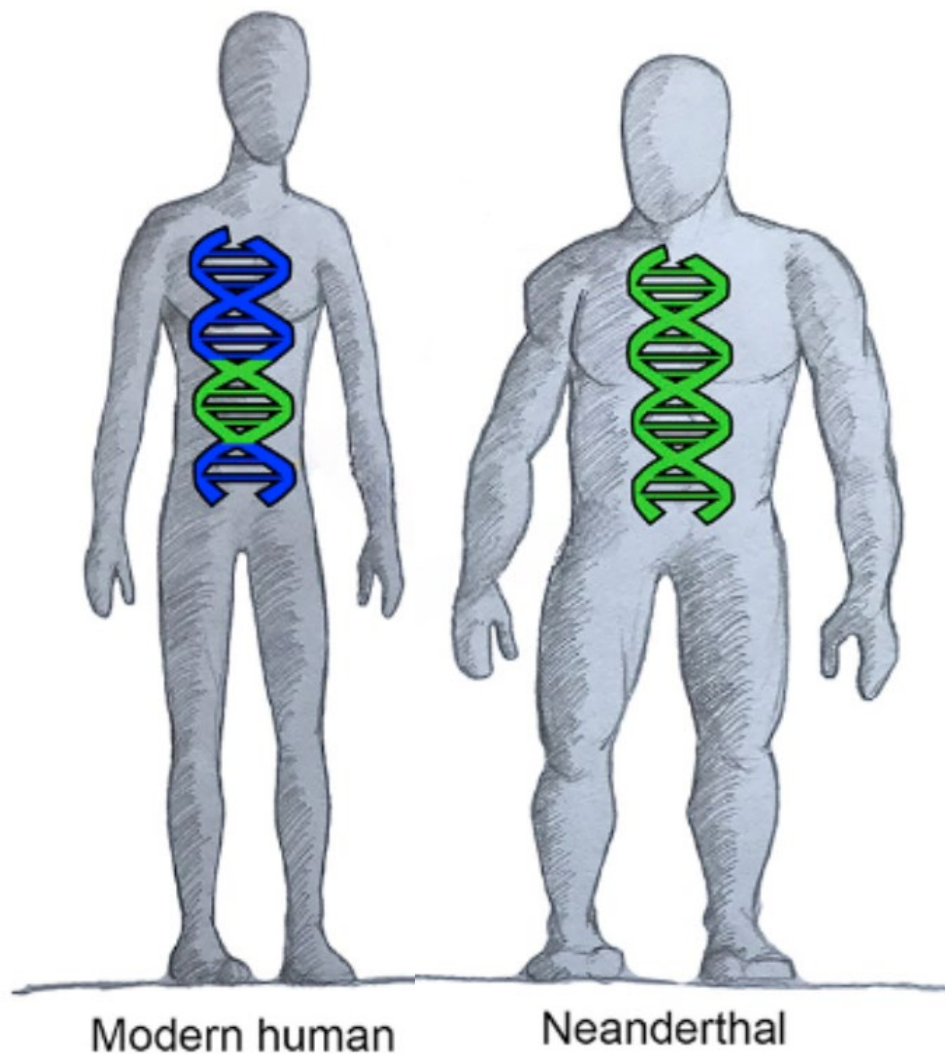


The SIGMA Type 2 Diabetes Consortium (2014) Nature

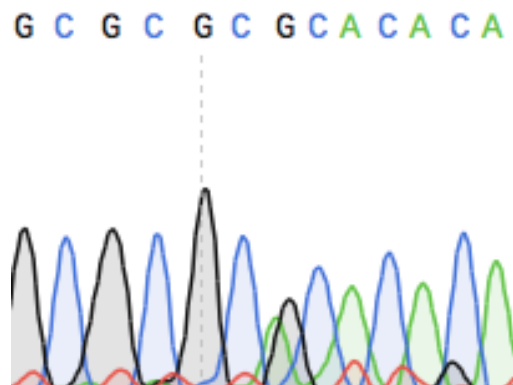
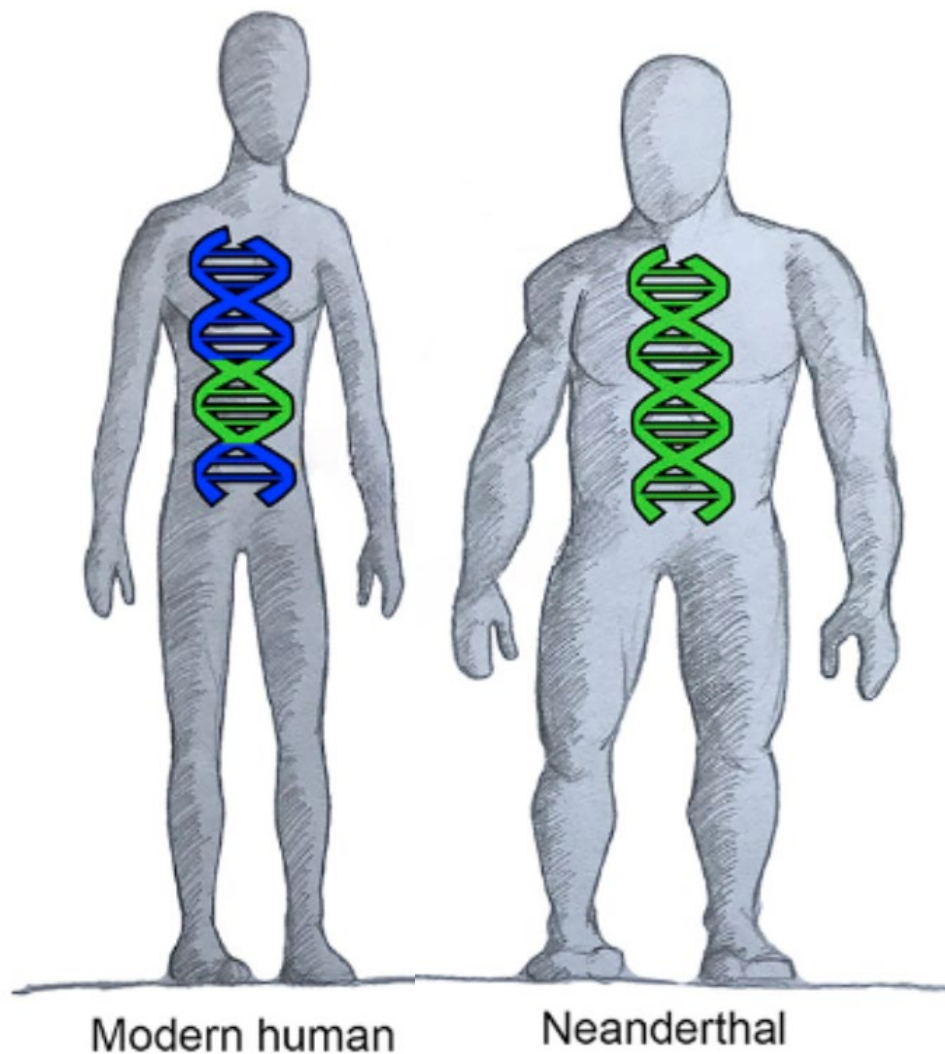


Severe Covid-19 GWAS group (2020) New England J Med

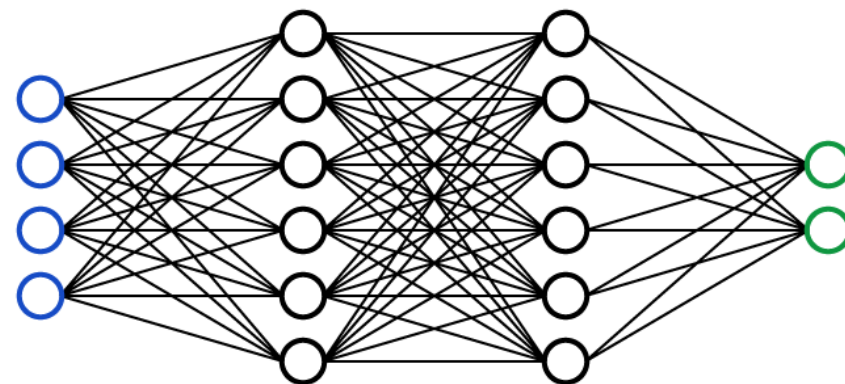
The past, present, and future within our genomes

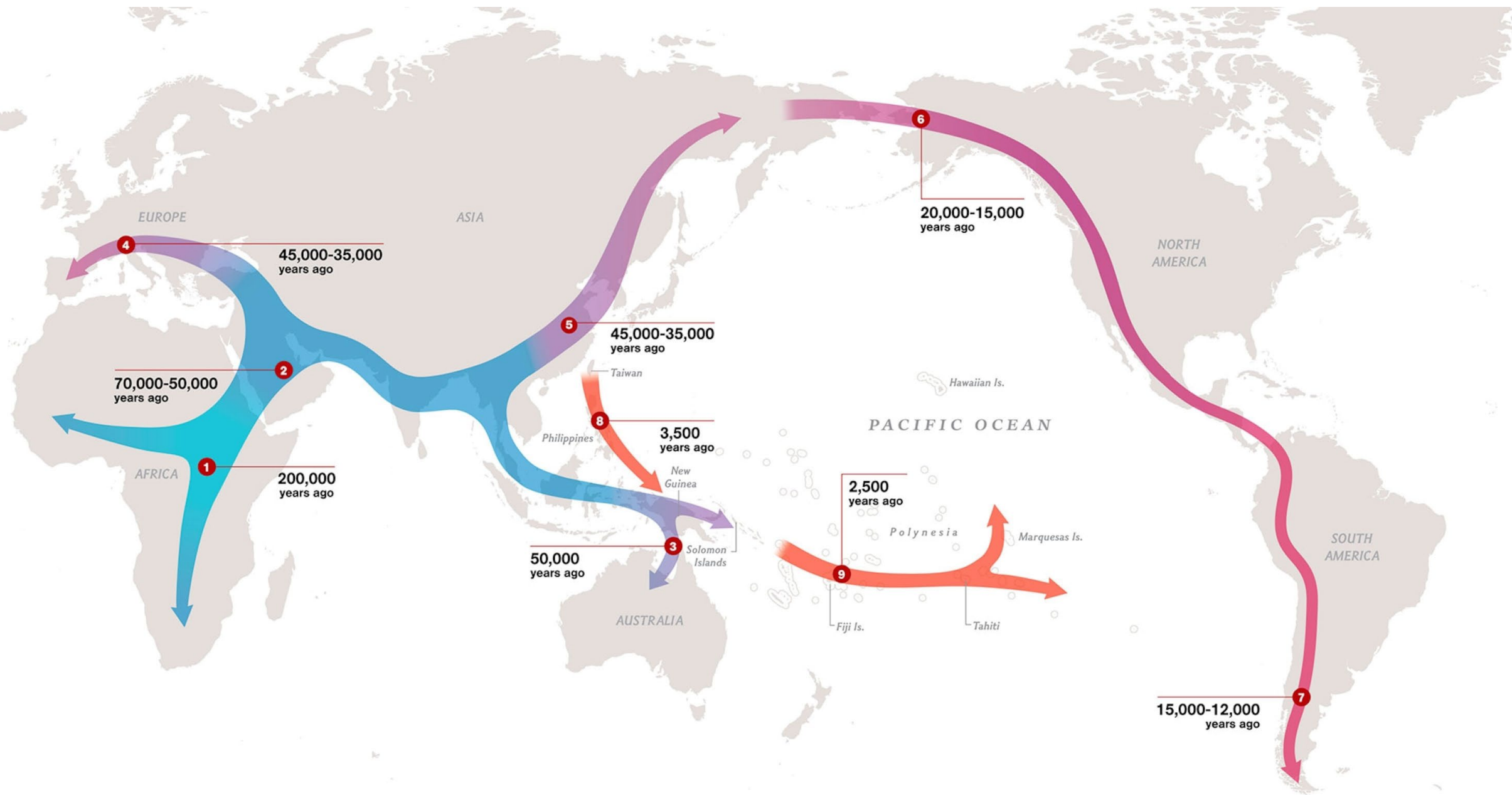


The past, present, and future within our genomes



T	C	T	G	A	T
T	C	T	G	A	T
T	C	T	G	A	T
T	C	T	G	A	C



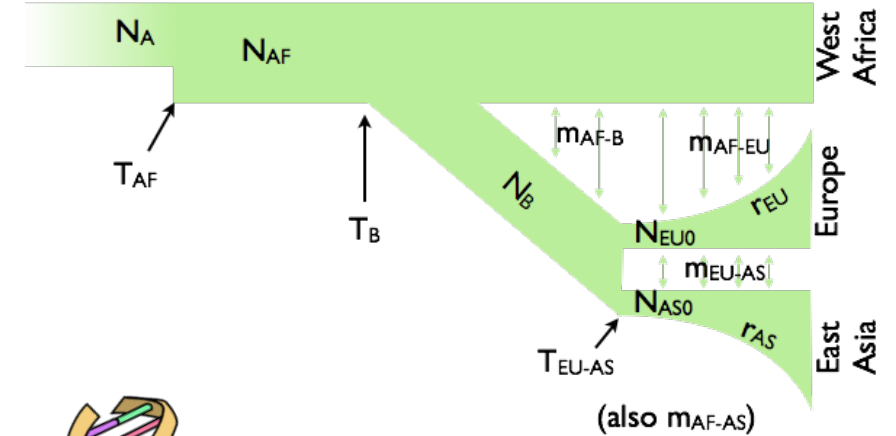


Courtesy: National Geographic

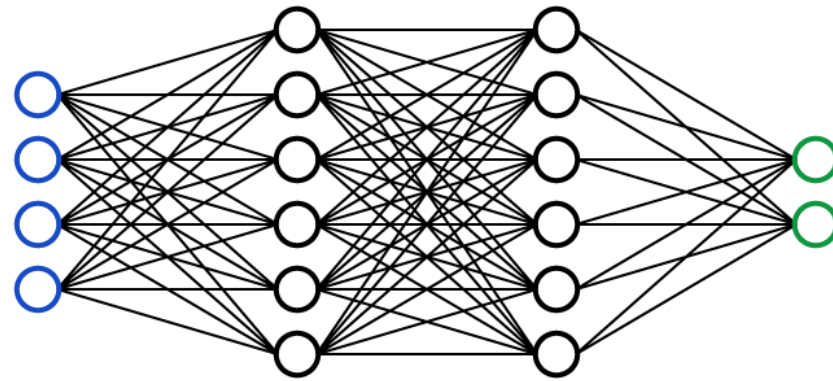
Inferring the Joint Demographic History of Multiple Populations from Multidimensional SNP Frequency Data

Ryan N. Gutenkunst , Ryan D. Hernandez, Scott H. Williamson, Carlos D. Bustamante

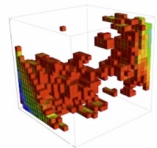
Published: October 23, 2009 • <https://doi.org/10.1371/journal.pgen.1000695>



2009




2020

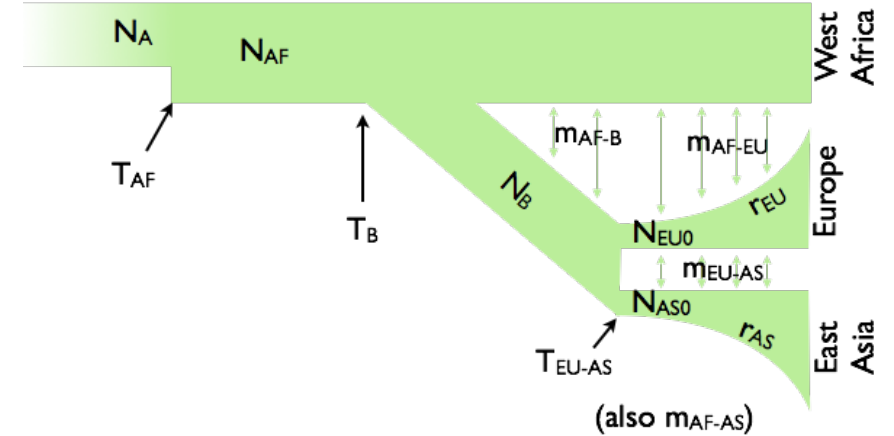


dadi: diffusion approximation
for demographic inference

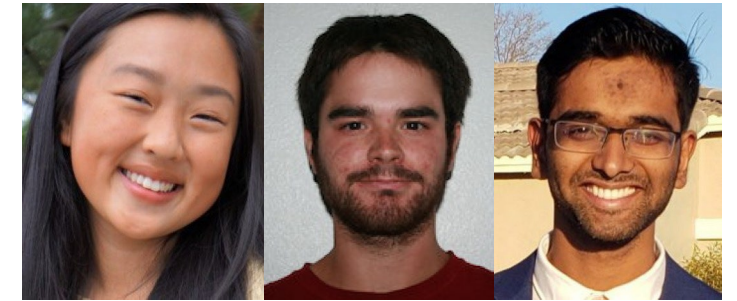
Inferring the Joint Demographic History of Multiple Populations from Multidimensional SNP Frequency Data

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Published: October 23, 2009 • <https://doi.org/10.1371/journal.pgen.1000695>



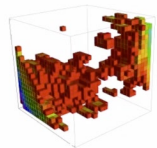
Connie Sun, Travis Struck, Mathews Sajan



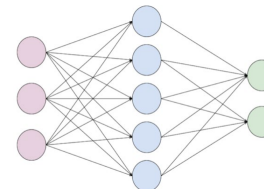
2020



2009




dadi: diffusion approximation for demographic inference



donni: demography optimization via neural network inference
Tran et al. (BioRxiv 2023)

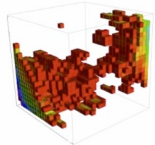
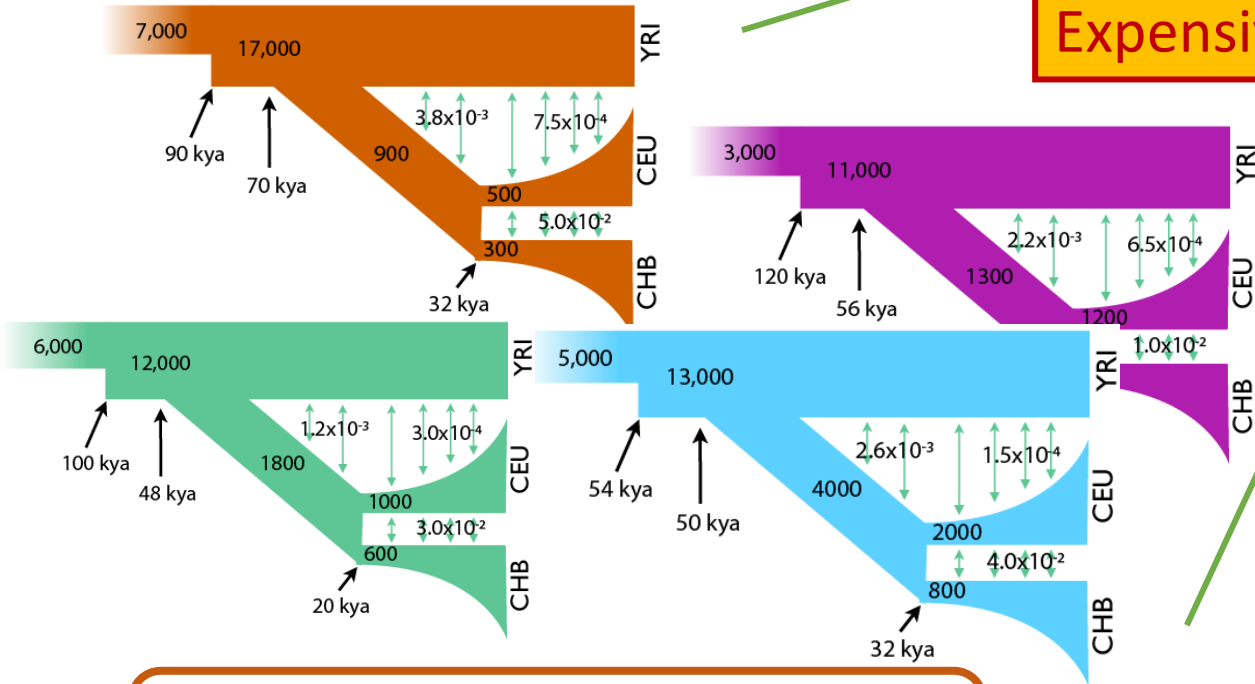
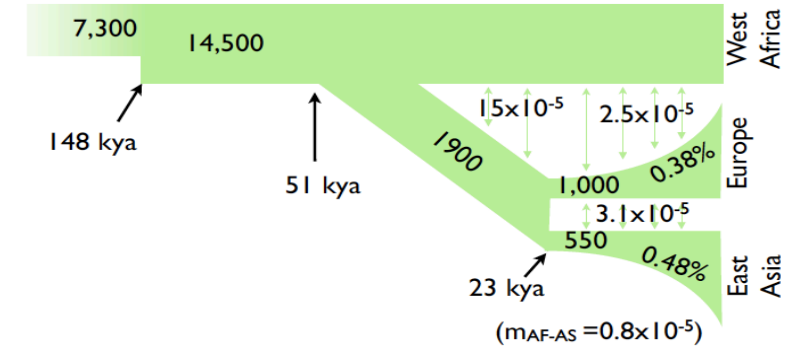
Data (SNP)



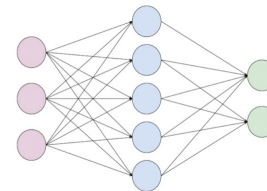
TGGTCACTCTTAT
TGGTCACTCTTAT
TGGTCACTCTTAA
TGCTCATTCTTAT
TGCTCATTCTTAT
TGCTCACTCTTAA

Likelihood
Optimization

Expensive






dadi: diffusion approximation
for demographic inference

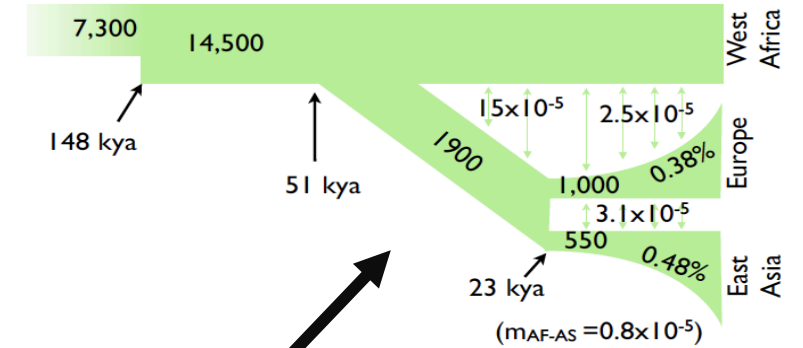


donni: demography optimization via
neural network inference
Tran et al. (BioRxiv 2023)

Data (SNP)

	TGGTCACTCTTAT
	TGGTCACTCTTAT
	TGGTCACTCTTAA
	TGCTCATTCTTAT
	TGCTCATTCTTAT
	TGCTCACTCTTAA

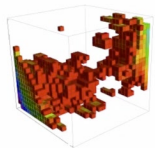
Likelihood
Optimization



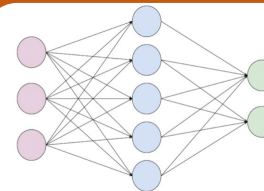
Multilayer
Perceptron
Regressor

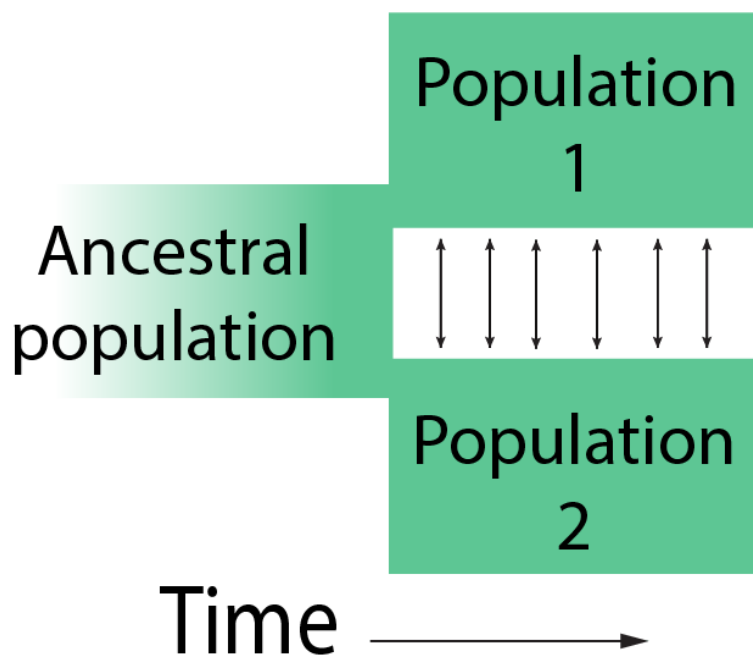
Efficient

dadi: diffusion approximation
for demographic inference



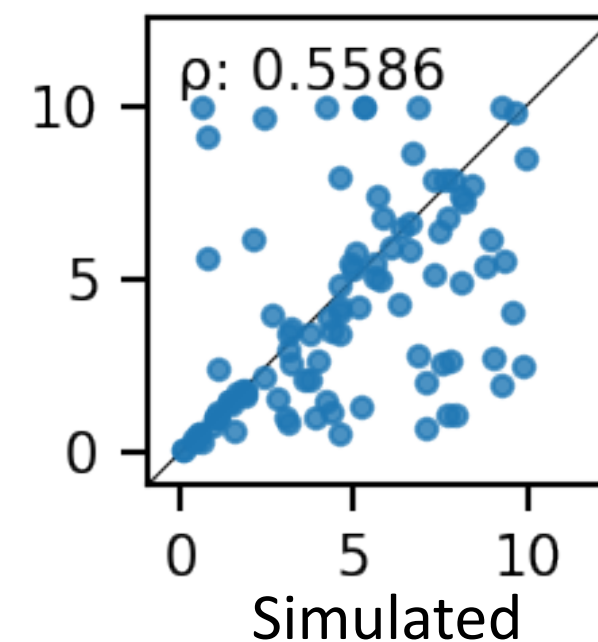
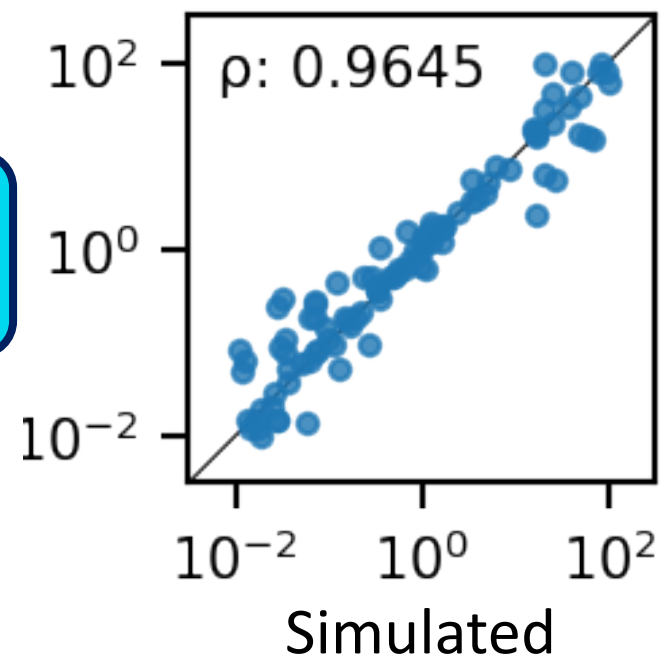
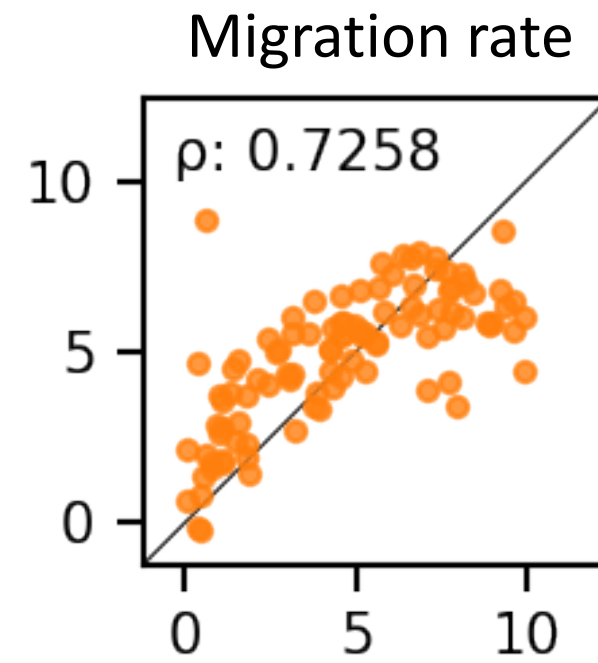
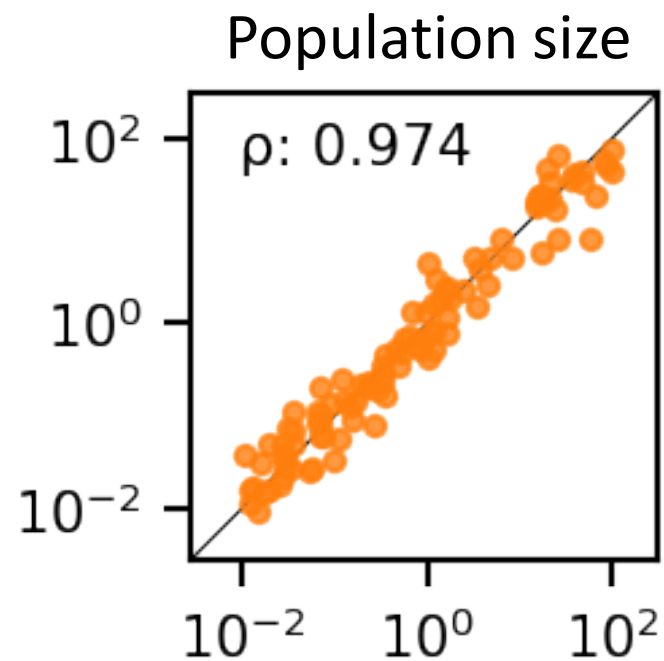
donni: demography optimization via
neural network inference
Tran et al. (BioRxiv 2023)



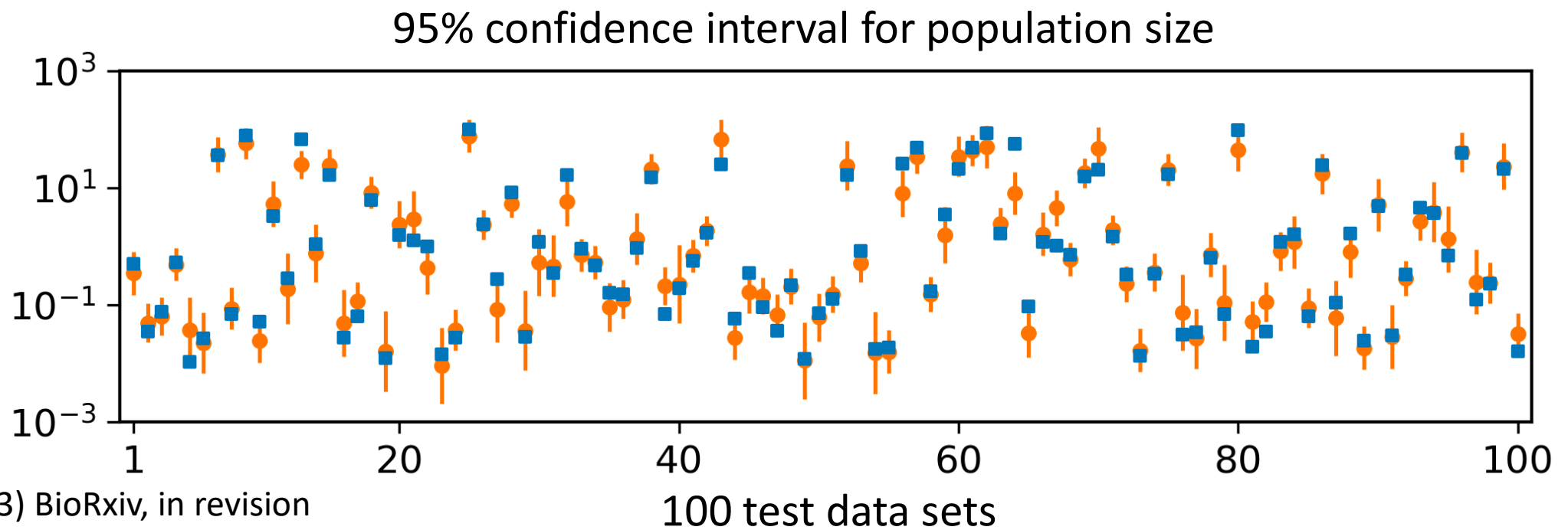
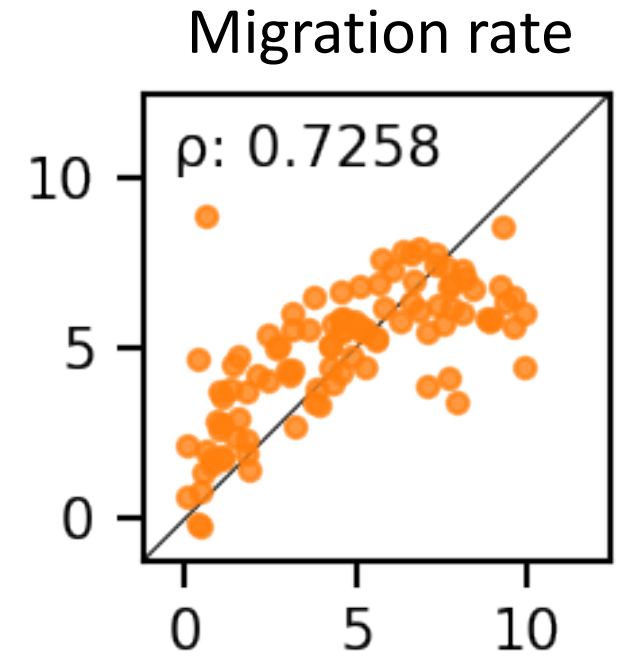
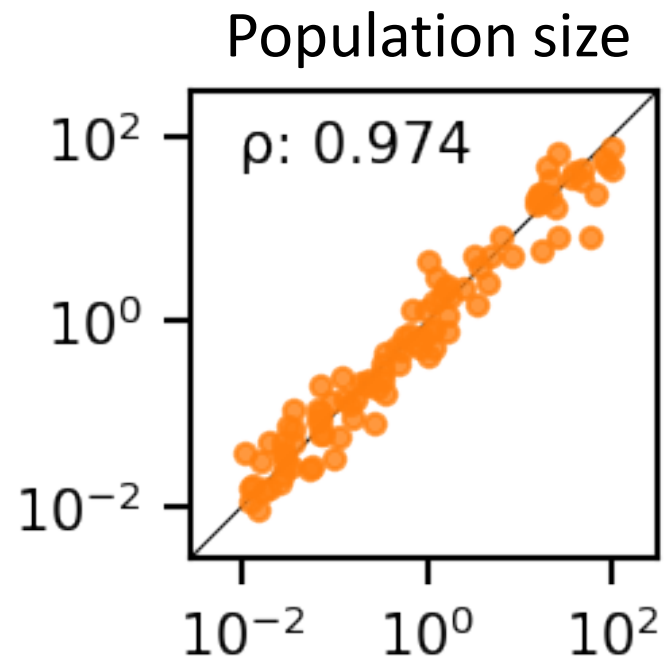


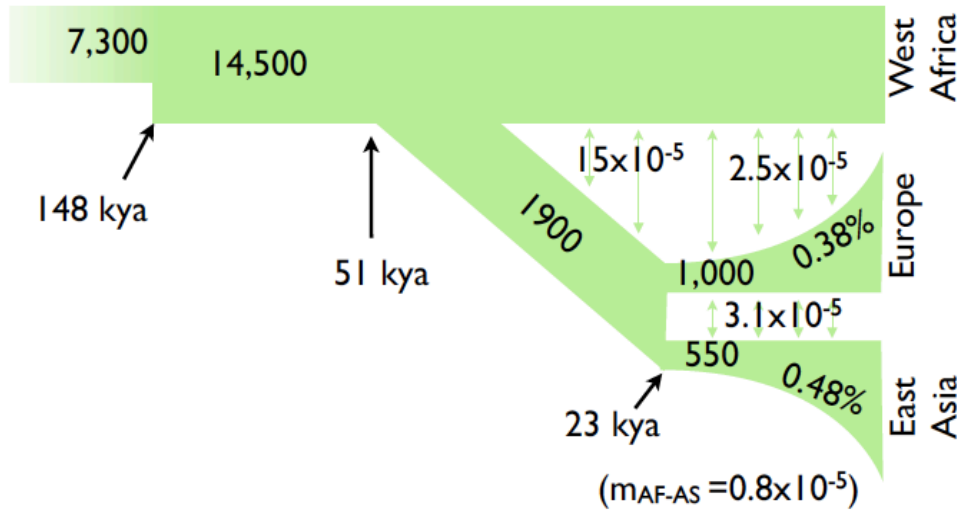
Donni
inferred

Dadi
inferred



Tensorflow Keras
Mean-Variance Estimation Net



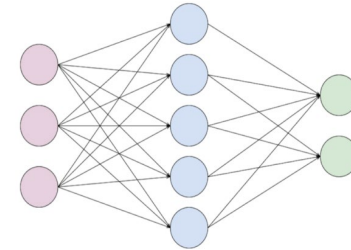


Distribution of fitness effects (DFE)



2020

donni

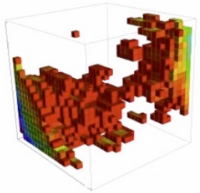


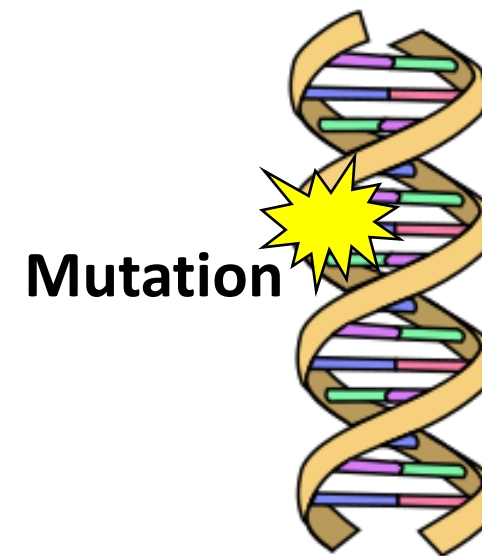
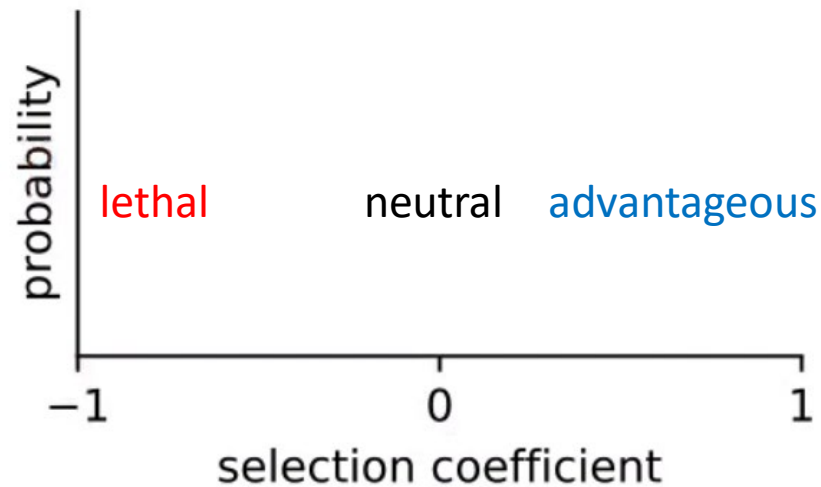
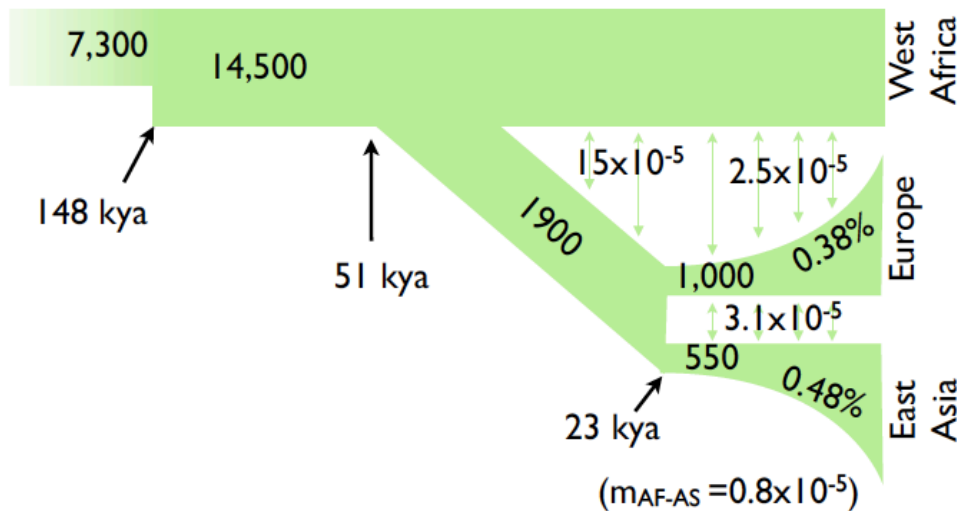
2017

fit-dadi
Kim et al.
(Genetics)

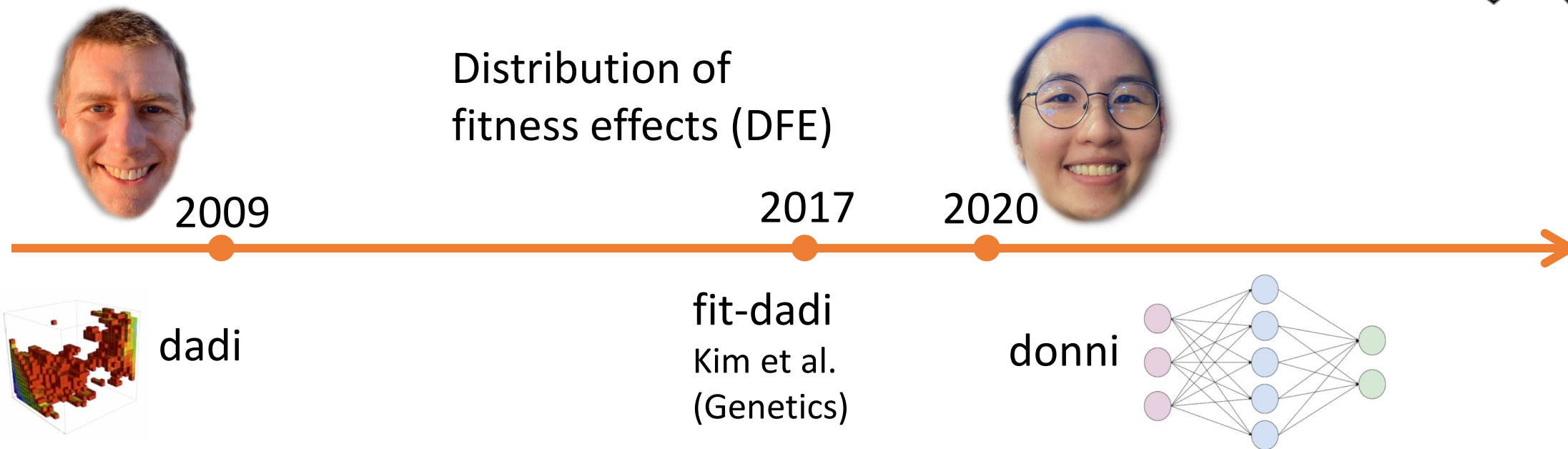
2009

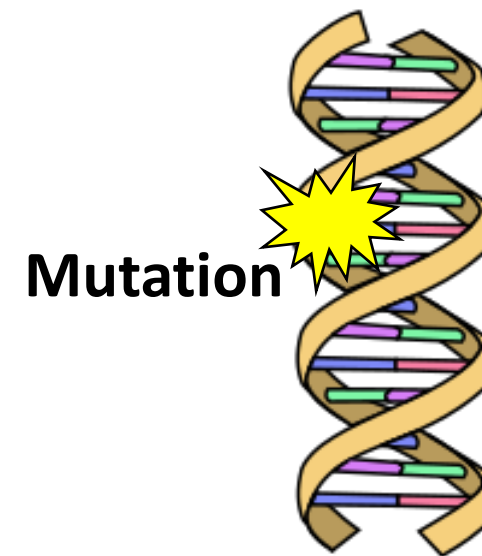
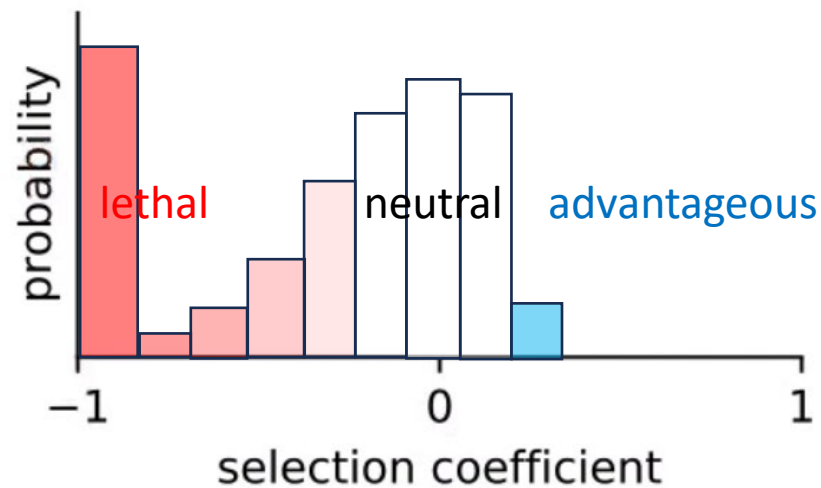
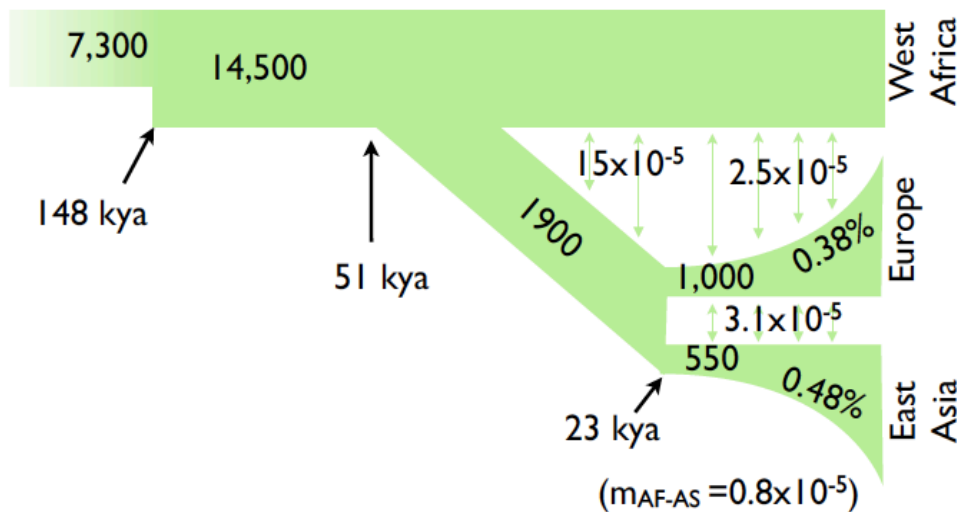
dadi



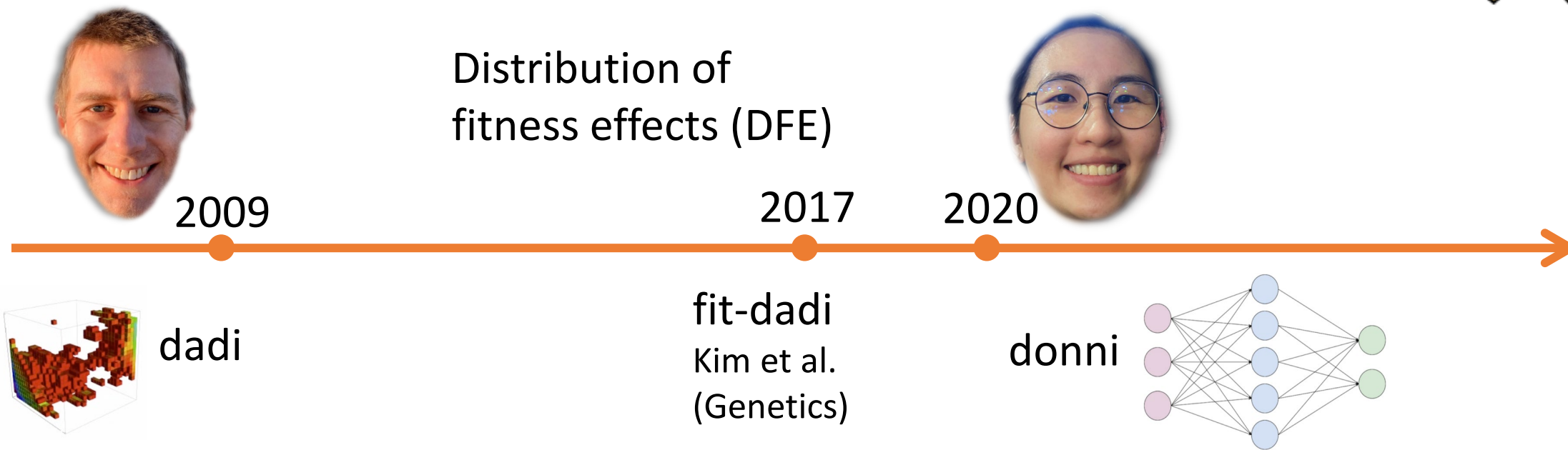


Distribution of fitness effects (DFE)

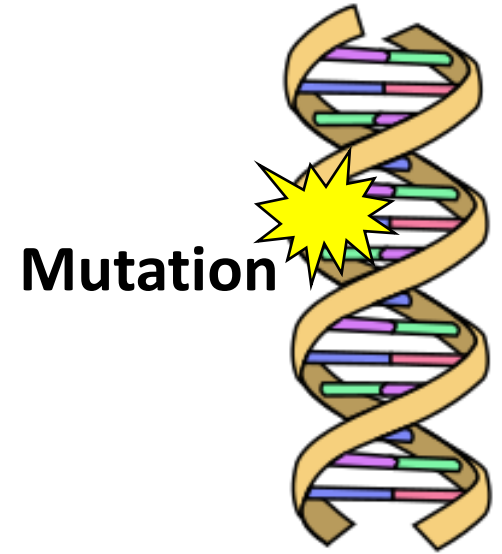
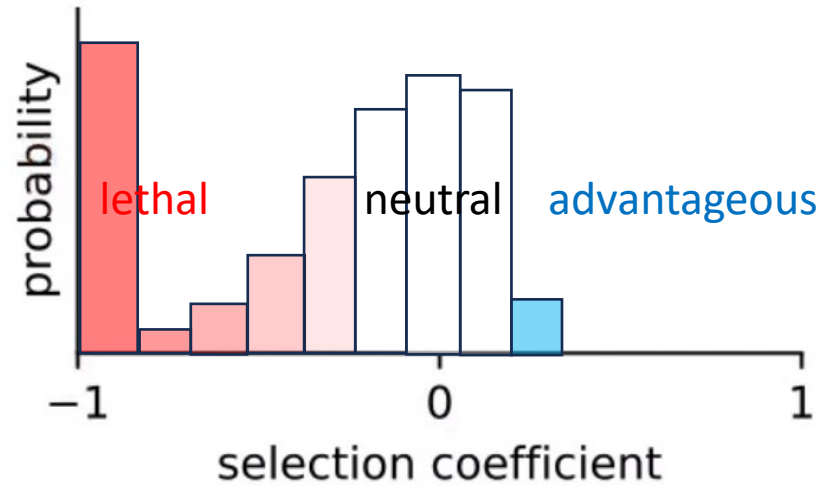




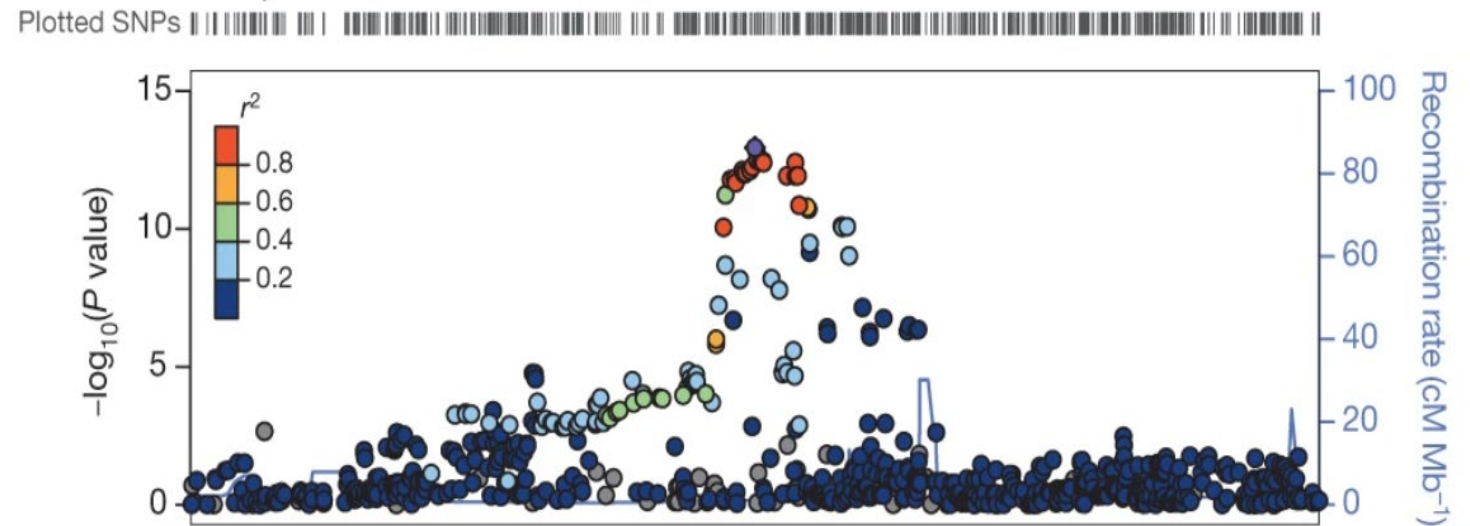
Distribution of fitness effects (DFE)



- Mutations associated with diseases are likely deleterious
- The DFE quantifies the portion of deleterious mutations along with their average affect
- Significant implications for the design and interpretation of GWAS




Chromosome 17p13 at *SLC16A11/13* locus




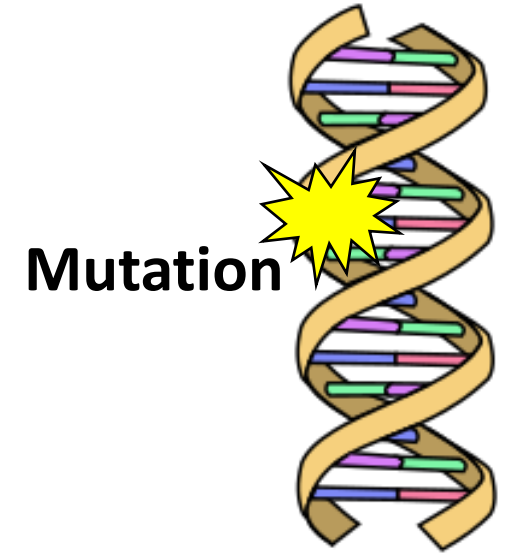
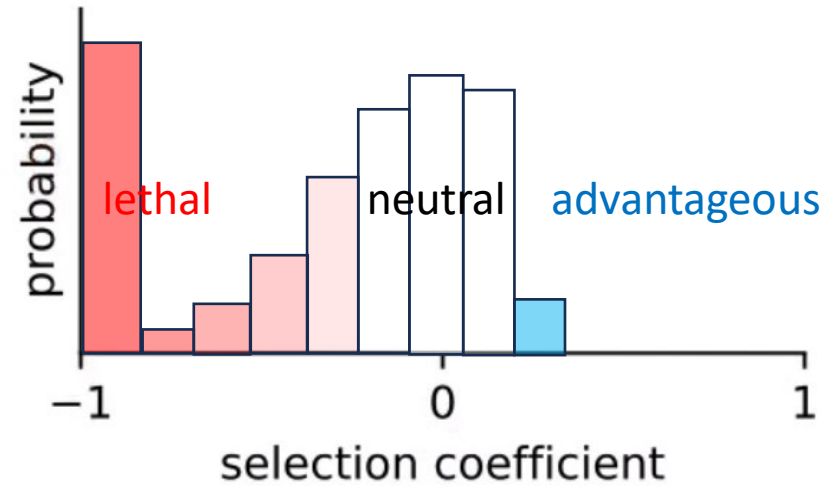
The SIGMA Type 2 Diabetes Consortium (2014) Nature

Data (SNP)

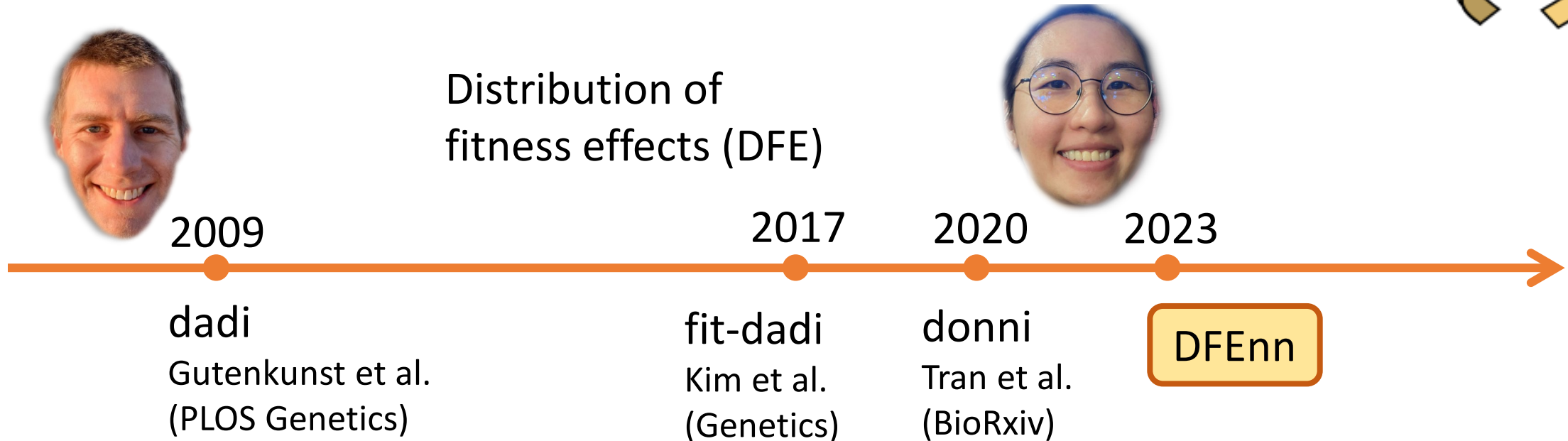
 TGGTCACTCTTAT
TGGTCACTCTTAT

 TGGTCACTCTTAA
TGCTCATTCTTAT



 TGCTCATTCTTAT
TGCTCACTCTTAA



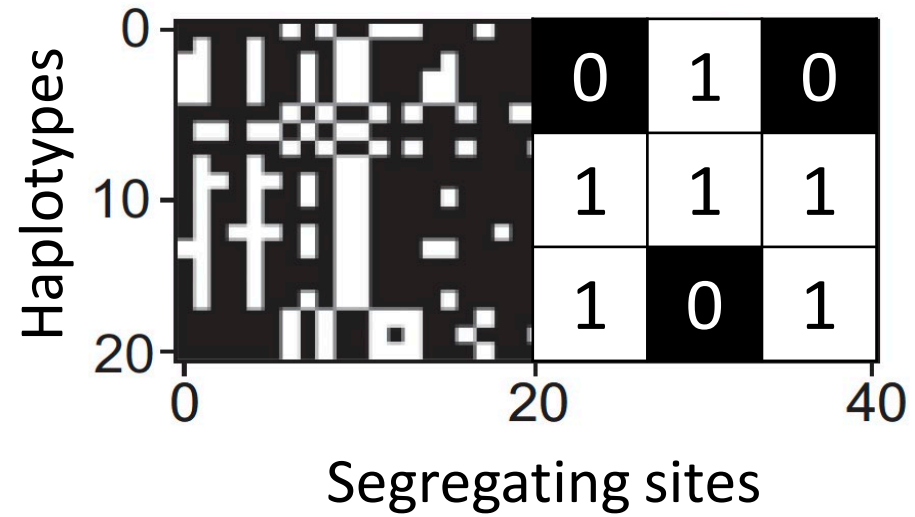
Distribution of fitness effects (DFE)






Data (SNP)

	TGGTCACTCTTAT
	TGGTCACTCTTAT
	TGGTCACTCTTAA
	TGCTCATTCTTAT
	TGCTCATTCTTAT
	TGCTCACTCTTAA

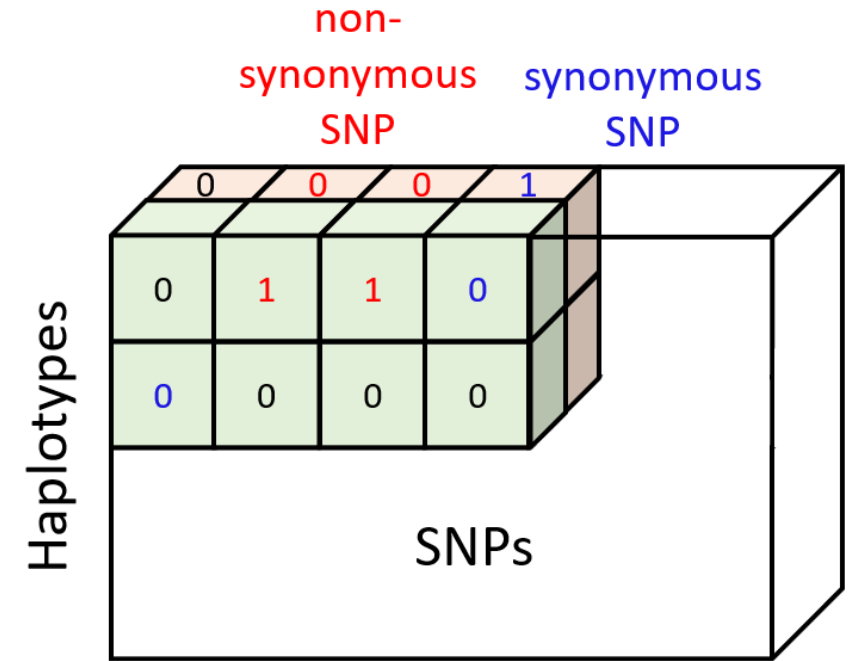
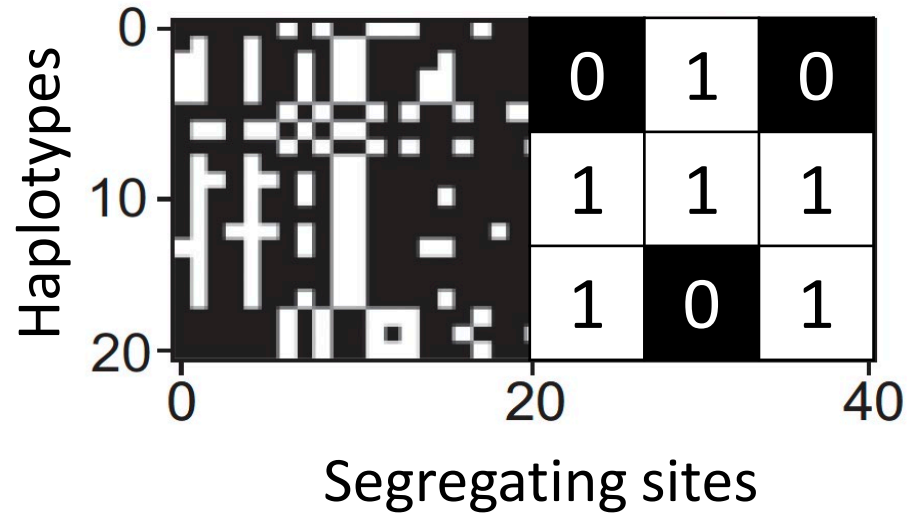
Flagel *et al.* MBE (2018)



Data (SNP)

	TGGTCACTCTTAT
	TGGTCACTCTTAT
	TGGTCACTCTTAA
	TGCTCATTCTTAT
	TGCTCATTCTTAT
	TGCTCACTCTTAA

Flagel *et al.* MBE (2018)



synonymous SNP

non-synonymous SNP

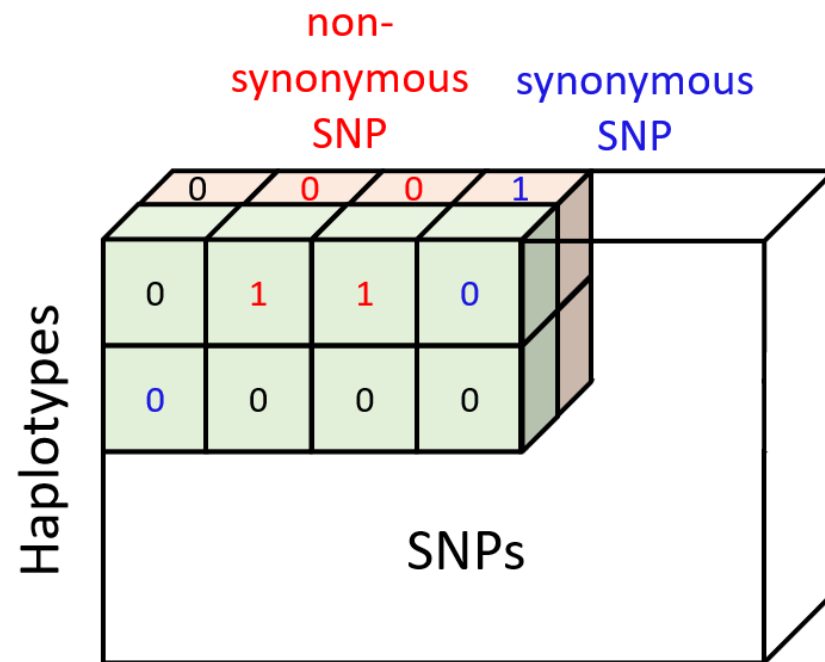
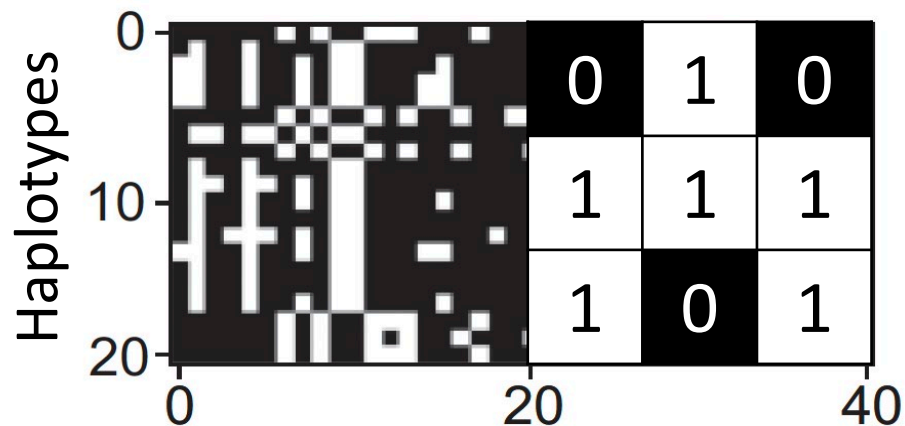




Courtesy: The Wizard of Oz (1939)

Data (SNP)

	TGGTCACTCTTAT
	TGGTCACTCTTAA
	TGCTCATTCTTAT
	TGCTCACTCTTAA

Flagel *et al.* MBE (2018)

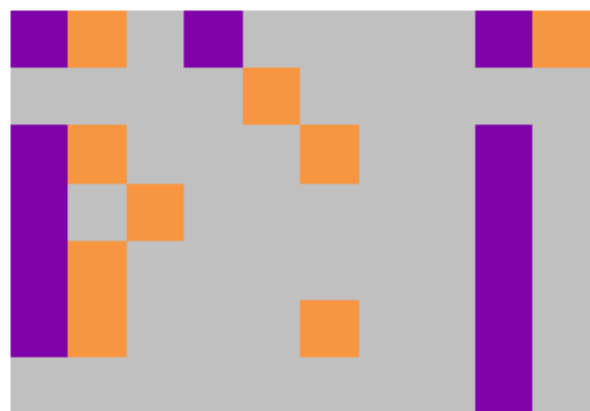


 synonymous SNP
 non-synonymous SNP

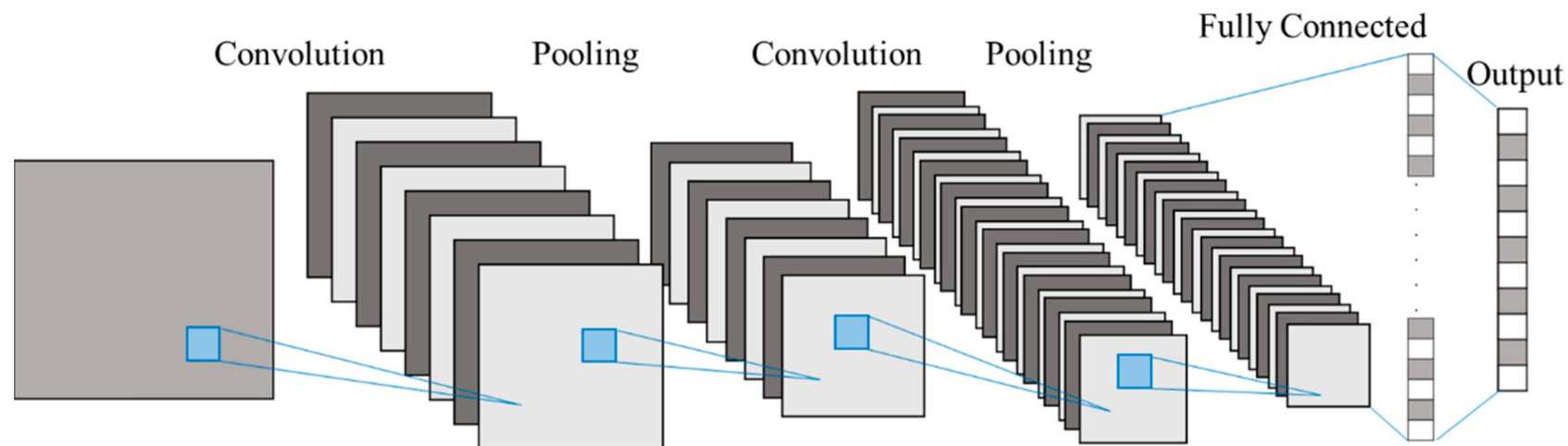
DFEnn

Segregating sites

Haplotypes

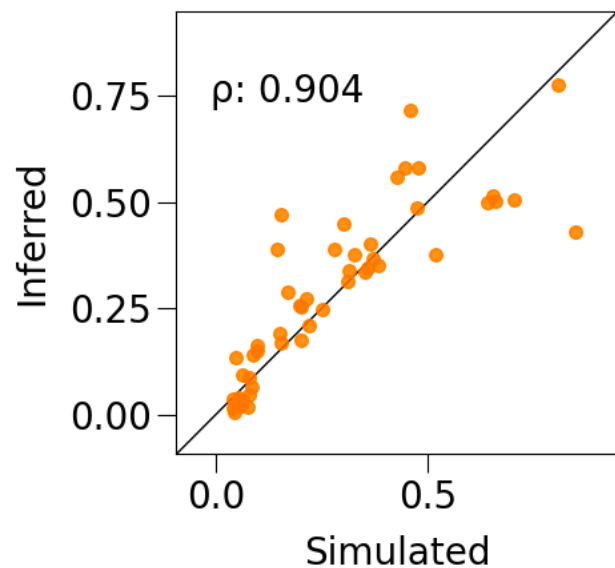


Segregating sites

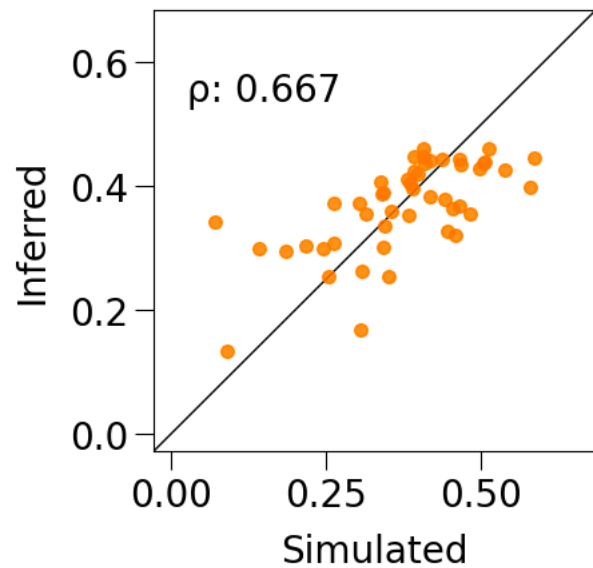


DFEnn

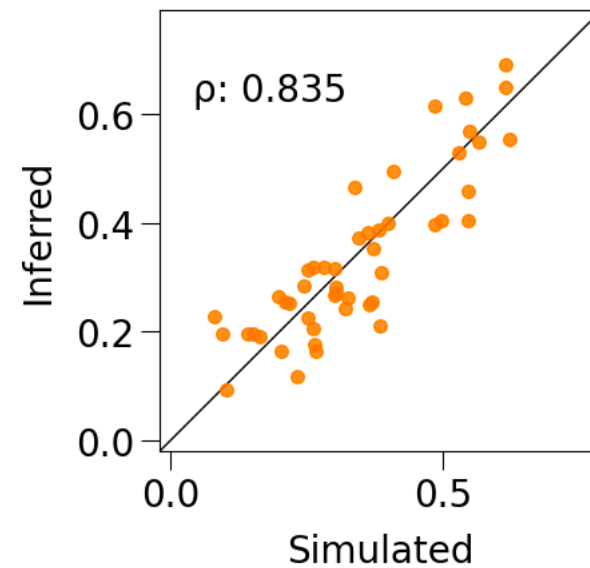
Weakly
deleterious



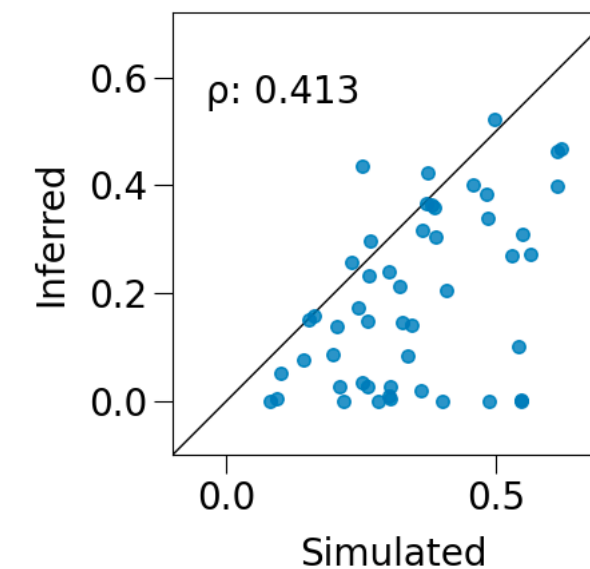
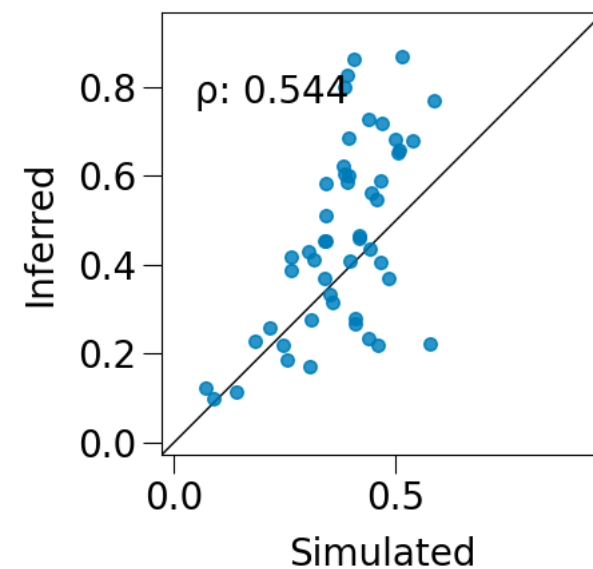
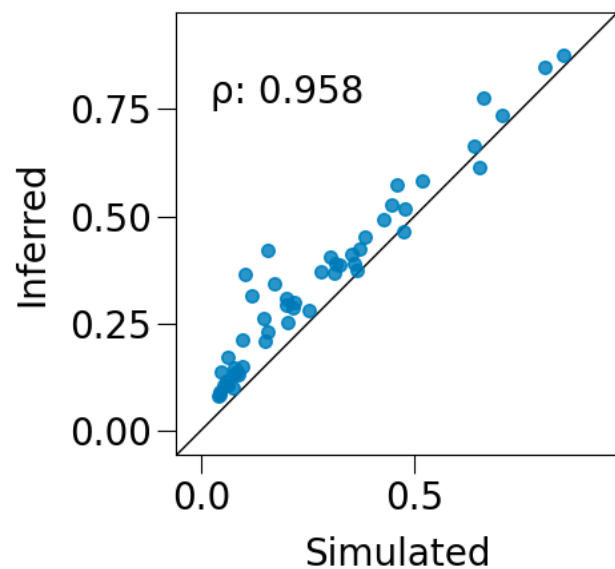
Moderately
deleterious



Strongly
deleterious



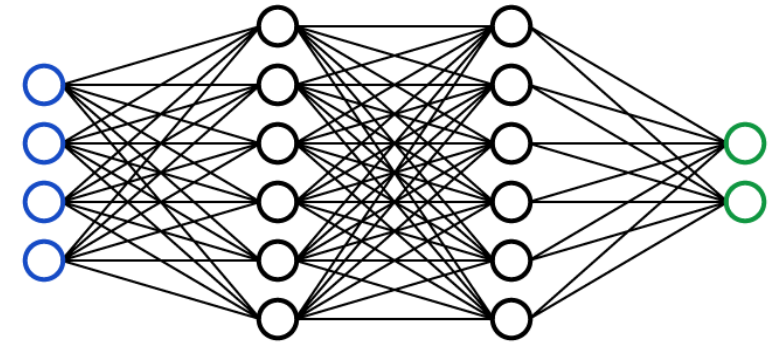
dadi



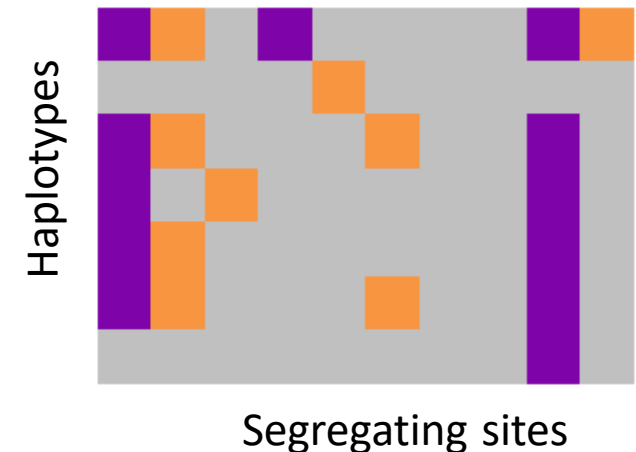
Preliminary results

Summary

T	C	T	G	A	T
T	C	T	G	A	T
T	C	T	G	A	T
T	C	T	G	A	C



- Genomic data contain a wealth of information about our genetic past and disease risk
- Deep neural networks are powerful and effective tools for extracting insights from genomic data
- donni: computationally efficient inference of population history with uncertainty quantification
- DFEnn: informative genomic data representation and processing with convolutional neural network



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