

# Introduction to Advanced Population Genetics

# Learning Objectives

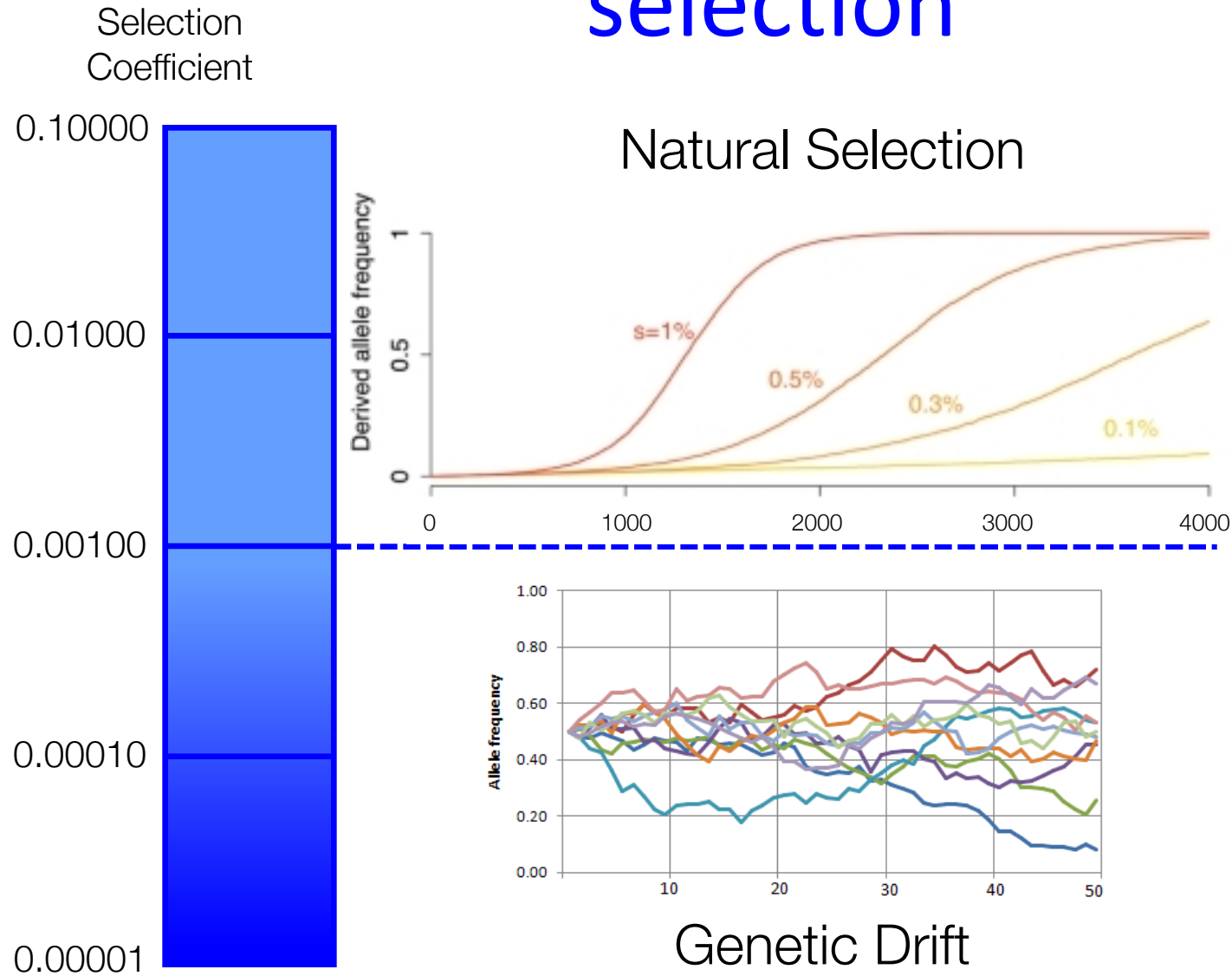
- Describe the basic model of human evolutionary history
- Describe the key evolutionary forces
- How demography can influence the site frequency spectrum
  - Be able to interpret a site frequency spectrum
  - Understand how the SFS is affected by evolutionary forces

## Review: What are the assumptions of Hardy-Weinberg?

- 1) There must be no mutation
- 2) There must be no migration
- 3) Individuals must mate at random with respect to genotype
- 4) There must be no selection
- 5) The population must be infinitely large

**How do these affect allele frequencies?**

# Drift, mutation, migration, and selection

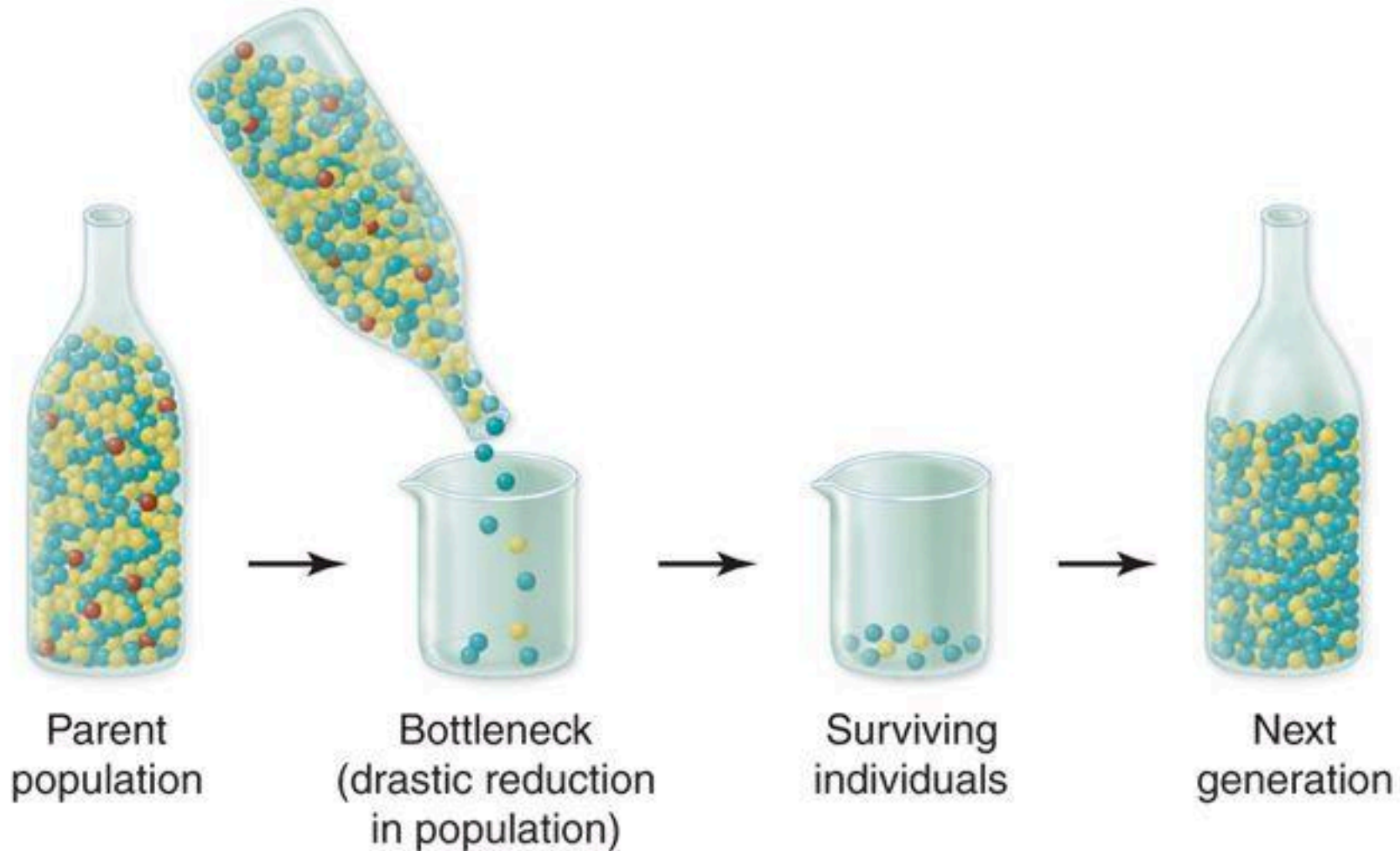


$$\frac{1}{(2N_e)}$$

$N_e = 500$

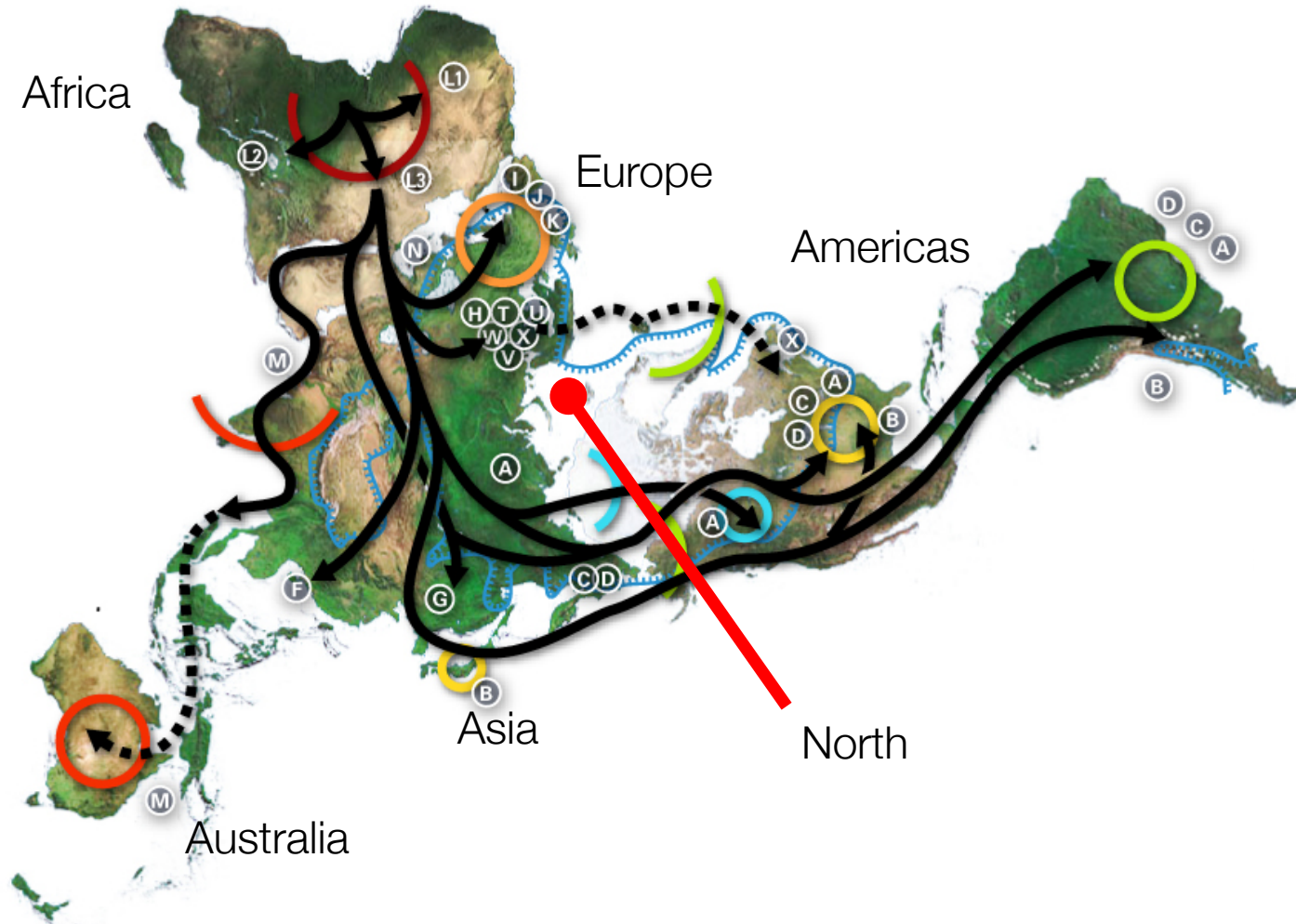


# Genetic drift: Serial founder effect

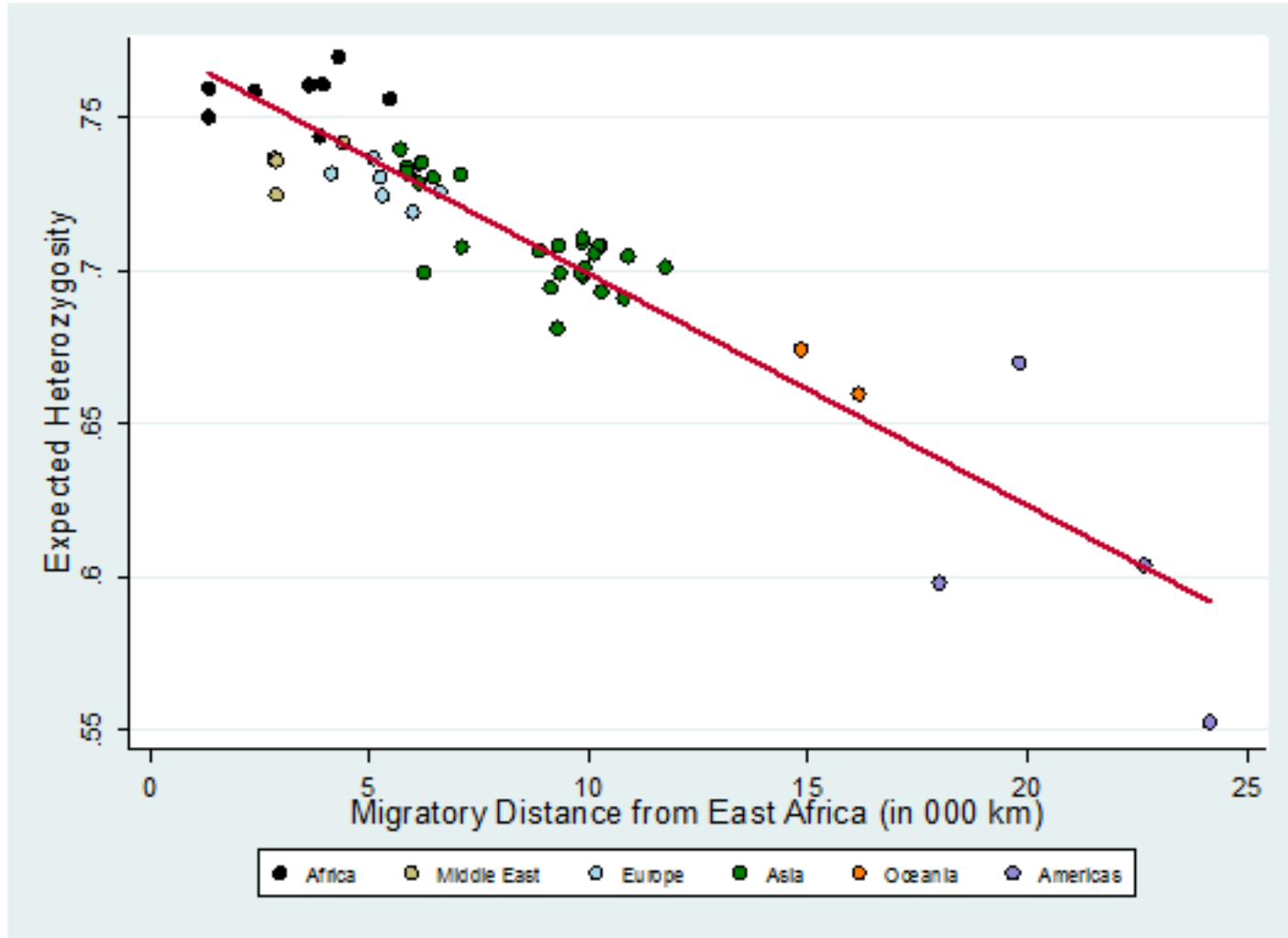


# Out of Africa Model!

We now have an excellent “road map” of how humans evolved in Africa and migrated to populate the rest of the earth.



# Heterozygosity is correlated with distance from East Africa



Ramachandran et al. 2005 PNAS

# Mutation: How often do mutations arise?

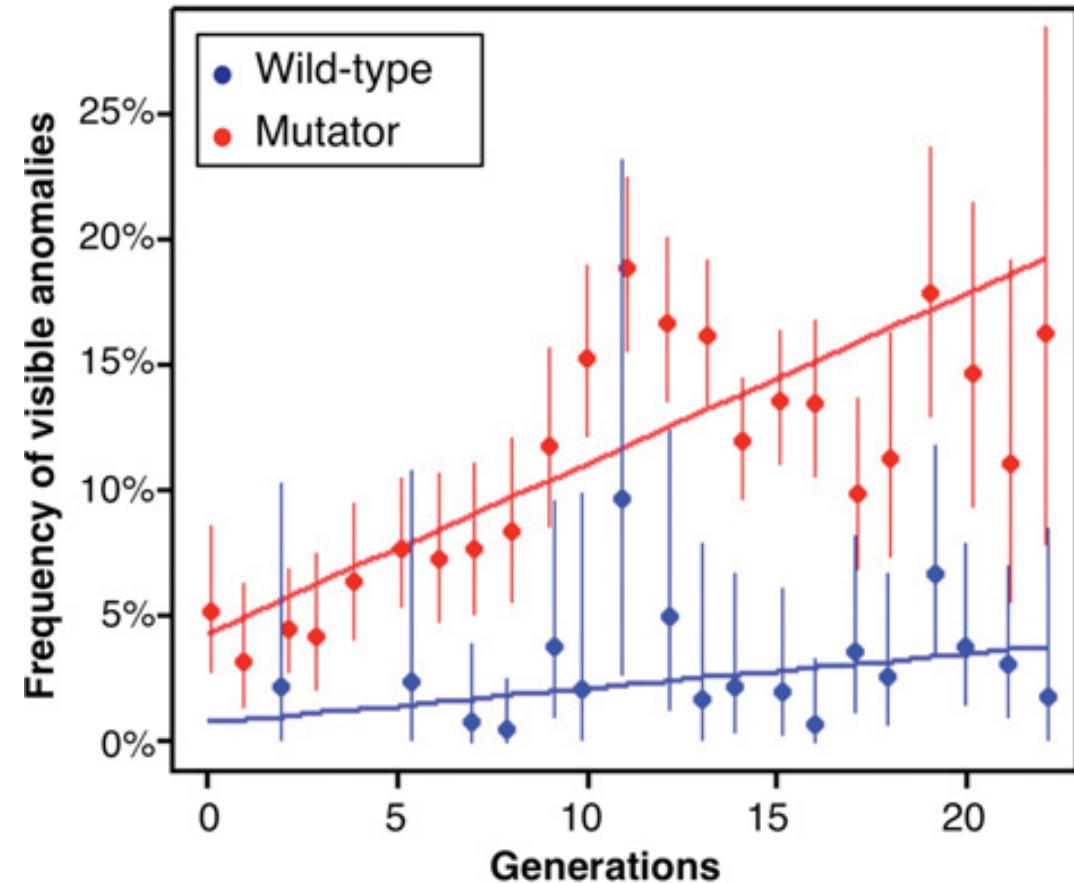
**Table 1.** Estimated per generation mutation rates in mice

	Homozygous		Heterozygous		Final generation Rate ( $\times 10^{-9}$ )	Overall Rate (95% CI)
	No.	Rate ( $\times 10^{-9}$ ) (95% CI)	No.	Rate ( $\times 10^{-9}$ ) (95% CI)		
SNV						
conA	63.3 <sup>a</sup>	3.4 (2.6–4.4) <sup>a</sup>	101.5	5.7 (4.4–7.3)	6.9	$5.4 \times 10^{-9}$ (4.6–6.5, $\times 10^{-9}$ )
conB	117.5 <sup>a</sup>	5.1 (4.3–6.2) <sup>a</sup>	92.7	5.2 (4.0–6.7)	6.8	
mutC	1304	84.3 (76.1–94.5)	1944	110.6 (94.0–132.5)	150	$9.4 \times 10^{-8}$ (9.0–9.8, $\times 10^{-8}$ )
mutD	1472	86.9 (79.1–96.6)	1633	92.3 (78.6–110.5)	90	
Indel						
conA	6.7 <sup>a</sup>	0.57 (0.22–1.20) <sup>a</sup>	4	0.35 (0.10–0.91)	—	$3.1 \times 10^{-10}$ (1.2–6.4, $\times 10^{-10}$ )
conB	4 <sup>a</sup>	0.28 (0.08–0.71) <sup>a</sup>	3	0.26 (0.05–0.77)	—	
mutC	28	2.9 (1.9–4.1)	28	2.5 (1.7–3.6)	—	$2.7 \times 10^{-9}$ (2.2–3.2, $\times 10^{-9}$ )
mutD	21	2.0 (1.2–3.0)	37	3.3 (2.3–4.5)	—	

Mutation rates per nucleotide per generation were estimated using the number of homozygous or heterozygous de novo mutations in conA, conB, mutC, and mutD. The estimates for SNVs were validated by counting newly arisen mutations in the final generation. The number of de novo mutations in conA and conB was partly adjusted for the frequency of true de novo variants; 95% confidence intervals (CI) were calculated by computer simulation or Poisson distribution error analysis of the number of mutations (details in Supplemental Methods).

<sup>a</sup>Note that homozygous variant numbers in control lines were uncertain due to the low ability to discriminate between de novo and initial variants; these values were not used in the estimates for the overall rate.

# Mutation is a major source of phenotypic variation

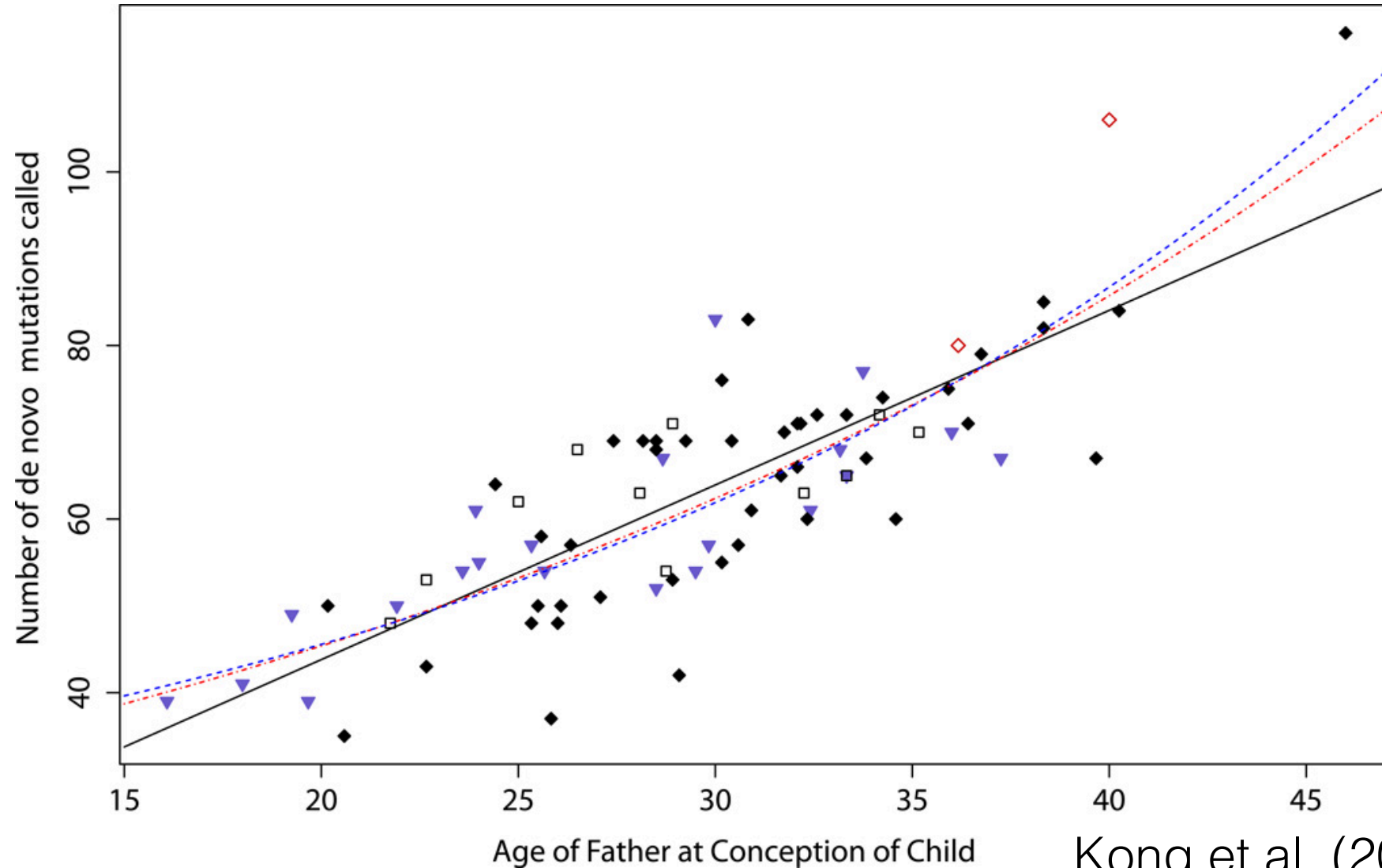


**Figure 2.** Frequency of visible phenotypic anomalies in breeding lines. Frequency of visible anomalies in each successive generation. Circles indicate observed frequencies with 90% CI, determined by Fisher's exact test. Since fewer than 20 mice were screened in the early-generation (fewer than seven generations) populations of control mice, mean phenotypic frequencies are shown for generations 0–3 and 4–6. Solid lines show the fit with a binomial linear model.

# Mutation: How often do mutations arise in Humans?

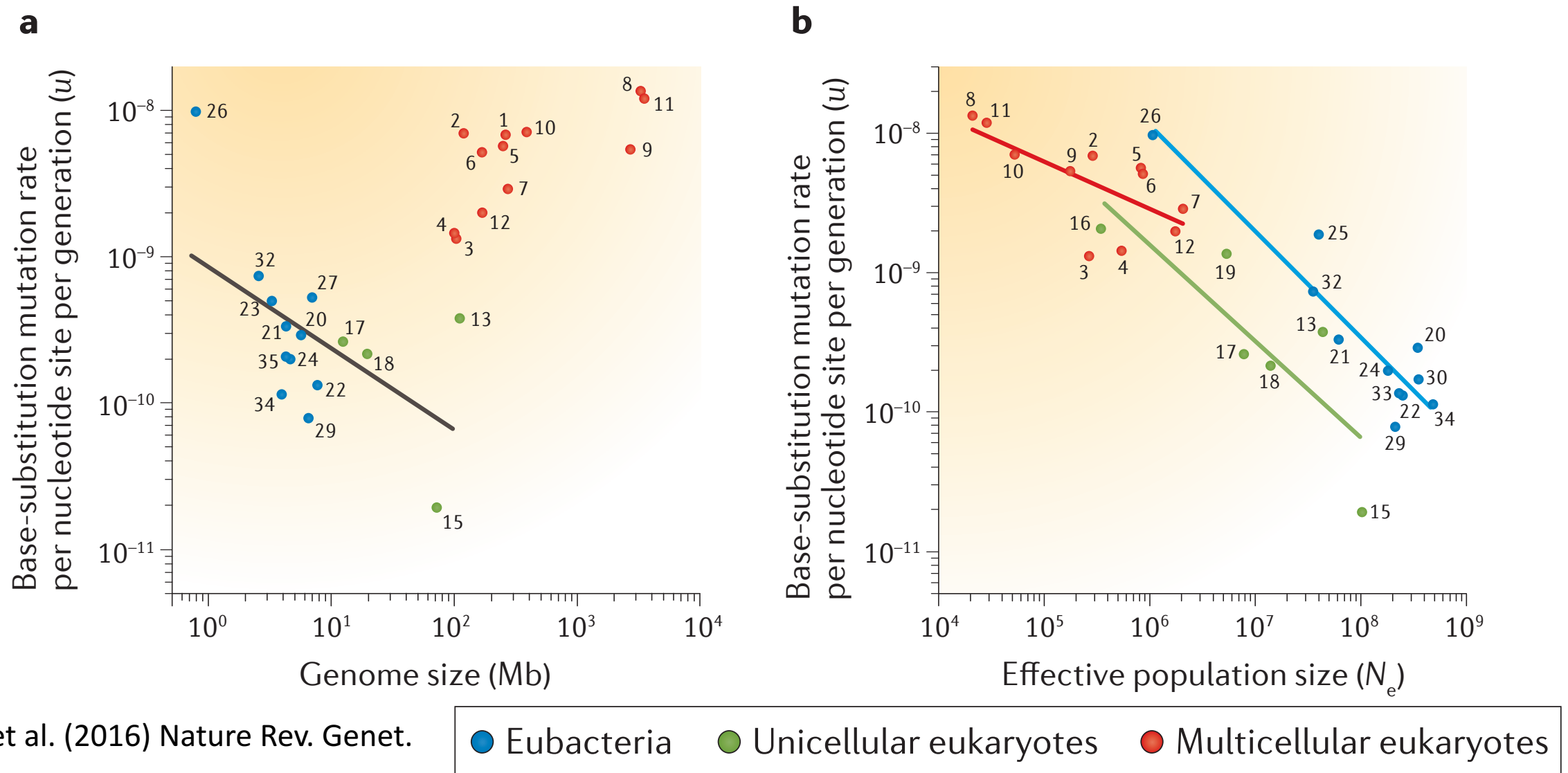
study	loci considered	per-generation mean mutation rate ( $10^{-8}$ bp <sup>-1</sup> generation <sup>-1</sup> )	yearly mean mutation rate ( $10^{-9}$ bp <sup>-1</sup> y <sup>-1</sup> )	
			t <sub>gen</sub> = 30 y	t <sub>gen</sub> = 25 y
Kondrashov (2003)	disease	1.85 (0.00–3.65)	0.62 (0.00–1.22)	0.74 (0.00–1.46)
Lynch (2010)	disease	1.28 (0.68–1.88)	0.42 (0.23–0.63)	0.51 (0.27–0.75)
Roach <i>et al.</i> (2010)	WG	1.10 (0.68–1.70)	0.37 (0.23–0.57)	0.44 (0.27–0.68)
Awadalla <i>et al.</i> (2010)	WG	1.36 (0.34–2.72)	0.45 (0.11–0.91)	0.54 (0.14–1.09)
1000 Genomes Project (2010), CEU	WG	1.17 (0.94–1.73)	0.39 (0.31–0.57)	0.47 (0.38–0.69)
1000 Genomes Project (2010), YRI	WG	0.97 (0.72–1.44)	0.32 (0.24–0.48)	0.39 (0.29–0.58)
Sanders <i>et al.</i> (2012)	exome	1.28 (1.05–1.50)	0.43 (0.35–0.50)	0.51 (0.42–0.60)
O’Roak <i>et al.</i> (2012)	exome	1.57 (1.05–2.26)	0.52 (0.35–0.75)	0.63 (0.42–0.90)
Kong <i>et al.</i> (2012)	WG	1.20	0.40	0.48

# What are the effects of paternal age on mutation rate?



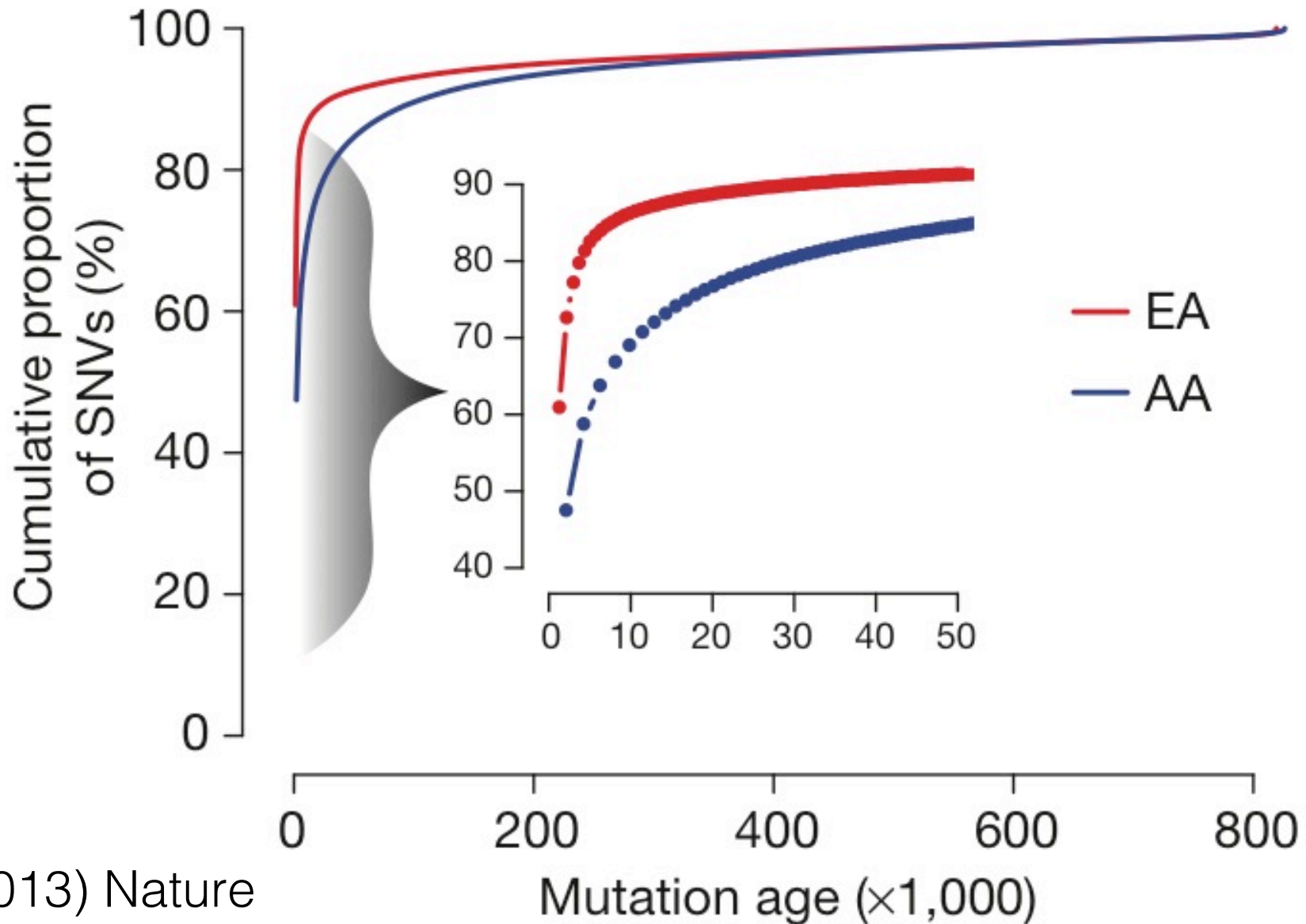
Kong et al. (2012) Nature

# Evolutionary time effects on the mutation rate

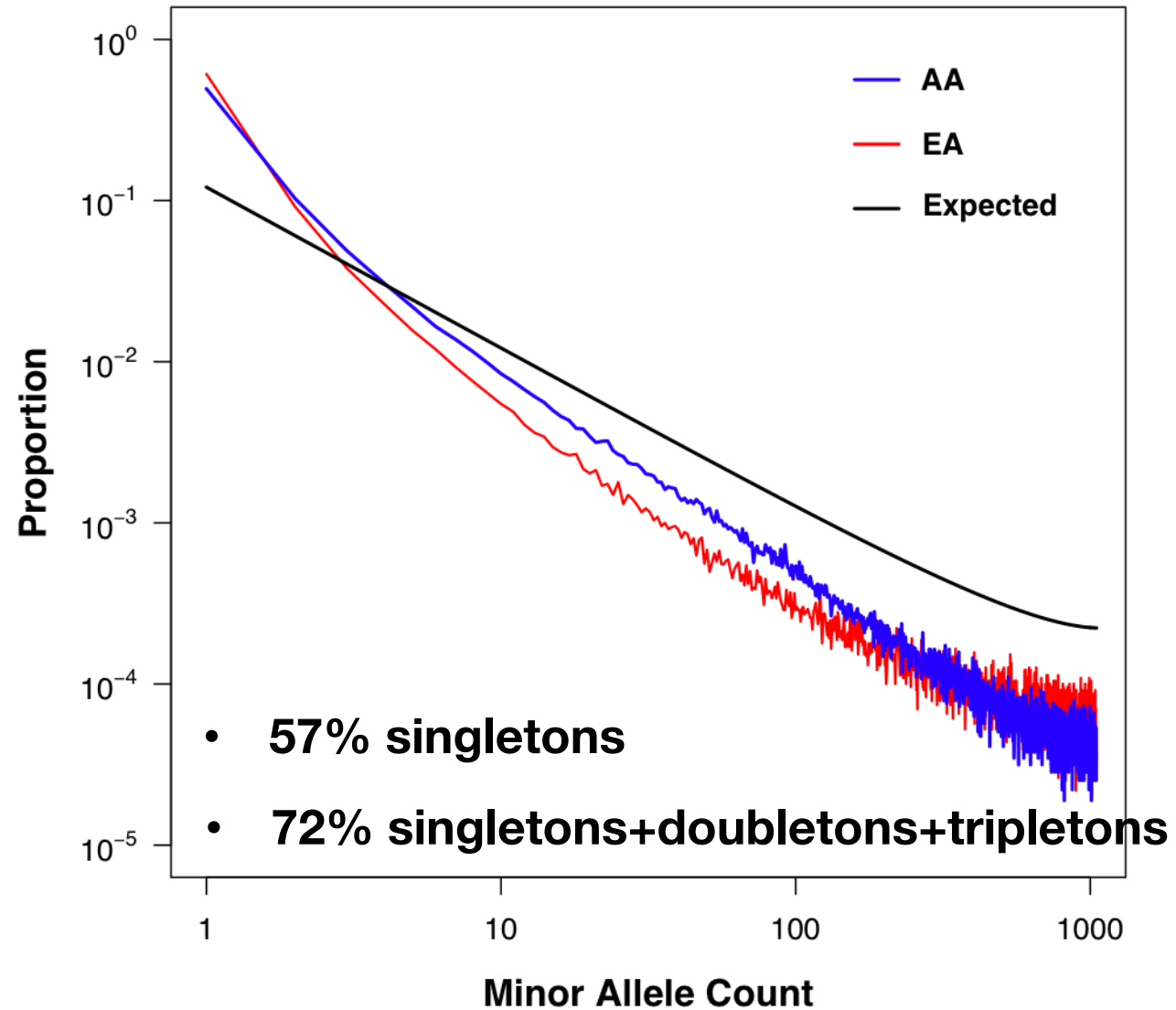




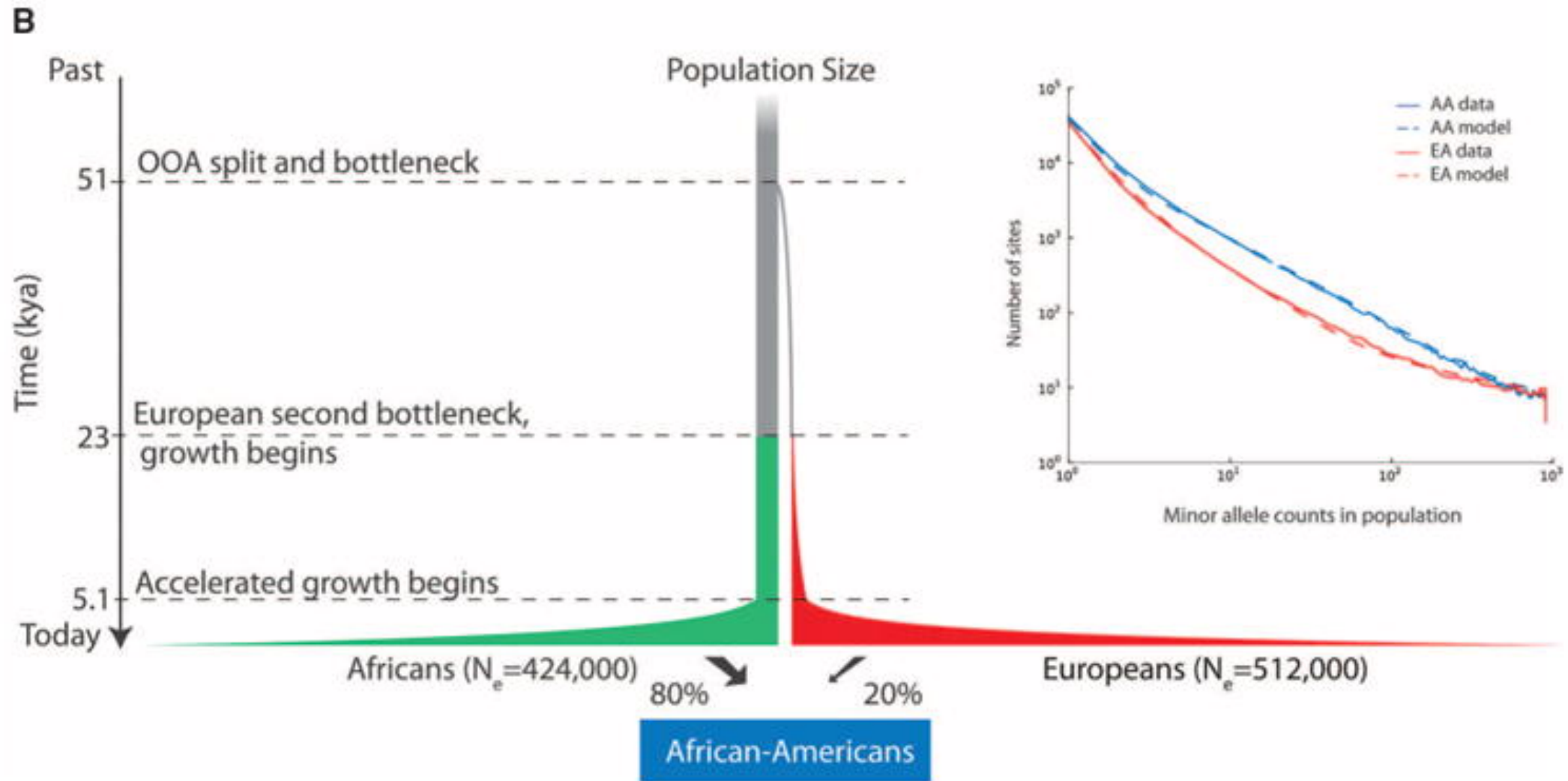
# When did most variation arise?



# Most SNVs are very rare

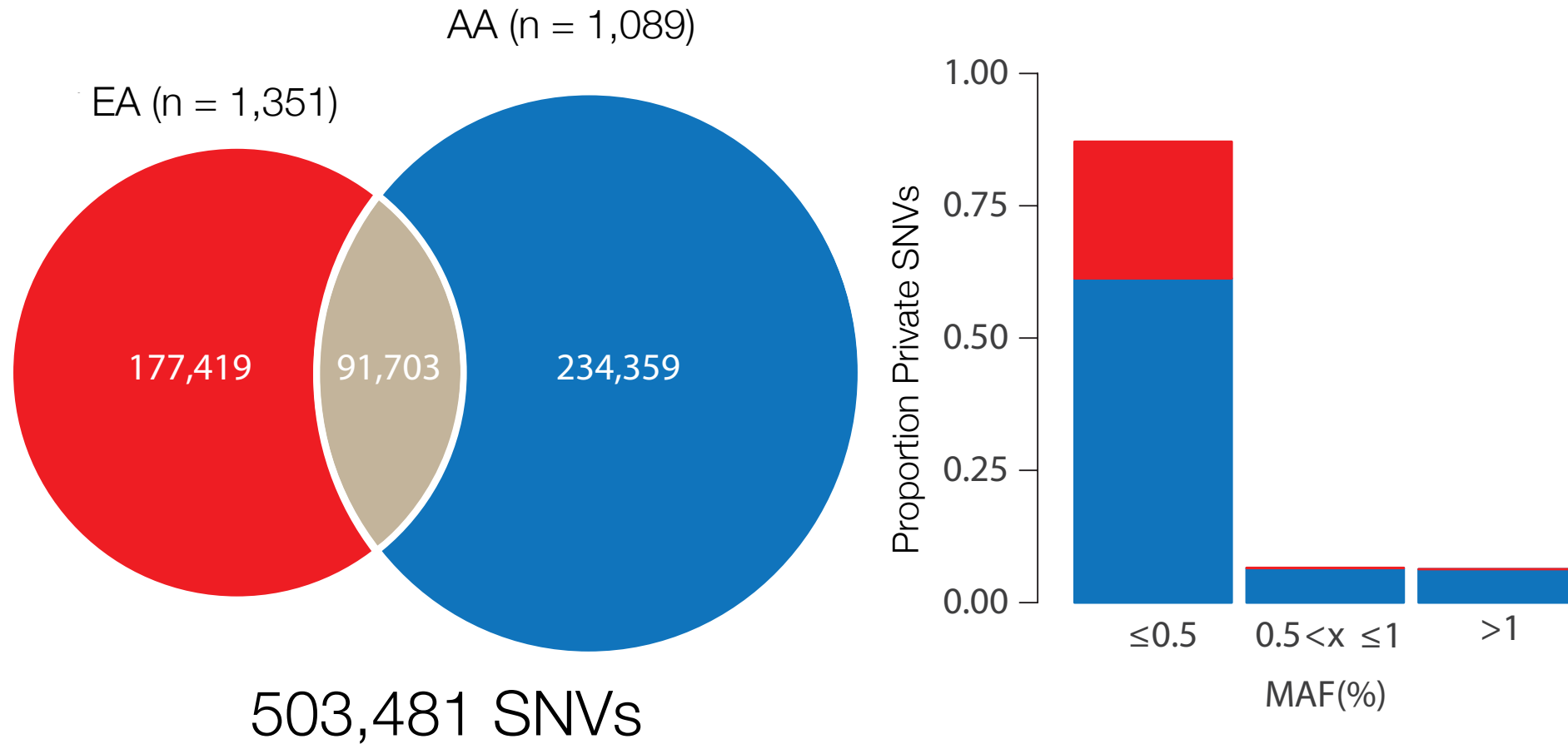


# How has our population size grown?



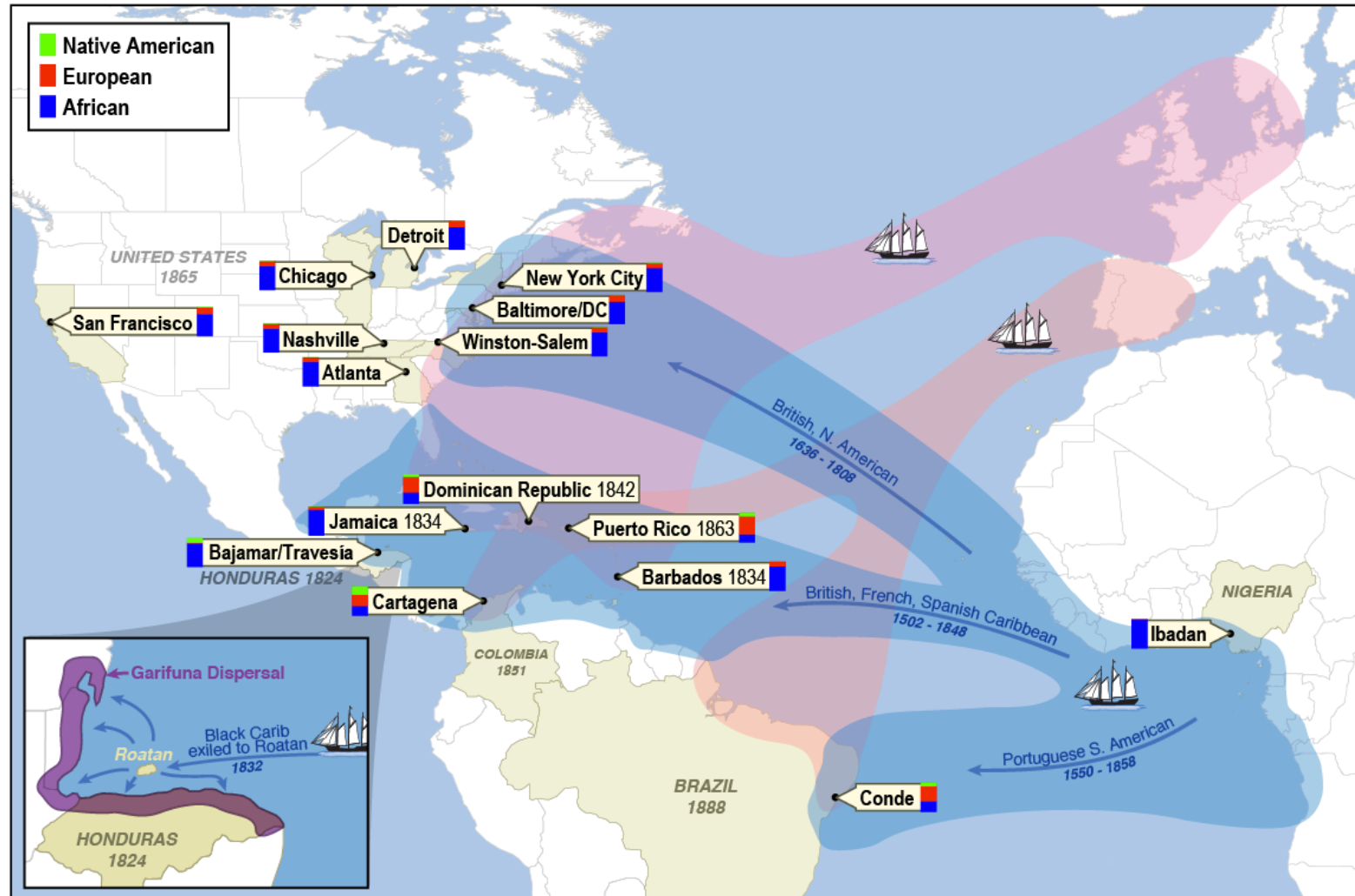
Tennessen et al. (2012) Science

# Most SNVs are population specific





# Migration: Admixture is migration between diverged populations

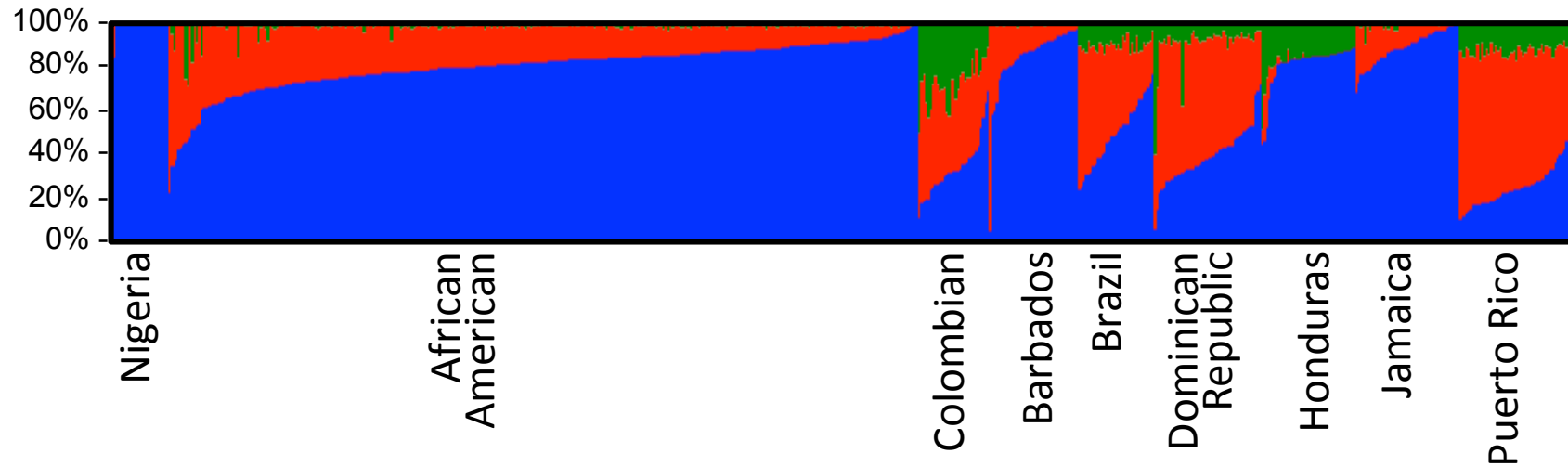


Mathias et al. (2016)  
Nature Comm.

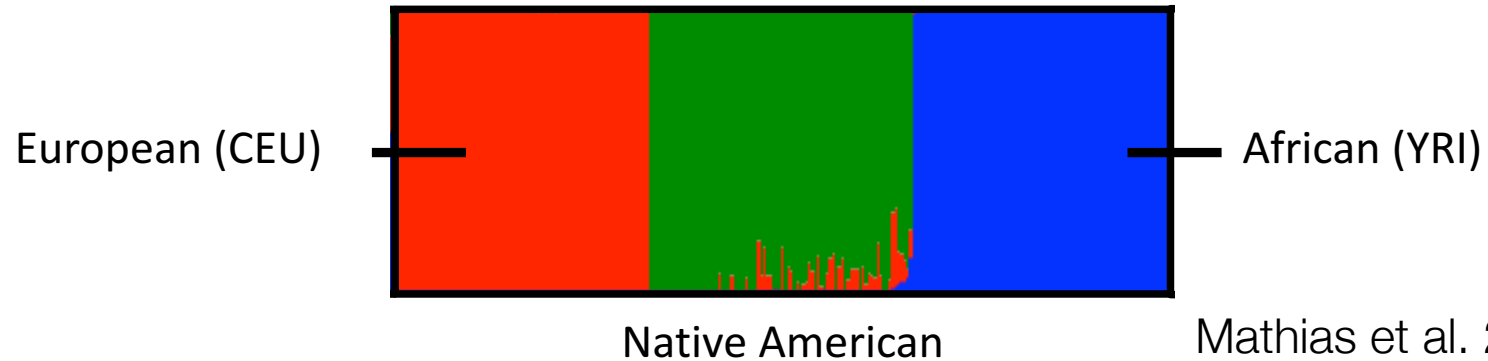


# Estimates of global ancestry

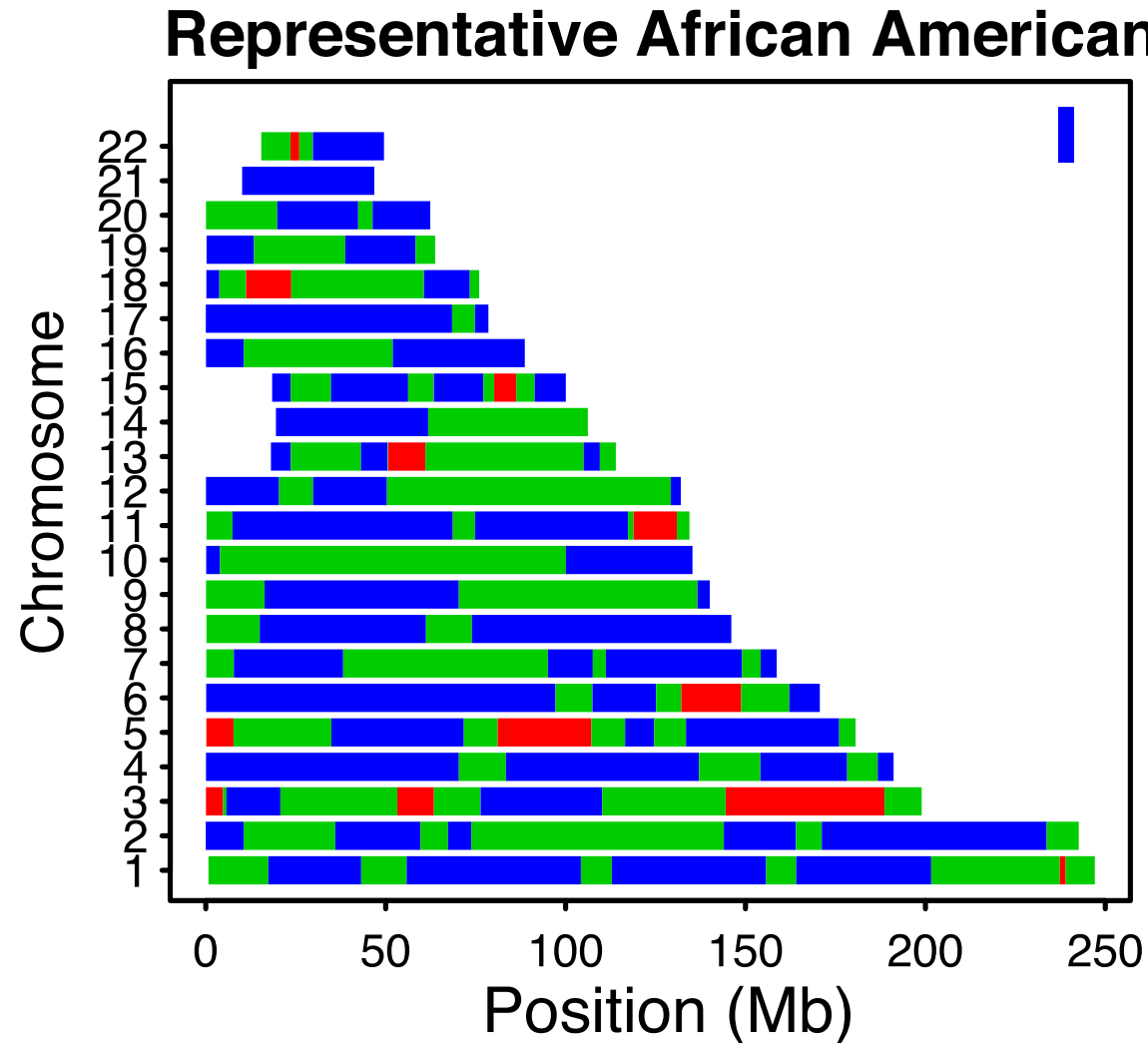
CAAPA



Reference



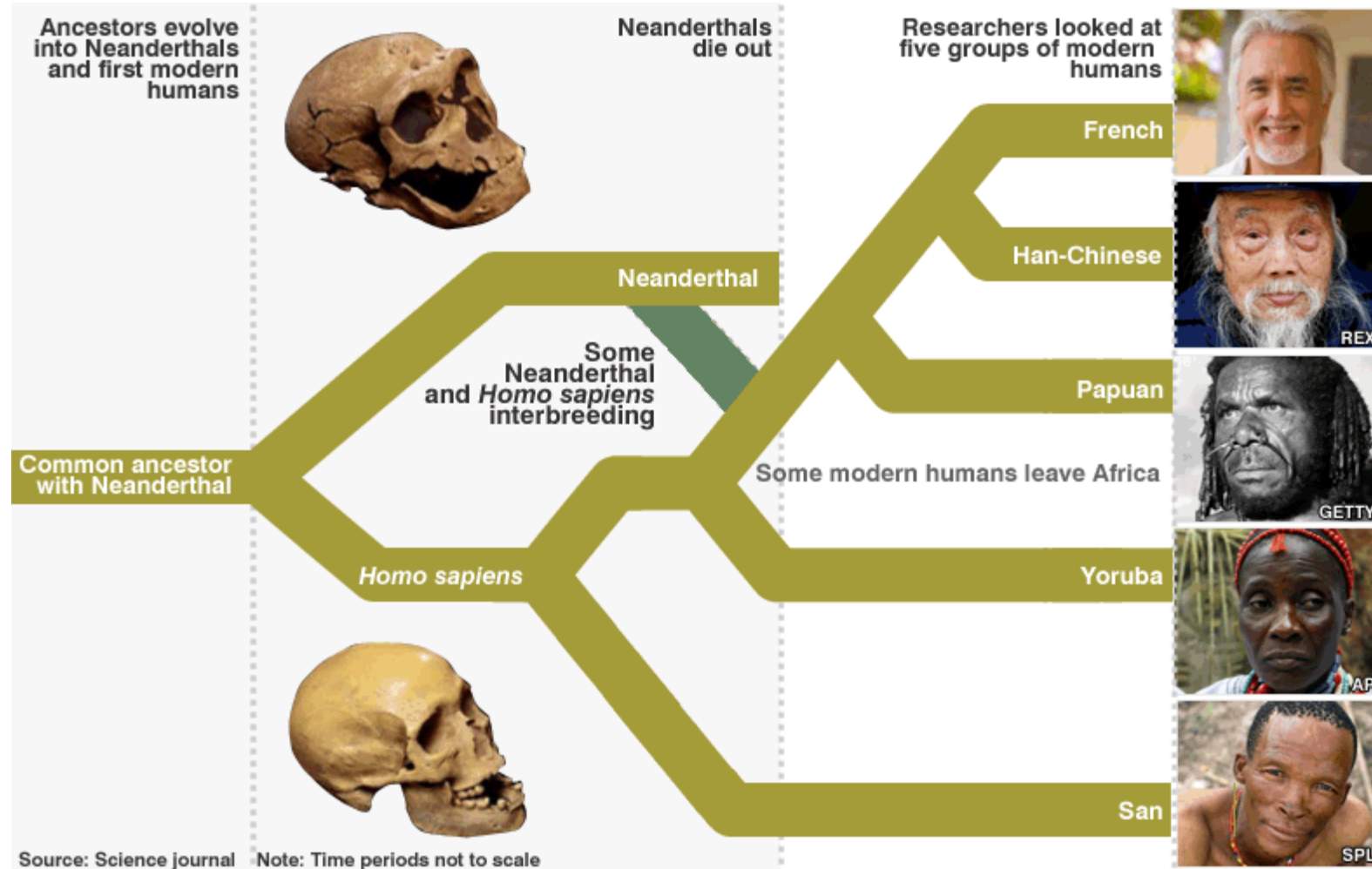
# Local ancestry of a single individual



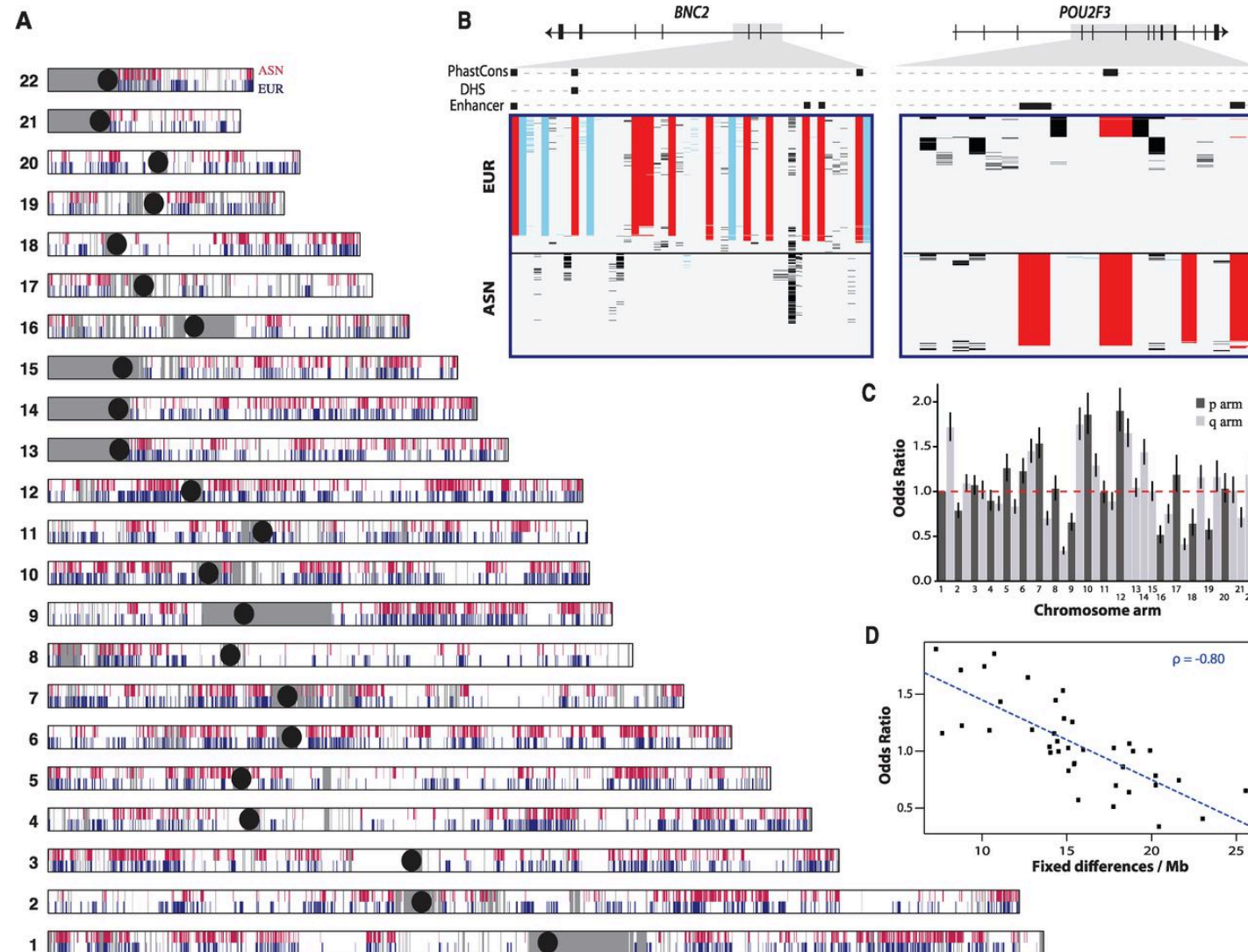


# Ancient admixture: Neanderthals are still among us

- Recent genetic data suggests that 1-4% of non-African genomes are derived from Neanderthals



# Neanderthals are still among us



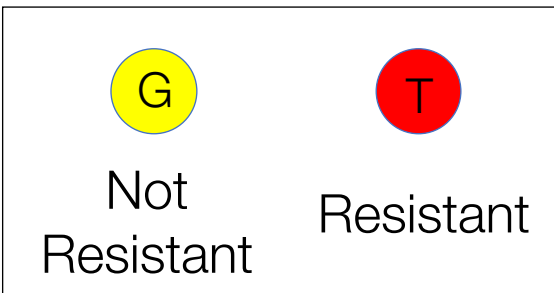
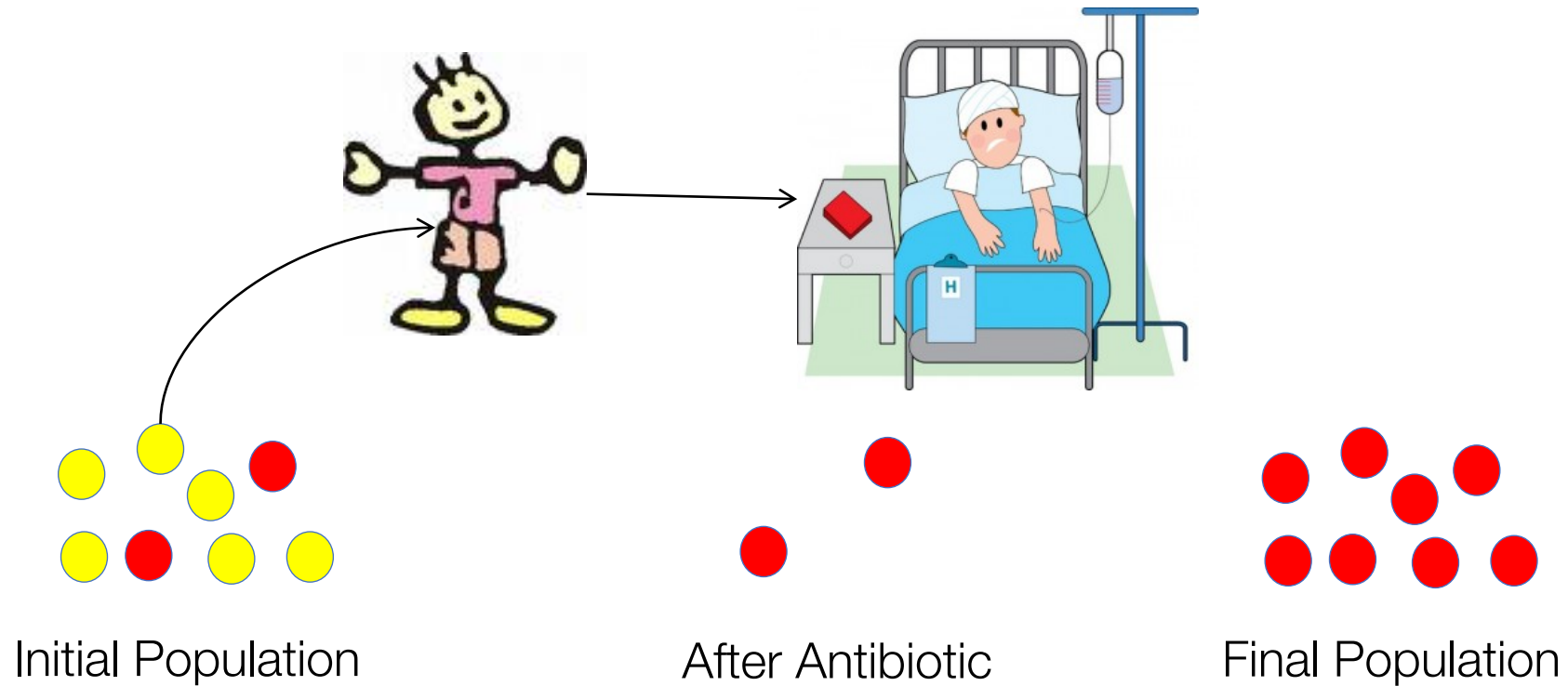
# Adaptive (Darwinian) Selection

"I have called this principle, by which each slight variation, if useful, is preserved, by the term Natural Selection." —Charles Darwin from "The Origin of Species", 1859

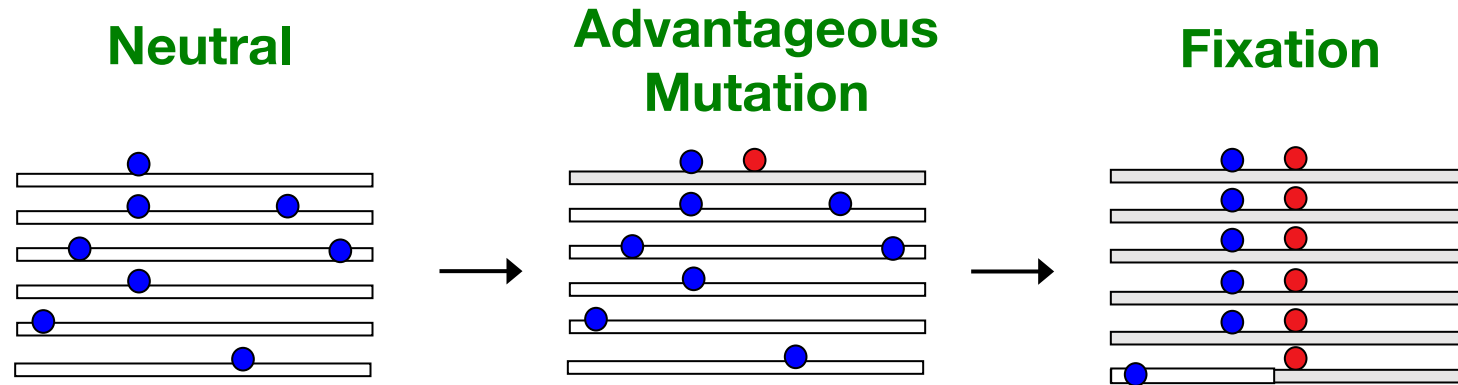




# Antibiotic resistance is an example of adaptive evolution



# Reading the genome for signatures of positive selection



- This process imparts “signatures” on patterns of genetic variation that we can use to find adaptively evolving genes

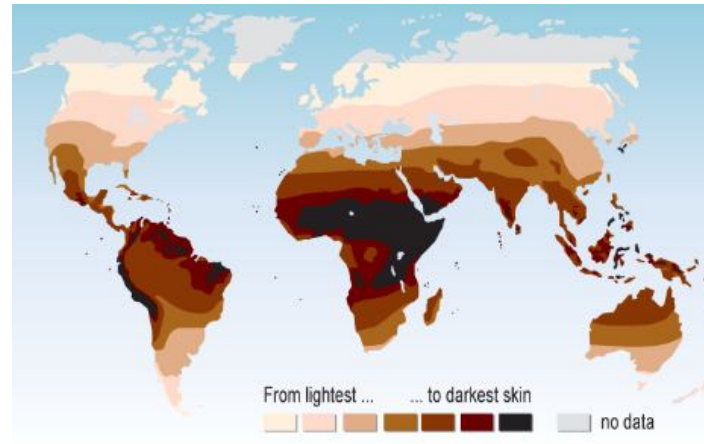
# Genes that influence physical traits have been targets of recent selection

Eye Color



HERC2

Skin Pigmentation



Source: Chaplin G.®, *Geographic Distribution of Environmental Factors Influencing Human Skin Coloration*, *American Journal of Physical Anthropology* 125:292–302, 2004; map updated in 2007.

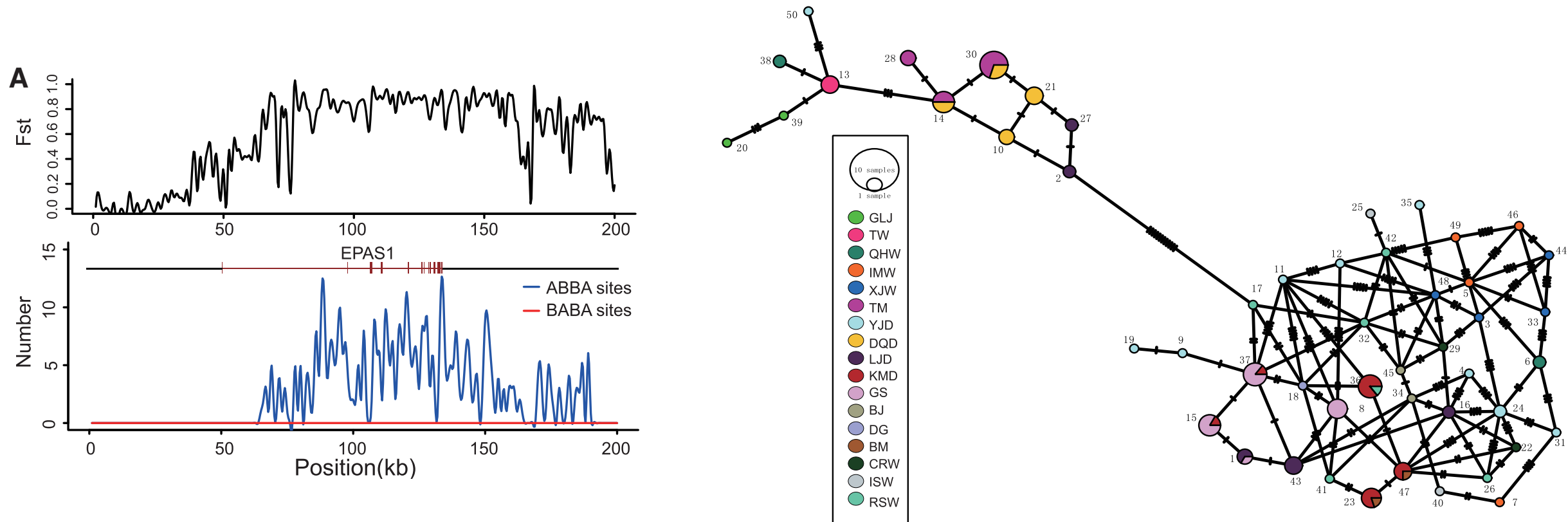
SLC24A5, OCA2, TYRP1

Hair Texture



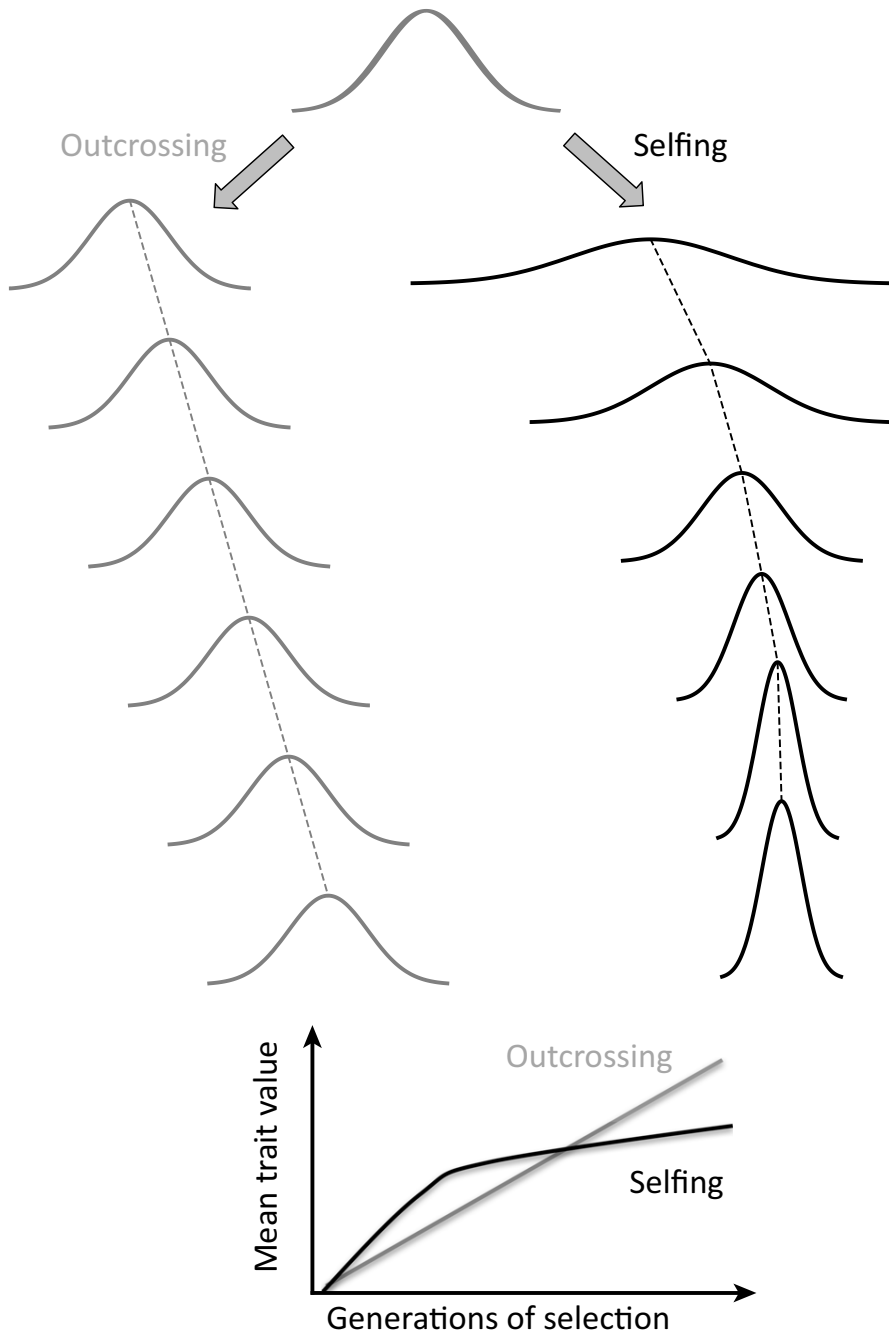
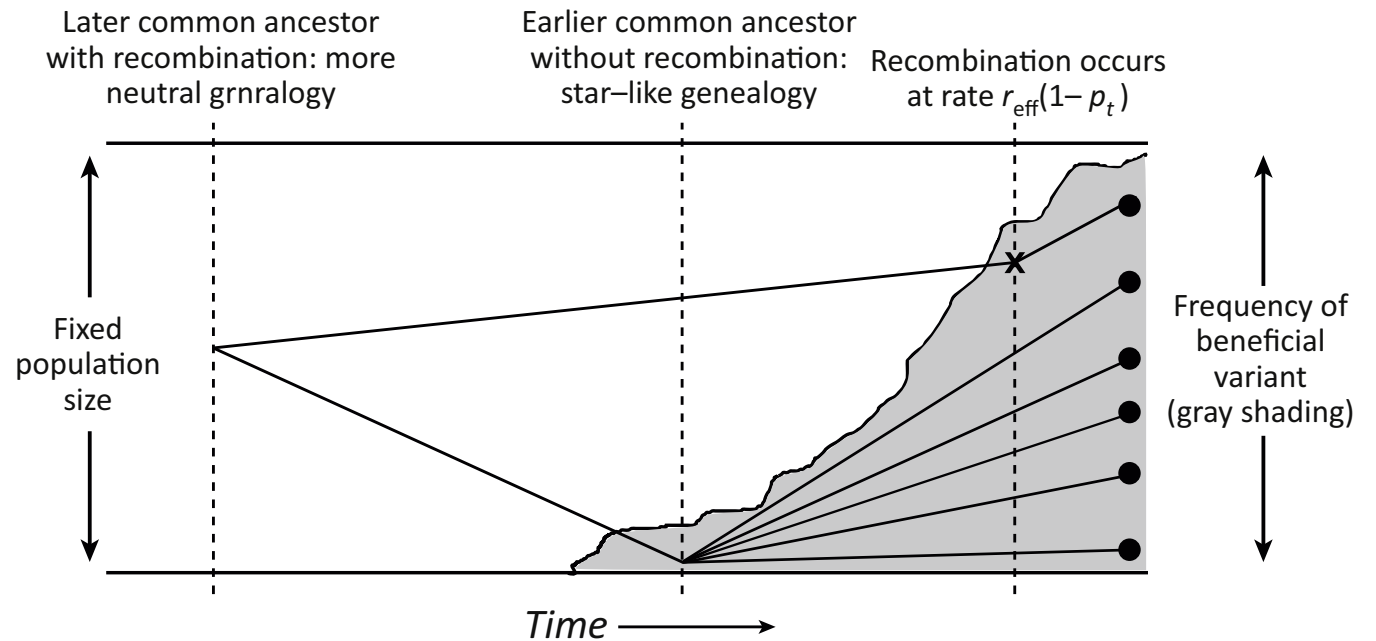
EDAR

# Non-independence of evolutionary forces: Adaptive-migration (introgression)



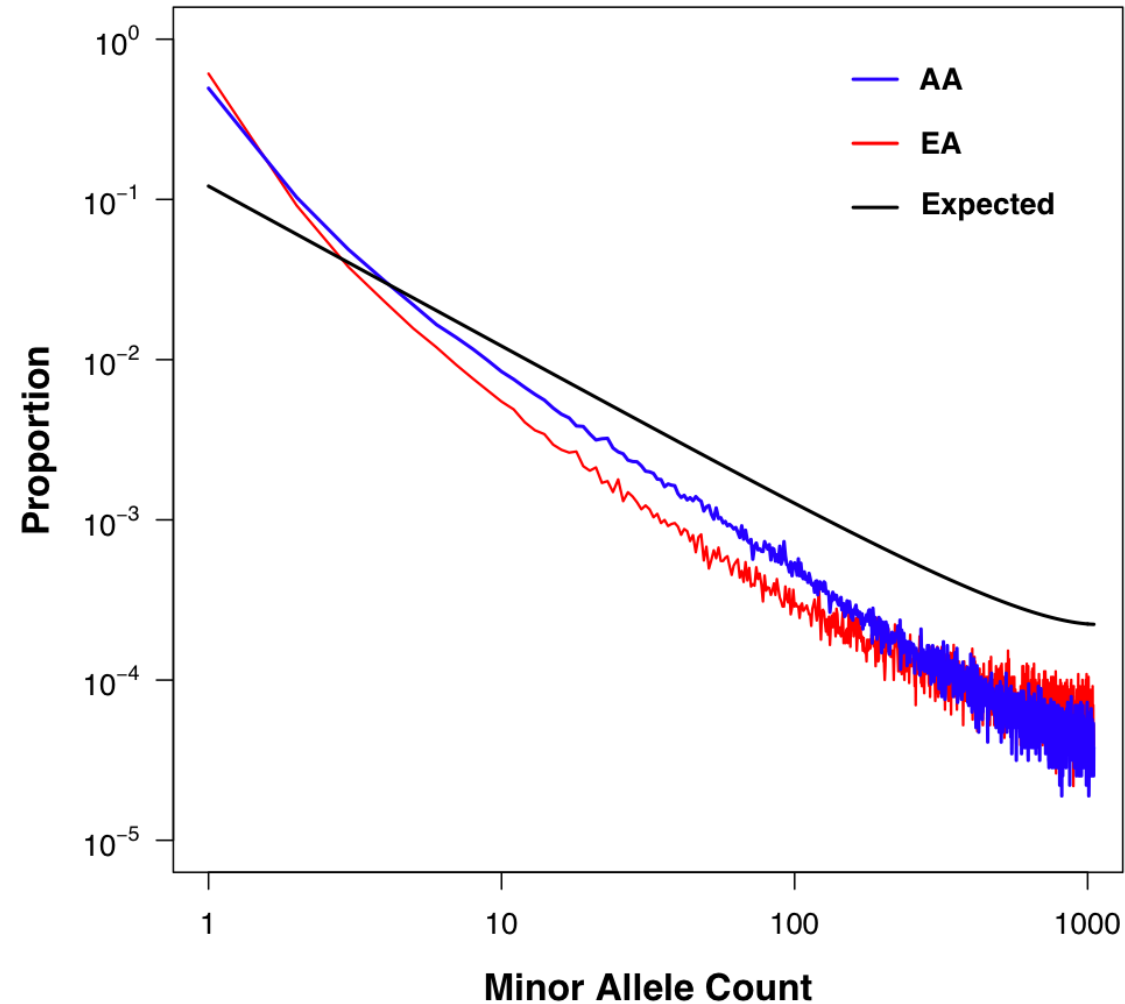
# Non-independence of evolutionary forces: Drift (Selfing) and Selection

Hartfield et al. (2017) Trends in Genetics



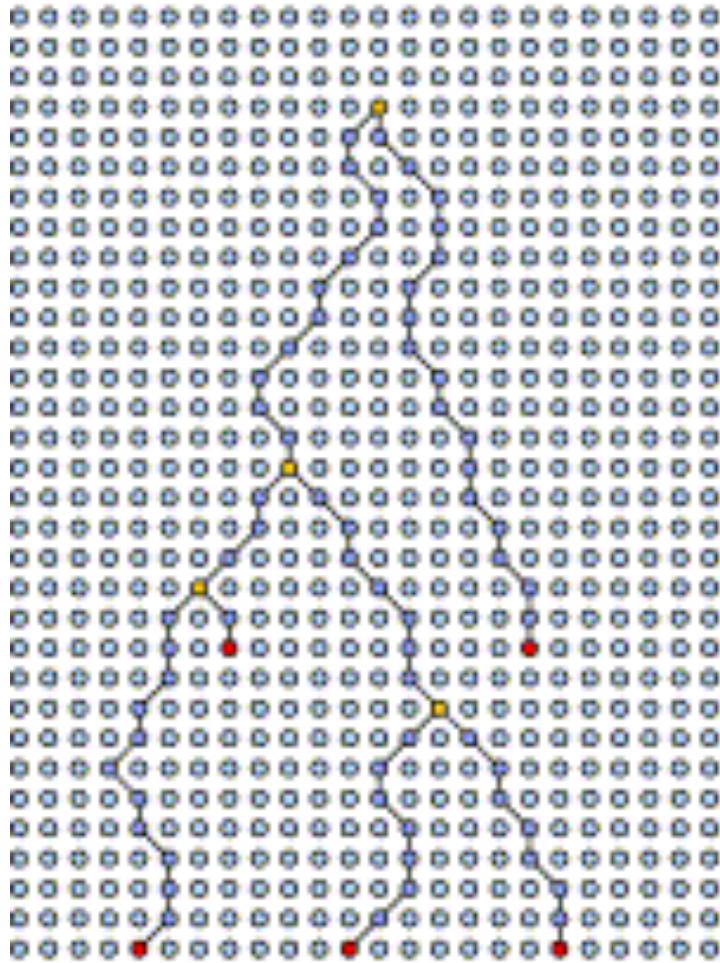


# These forces all affect the Site Frequency Spectrum (SFS)

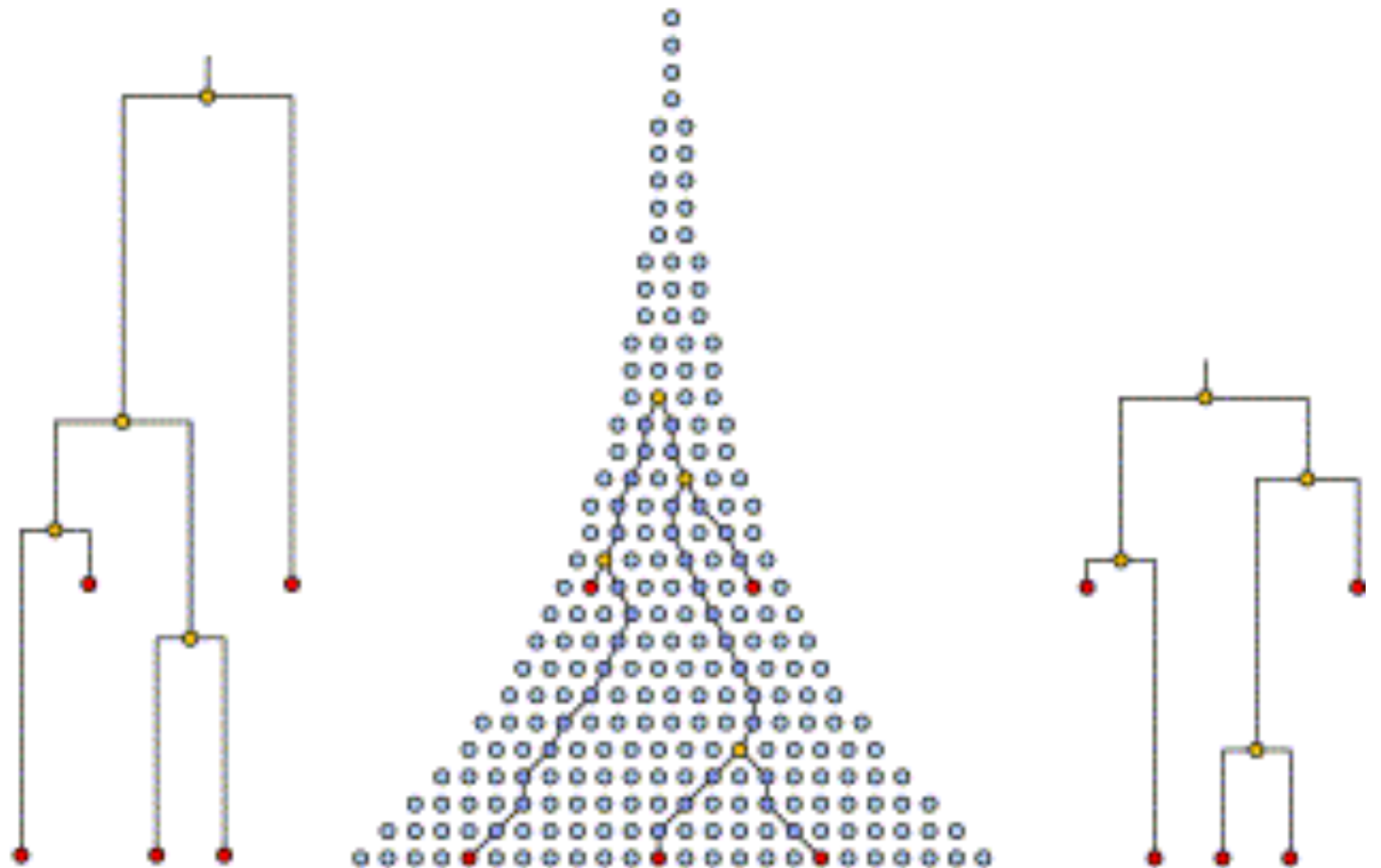


# Primer on coalescent

(a)



(b)



# Primer on coalescent

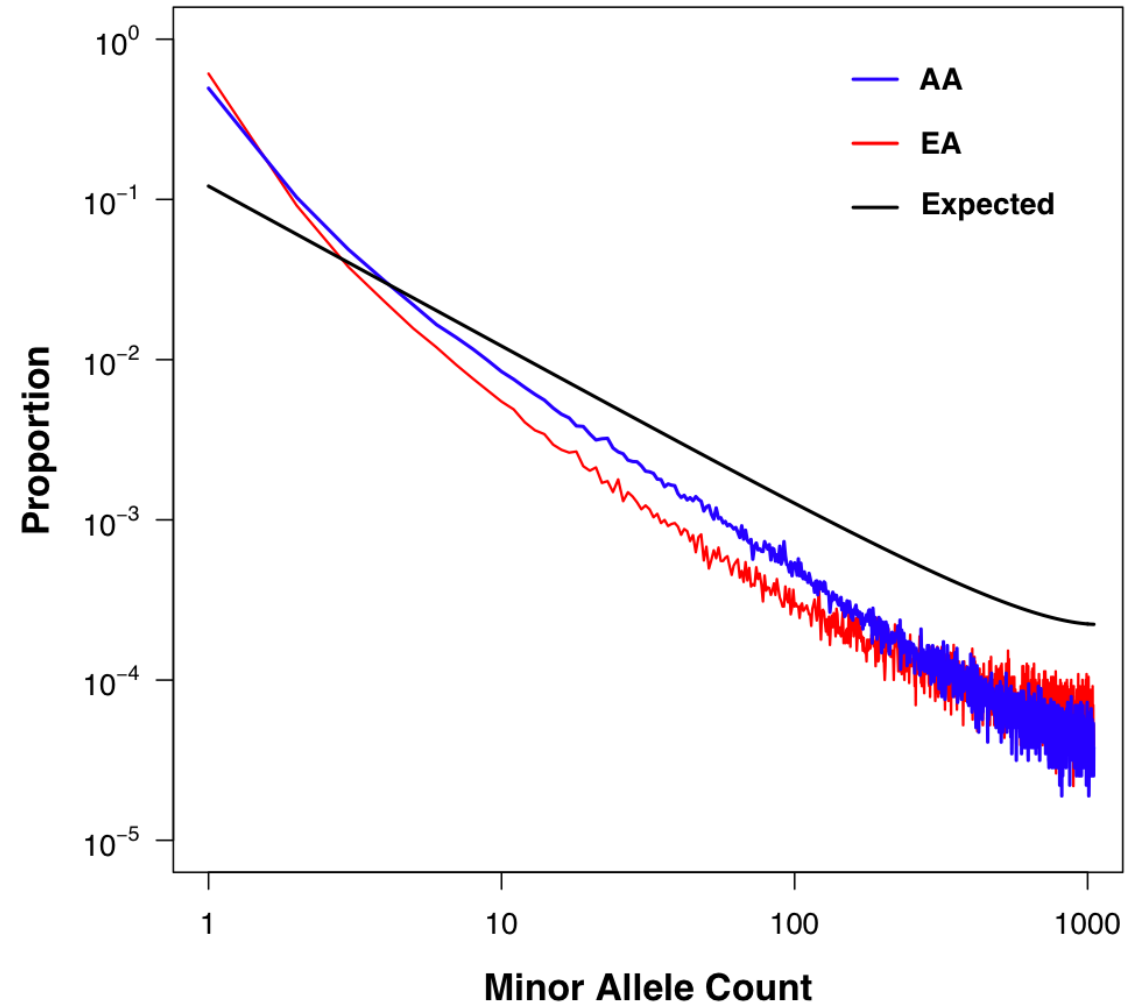
$$E(T_i) = \frac{2}{i(i-1)}$$

$$Var(T_i) = \left( \frac{2}{i(i-1)} \right)^2$$

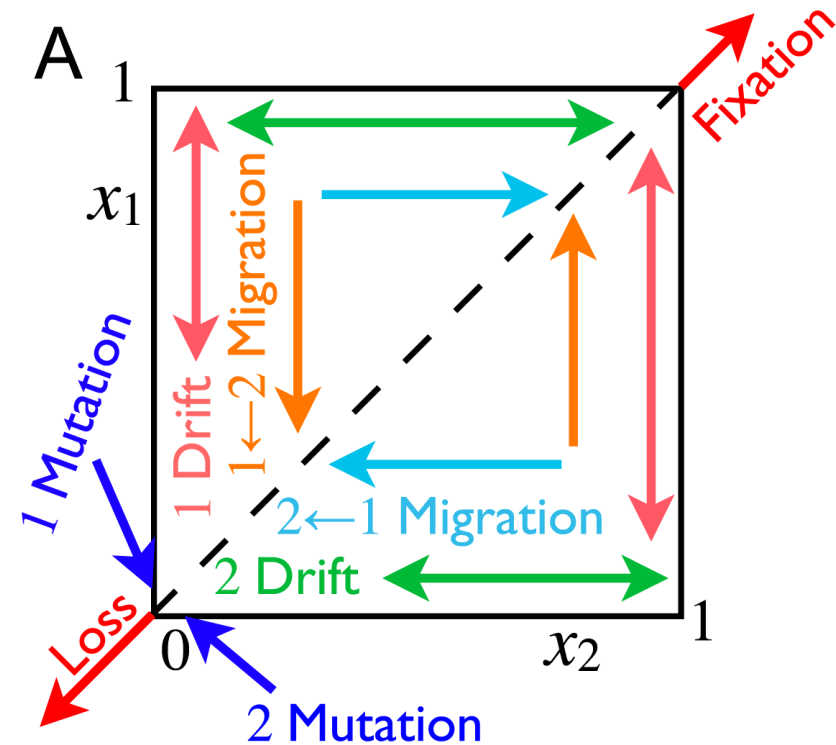
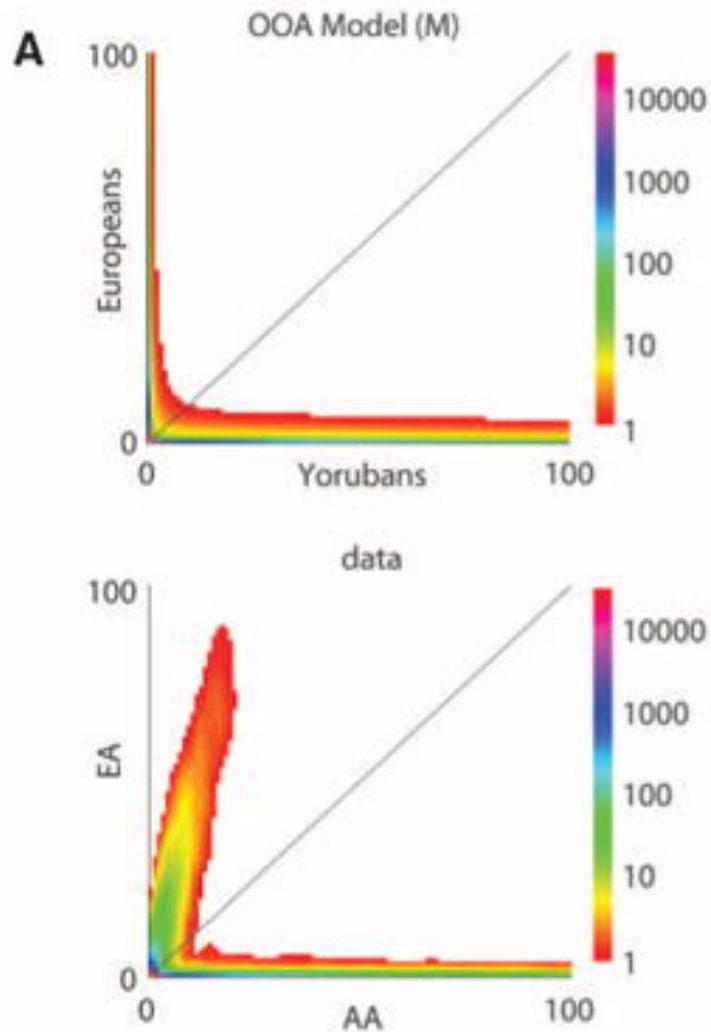
To generate a genealogy of  $i$  genes under Kingman's coalescent:

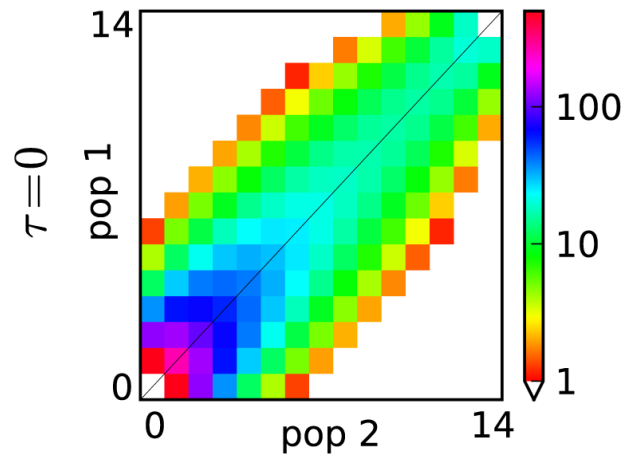
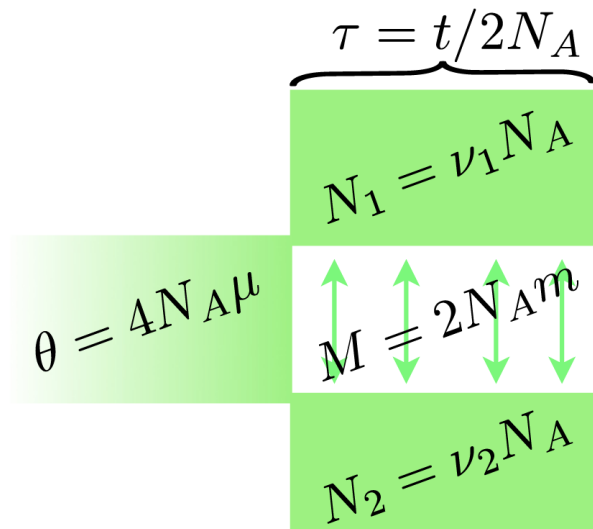
- Draw an observation from an exponential distribution with mean  $\mu = 2/(i(i-1))$ . This will be the time of the first coalescent event (looking from the present backwards in time).
- Pick two lineages at random to coalesce.
- Decrease  $i$  by 1.
- If  $i = 1$ , stop. Otherwise, repeat these steps [8, 9].

# Site Frequency Spectrum (SFS)

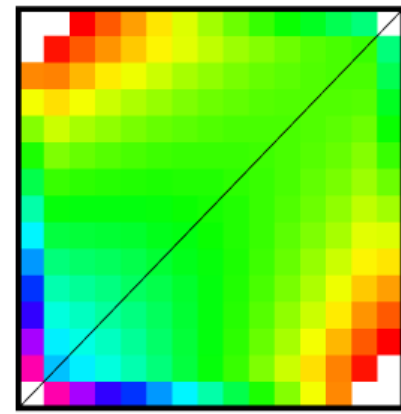


# Joint Site Frequency Spectrum (JSFS)

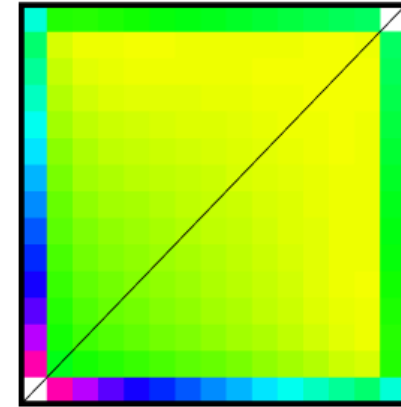




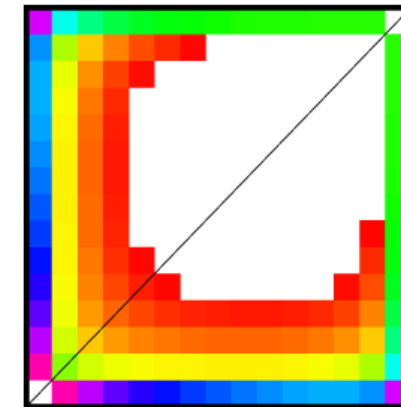
$\tau=0.1$



$\tau=0.3$



$\tau=1.0$



Gutenkunst et al. 2009 PLoS Genet.

# Useful equations

Time:  $t = T/(4*N_{\text{ref}}*\text{Gen})$

- $N_{\text{ref}}$  = reference or ancestral population size
- Gen = number of years per generation
- T = chronological years

$\theta = 4*N_{\text{ref}}*\mu*\text{Length};$

- $\mu$  = mutation rate
- Length is the bp of the segment simulated (aka nsites for recombination)

Growth:  $N(t) = N(0)e^{-t\alpha}$

Recombination:  $\rho = 4N_{\text{ref}}r$

- r is the recombination rate between the ends of a unit length sequence

Migration:  $M_{ij} = 4N_{\text{ref}}m_{ij}$

- $m_{ij}$  is the fraction of subpopulation i that is made up of migrants from subpopulation j in forward time.

# Concluding Summary

- Four main evolutionary forces are: Mutation, migration, selection, and drift.
- These forces interact and rarely act independently.
- These forces change the site frequency spectrum in informative ways that we can use for both demographic analysis and simulation.