





# Plant of the day!

- Pebble plants, *Lithops*, dwarf xerophytes
- Aizoaceae
- South African
- Plants consist of one or more pairs of bulbous leaves – almost no stem
- Leaf markings appear to help plant match its background and be less vulnerable to herbivory



*Lithops lesliei*

# Genomics of Adaptation



# Questions

- What are the genetic changes that underlie adaptation?
- What are the population genetic or genomic signatures of adaptation?
- How do non-adaptive processes affect tests of selection?

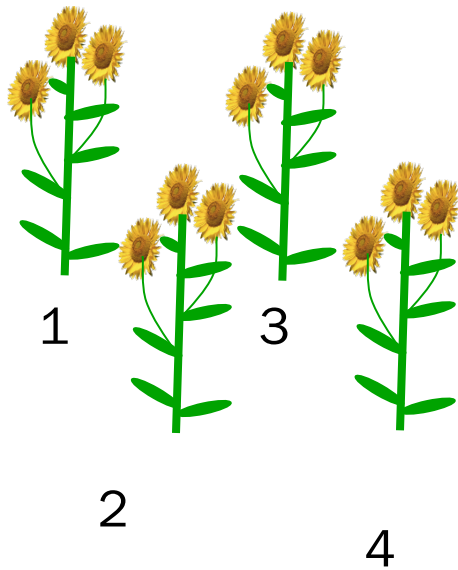
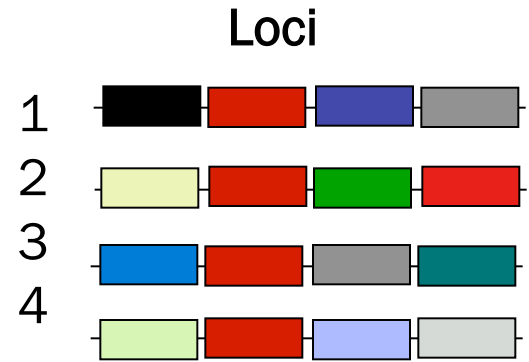
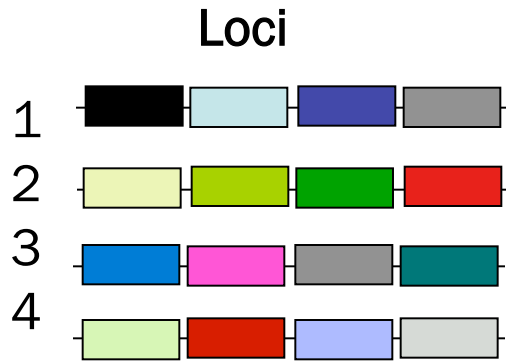
# Goals

- Understand some top down and bottom up approaches used to identify genes responsible for adaptation
- Explain patterns of sequence variation expected with directional and balancing selection
- Understand the principles of population genetic tests of selection

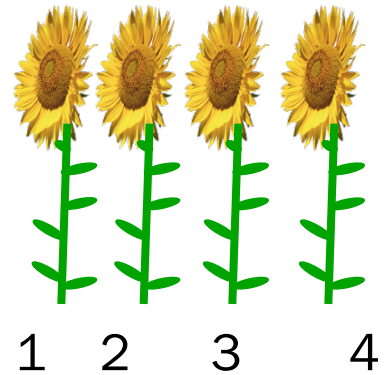
# The genetic basis of adaptation

- Phenotype to genotype (Top down)
  - Identify important trait then find loci associated with it
  - QTL, association mapping, bulk segregant analysis
- Genotype to phenotype (Bottom up)
  - Identify loci under selection, then find trait associated with loci
  - Population genetics

Which locus is likely involved in the change in floral phenotype?

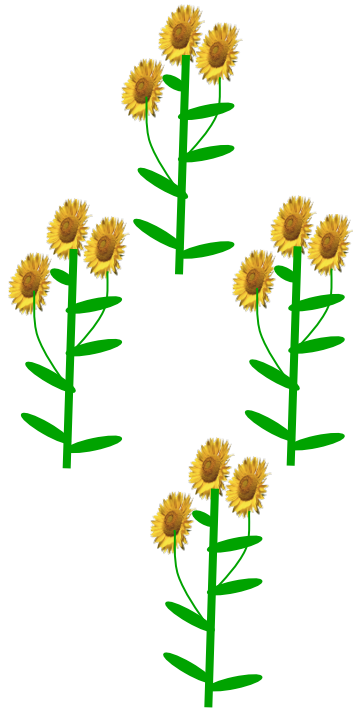
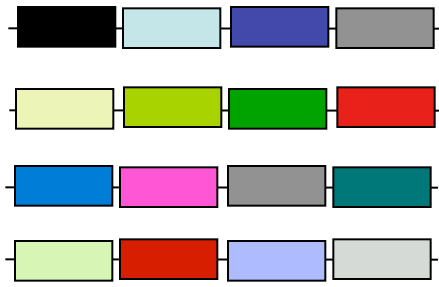


→  
Selective sweep

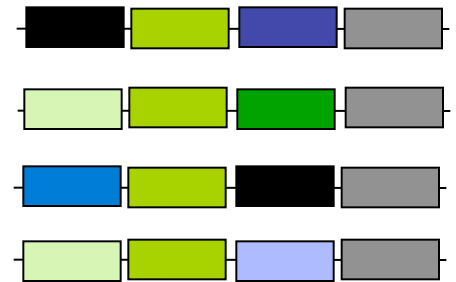
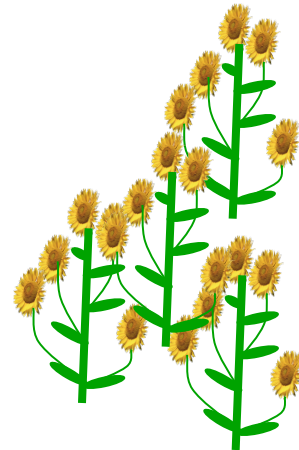
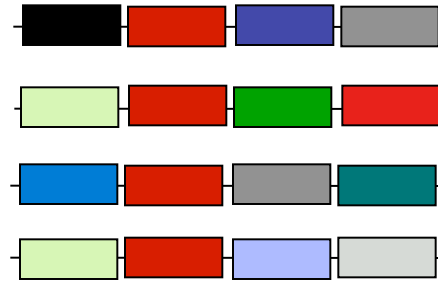
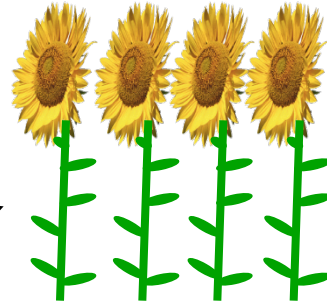




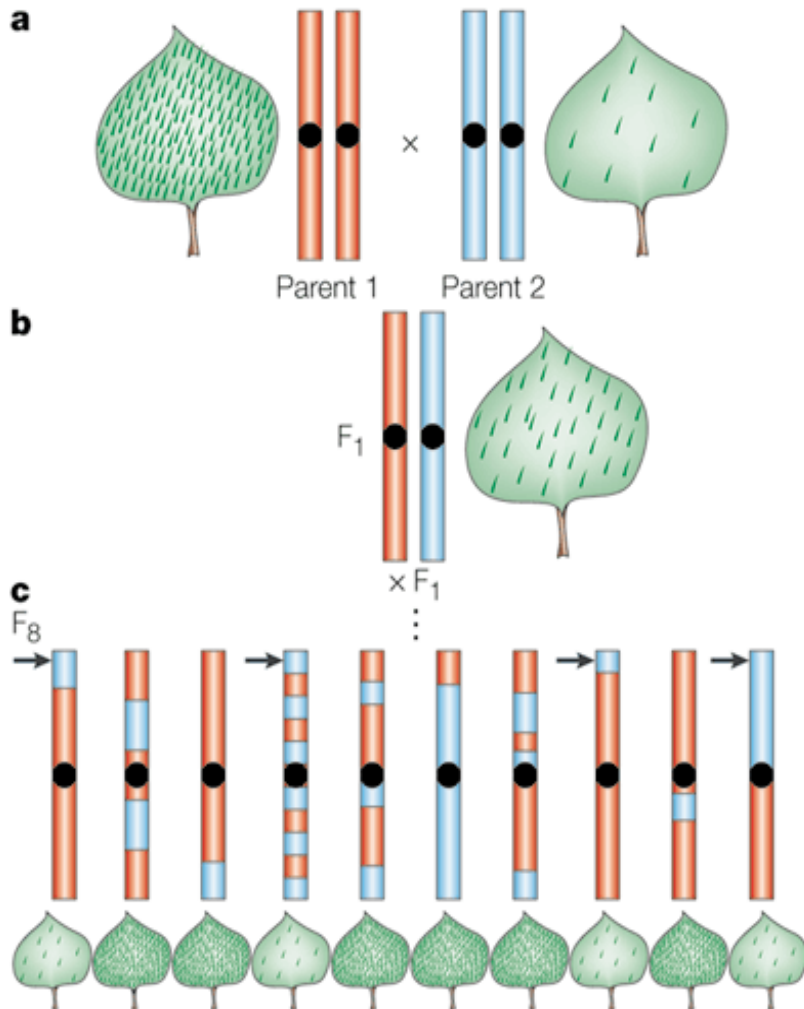
Which locus is likely involved in the divergence in floral phenotype?



divergence



# Quantitative trait loci (QTL)



-Genomic regions associated with trait variation

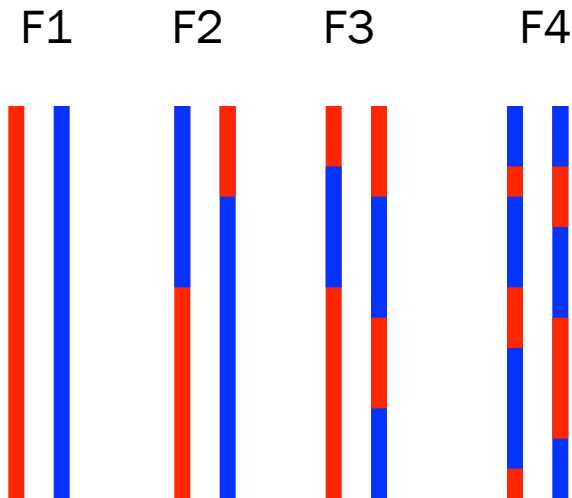
-Loci detected may differ across individuals/environments

-Statistical issues (sample size, genes of small effect, epistasis)

-Can be large regions of a chromosome (further mapping in region needed)

-Can't perform in all species

# Quantitative trait loci (QTL)



-Precision limited by density of markers and number of recombination events

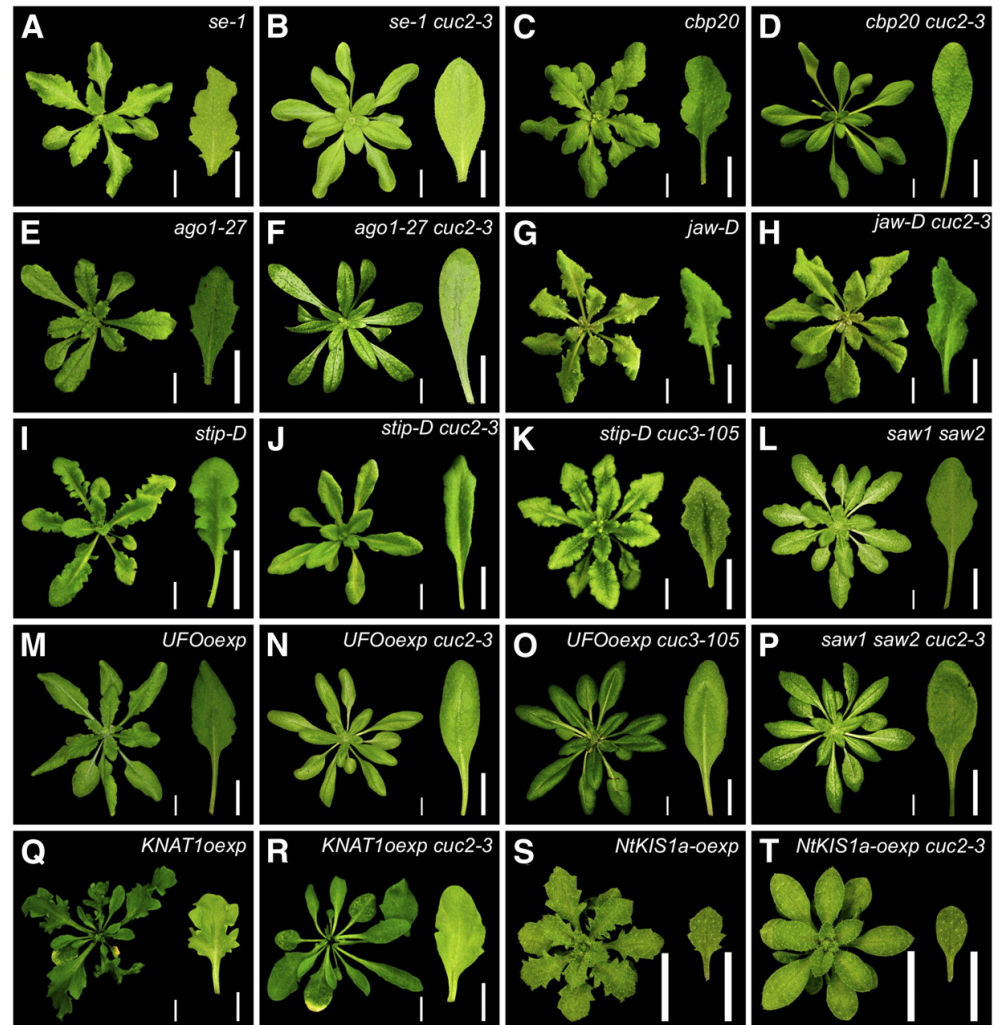
-Recombination events limited by the number of individuals and their degree of recombination between the parental genomes (i.e. F2, F3, etc)

Parental genomes are more finely recombined with each generation of consecutive intercrosses.

# Association mapping

Associations between markers (SNPs) and phenotypes in natural populations

- Different populations of *Arabidopsis* have different leaf shape.
- Look through whole genome to find SNPs associated with leaf shape.



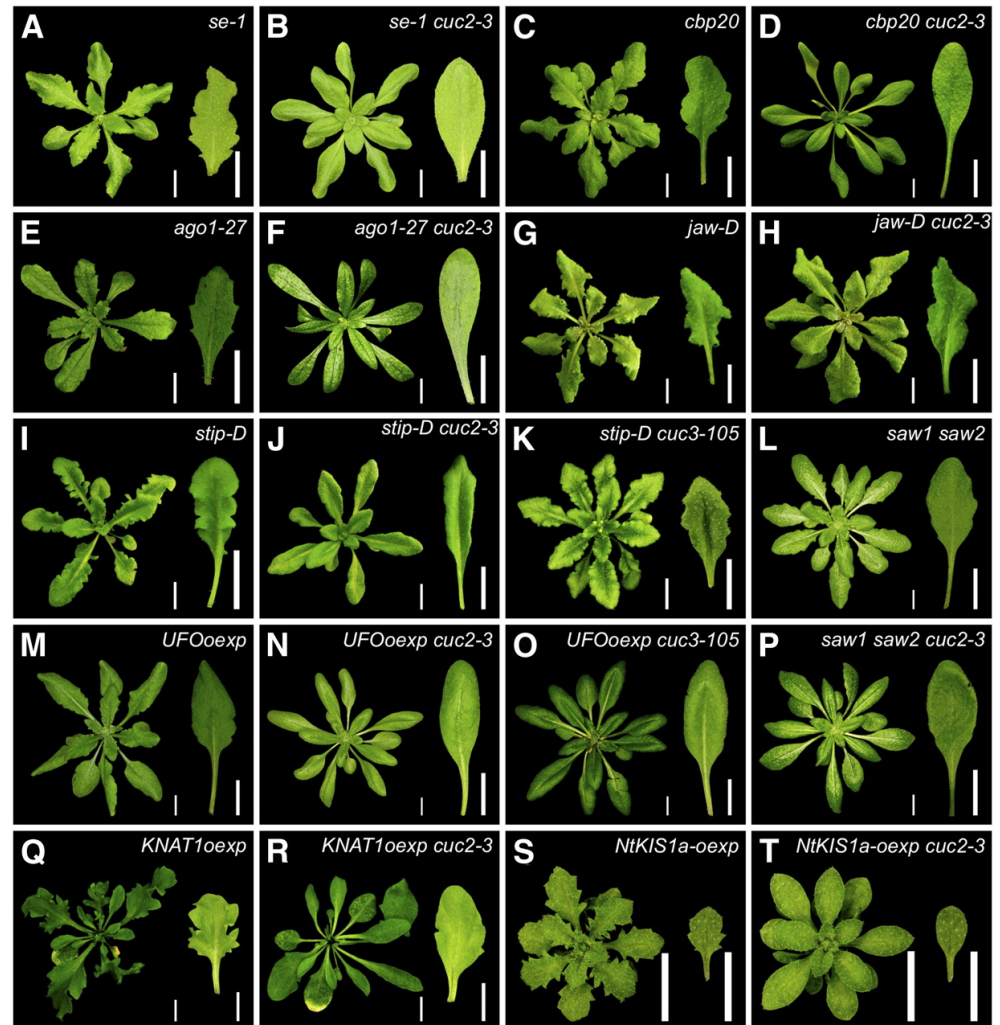
# Association mapping

## Pros:

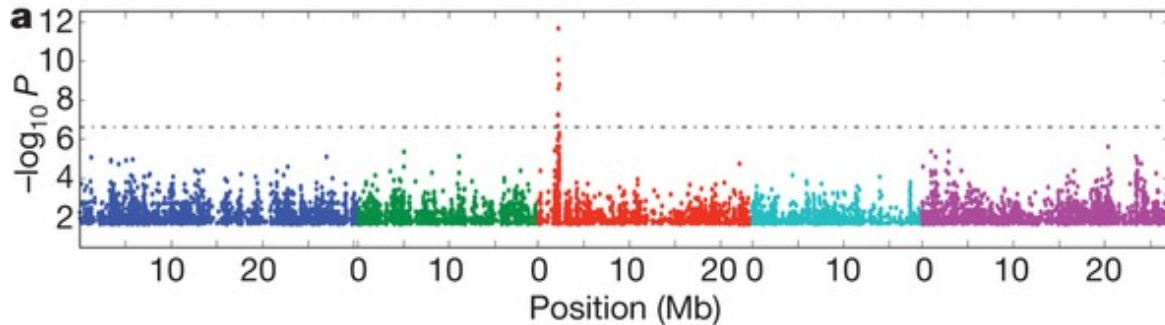
- Much higher resolution
- No need for crosses

## Cons:

- Population structure may lead to spurious associations
- Need many many markers, more than QTL mapping.

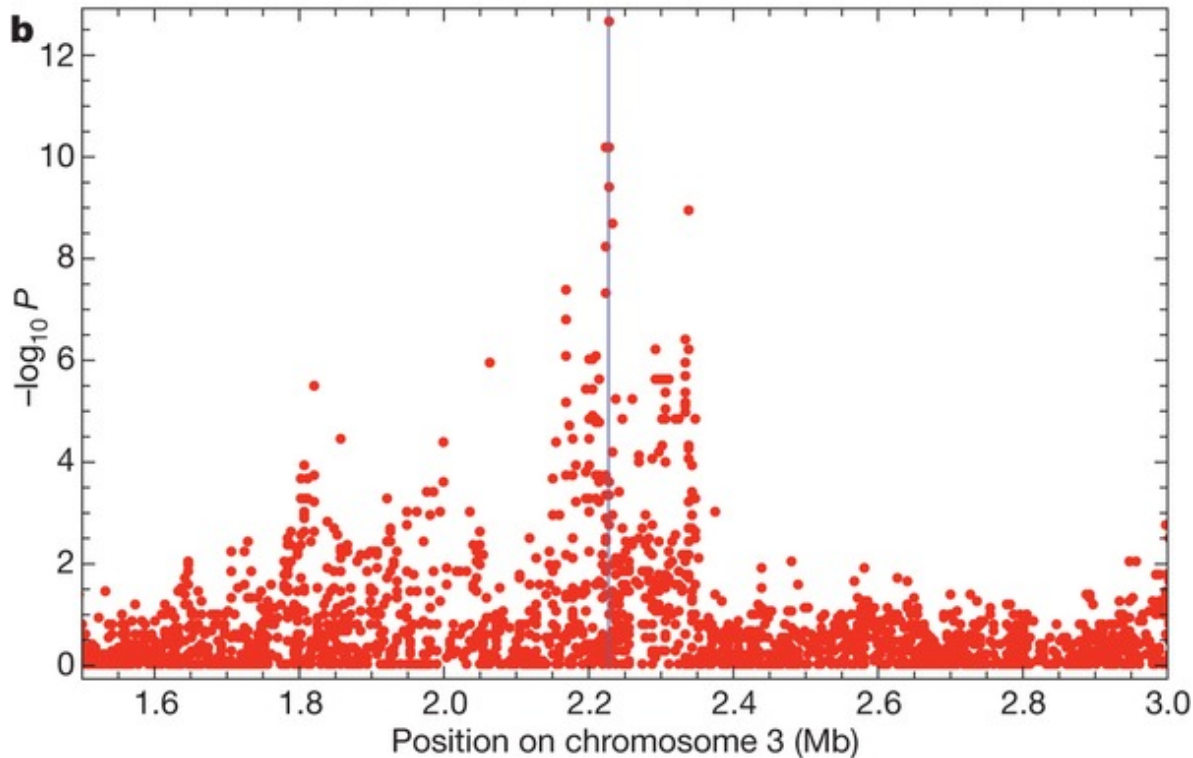


# Example association map



Response to the avirulence gene *AvrRpm1*

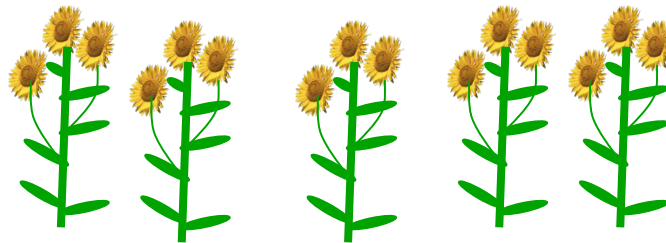
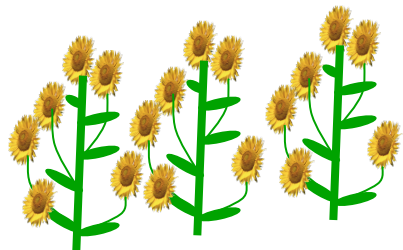
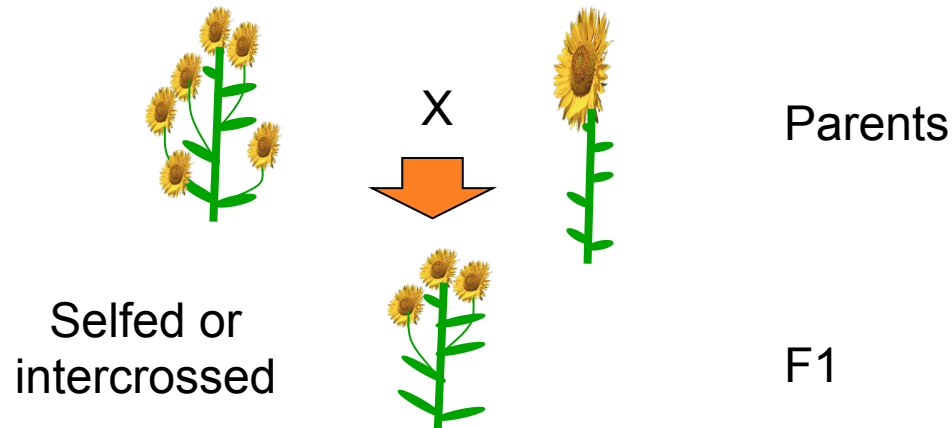
- A very simple trait



Used 95 inbred lines and 250,000 SNPs

# Bulk Segregant Analysis

- Cross two plants divergent phenotype, then self or intercross to make an F2 population
- Select F2 individuals with extreme phenotypes for the trait
- Genotype both pools for many markers
- Look for genes where different alleles are enriched in each pool



F2

# The genetic basis of adaptation

- Phenotype to genotype (Top down)
  - Identify important trait then find loci associated with it
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- Genotype to phenotype (Bottom up)
  - Identify loci under selection, then find trait associated with loci
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# Detecting natural selection

- The Neutral theory suggests that most molecular changes are neutral and are caused by random genetic drift
- This is used as a null hypothesis and deviations from neutral expectations are evidence of selection
- Important to consider how non-selective processes like population structure and linkage affect the statistics

# The effect of selection on the genome

## Directional selection

- Best allele(s) sweep to fixation
- Loss of variation
- Change in frequency distribution of polymorphisms
- Increase in linkage disequilibrium around the site

# The effect of selection on the genome

## Directional selection

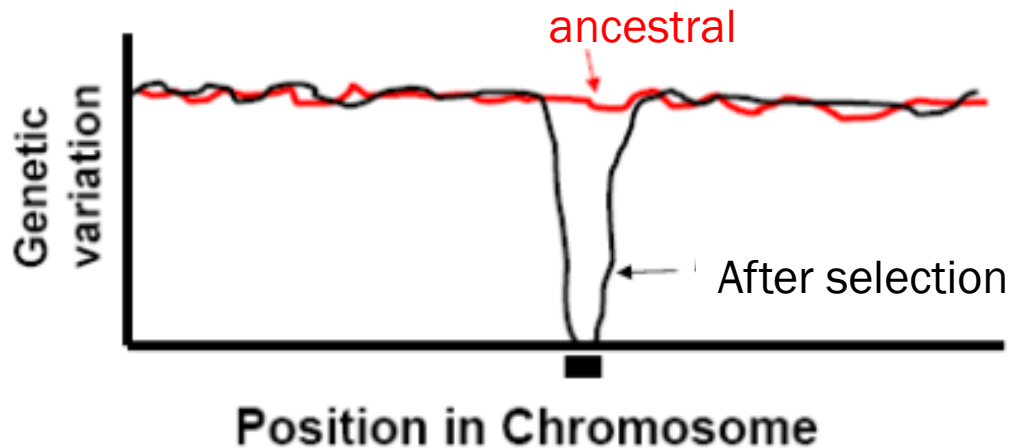
- Best allele(s) sweep to fixation
- **Loss of variation**
- **Change in frequency distribution of polymorphisms**
- Increase in linkage disequilibrium around the site

## Balancing selection

- Maintains variation that otherwise would be lost to drift
- Heterozygote advantage, frequency dependent selection, fluctuating selection, (divergent selection)

# Directional selection

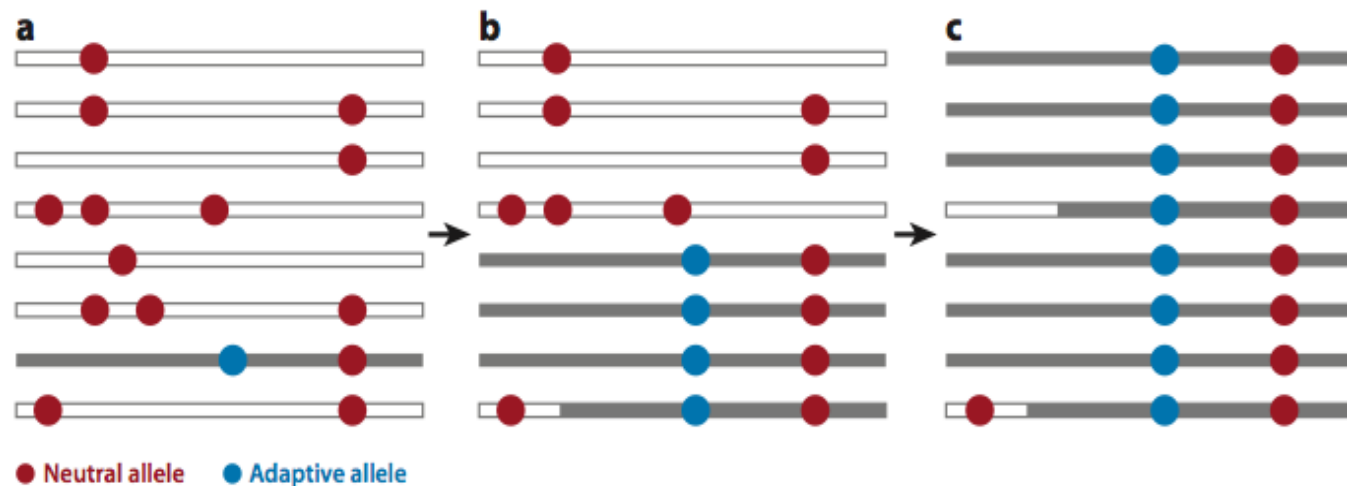
- A beneficial allele arises
- Variants with this allele rapidly spread through the species
- Genetic diversity is reduced around this adaptive locus



# Chance of detecting natural selection

Depends on:

- Time
- Strength of selection
- Recombination, mutation
- Initial frequency



Selective sweep

# Methods for detecting selection

A. MacDonal-Kreitman Type Tests

B. Site Frequency Spectrum Approaches

C. Linkage Disequilibrium (LD) and Haplotype Structure

D. Population Differentiation: Lewontin-Krakauer Methods

These tests can be applied to single genes, or across the whole genome.

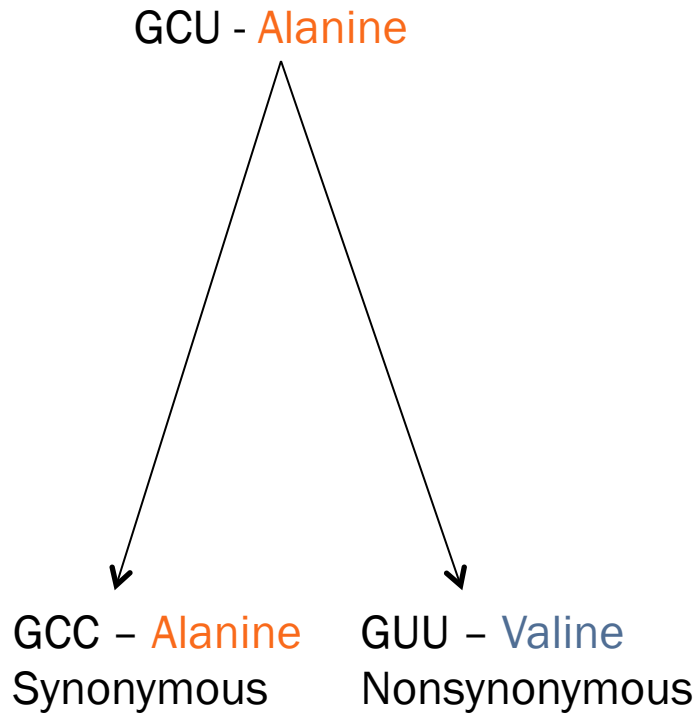
# A. MacDonald-Krietman type tests

- **Synonymous substitutions:**
- Mutations that do not cause amino acid change (usually 3rd position)  
“*silent substitutions*”
- **Nonsynonymous substitutions:**
- Mutations that cause amino acid change (1st, 2nd position)  
“*replacement substitutions*”

		Second base									
		U		C		A		G		Third base	
First base											
U	UUU	Phenylalanine	UCU	Serine	UAU	Tyrosine	UGU	Cysteine	U		
	UUC	Phenylalanine	UCC	Serine	UAC	Tyrosine	UGC	Cysteine	C		
	UUA	Leucine	UCA	Serine	UAA	Stop	UGA	Stop	A		
	UUG	Leucine	UCG	Serine	UAG	Stop	UGG	Tryptophan	G		
C	CUU	Leucine	CCU	Proline	CAU	Histidine	CGU	Arginine	U		
	CUC	Leucine	CCC	Proline	CAC	Histidine	CGC	Arginine	C		
	CUA	Leucine	CCA	Proline	CAA	Glutamine	CGA	Arginine	A		
	CUG	Leucine	CCG	Proline	CAG	Glutamine	CGG	Arginine	G		
A	AUU	Isoleucine	ACU	Threonine	AAU	Asparagine	AGU	Serine	U		
	AUC	Isoleucine	ACC	Threonine	AAC	Asparagine	AGC	Serine	C		
	AUA	Isoleucine	ACA	Threonine	AAA	Lysine	AGA	Arginine	A		
	AUG	Start (Methionine)	ACG	Threonine	AAG	Lysine	AGG	Arginine	G		
G	GUU	Valine	GCU	Alanine	GAU	Aspartic Acid	GGU	Glycine	U		
	GUC	Valine	GCC	Alanine	GAC	Aspartic Acid	GGC	Glycine	C		
	GUA	Valine	GCA	Alanine	GAA	Glutamic Acid	GGA	Glycine	A		
	GUG	Valine	GCG	Alanine	GAG	Glutamic Acid	GGG	Glycine	G		

┌───┐
┌───┐  
Codon
Amino acid

# A. MacDonald-Krietman type tests



First base	Second base								Third base
	U		C		A		G		
U	UUU	Phenylalanine	UCU	Serine	UAU	Tyrosine	UGU	Cysteine	U
	UUC	Phenylalanine	UCC	Serine	UAC	Tyrosine	UGC	Cysteine	C
	UUA	Leucine	UCA	Serine	UAA	Stop	UGA	Stop	A
	UUG	Leucine	UCG	Serine	UAG	Stop	UGG	Tryptophan	G
C	CUU	Leucine	CCU	Proline	CAU	Histidine	CGU	Arginine	U
	CUC	Leucine	CCC	Proline	CAC	Histidine	CGC	Arginine	C
	CUA	Leucine	CCA	Proline	CAA	Glutamine	CGA	Arginine	A
	CUG	Leucine	CCG	Proline	CAG	Glutamine	CGG	Arginine	G
A	AUU	Isoleucine	ACU	Threonine	AAU	Asparagine	AGU	Serine	U
	AUC	Isoleucine	ACC	Threonine	AAC	Asparagine	AGC	Serine	C
	AUA	Isoleucine	ACA	Threonine	AAA	Lysine	AGA	Arginine	A
	AUG	Start (Methionine)	ACG	Threonine	AAG	Lysine	AGG	Arginine	G
G	GUU	Valine	GCU	Alanine	GAU	Aspartic Acid	GGU	Glycine	U
	GUC	Valine	GCC	Alanine	GAC	Aspartic Acid	GGC	Glycine	C
	GUA	Valine	GCA	Alanine	GAA	Glutamic Acid	GGA	Glycine	A
	GUG	Valine	GCG	Alanine	GAG	Glutamic Acid	GGG	Glycine	G

Codon      Amino acid



# A. MacDonal-Krietman type tests

## $K_a/K_s$ Test

Nonsynonymous substitutions

$K_a$

Synonymous substitutions

$K_s$

- Uses coding sequence (sequence that codes proteins)
- Controls for max possible rate of each type of substitution
- $K_s$  doesn't change protein so is "neutral" and is used as baseline rate
- Important to remember that both types of mutations occur at the same rate, it is fixation rate that varies.

# A. MacDonal-Krietman type tests

## $K_a/K_s$ Test

Nonsynonymous substitutions

$K_a$

Synonymous substitutions

$K_s$

- $K_a/K_s = 1$  — Neutral drift. Protein changes aren't being selected for or against.
- $K_a/K_s > 1$  — Positive selection. Protein changes are being selected for
- $K_a/K_s < 1$  — Purifying selection. Protein changes are being selected against.

# A. MacDonal-Krietman type tests

## $K_a/K_s$ Test

Nonsynonymous substitutions

$K_a$

Synonymous substitutions

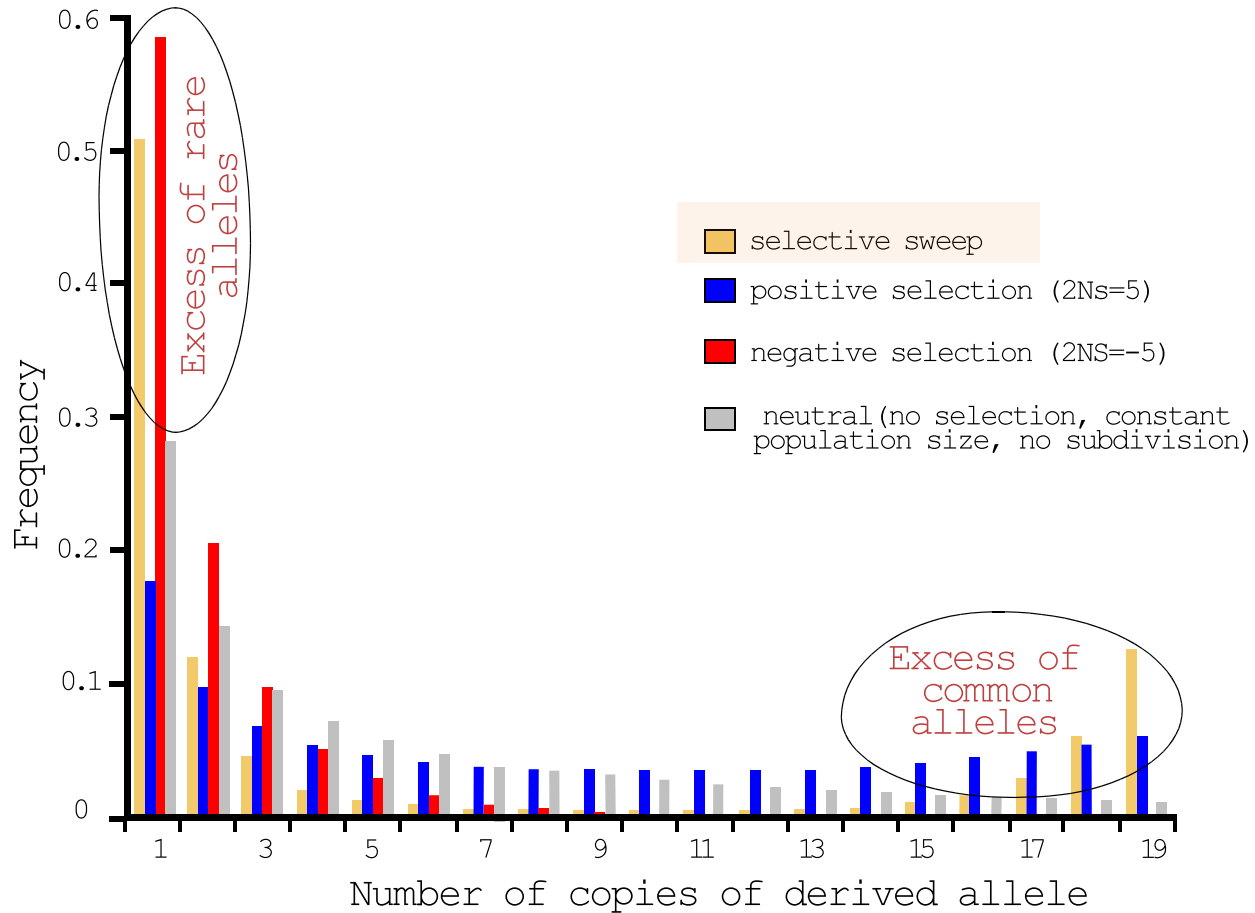
$K_s$

- Can be done with single sequences per species/group (don't need population genetics data)
- Can pinpoint where selection occurred on a phylogeny
- Proteins very rarely have  $K_a/K_s > 1$  for their entire sequence, often only small pieces or single codons are under selection
  - Proteins with  $K_a/K_s > 1$  are often under diversifying selection, e.g. immune or self-incompatibility genes

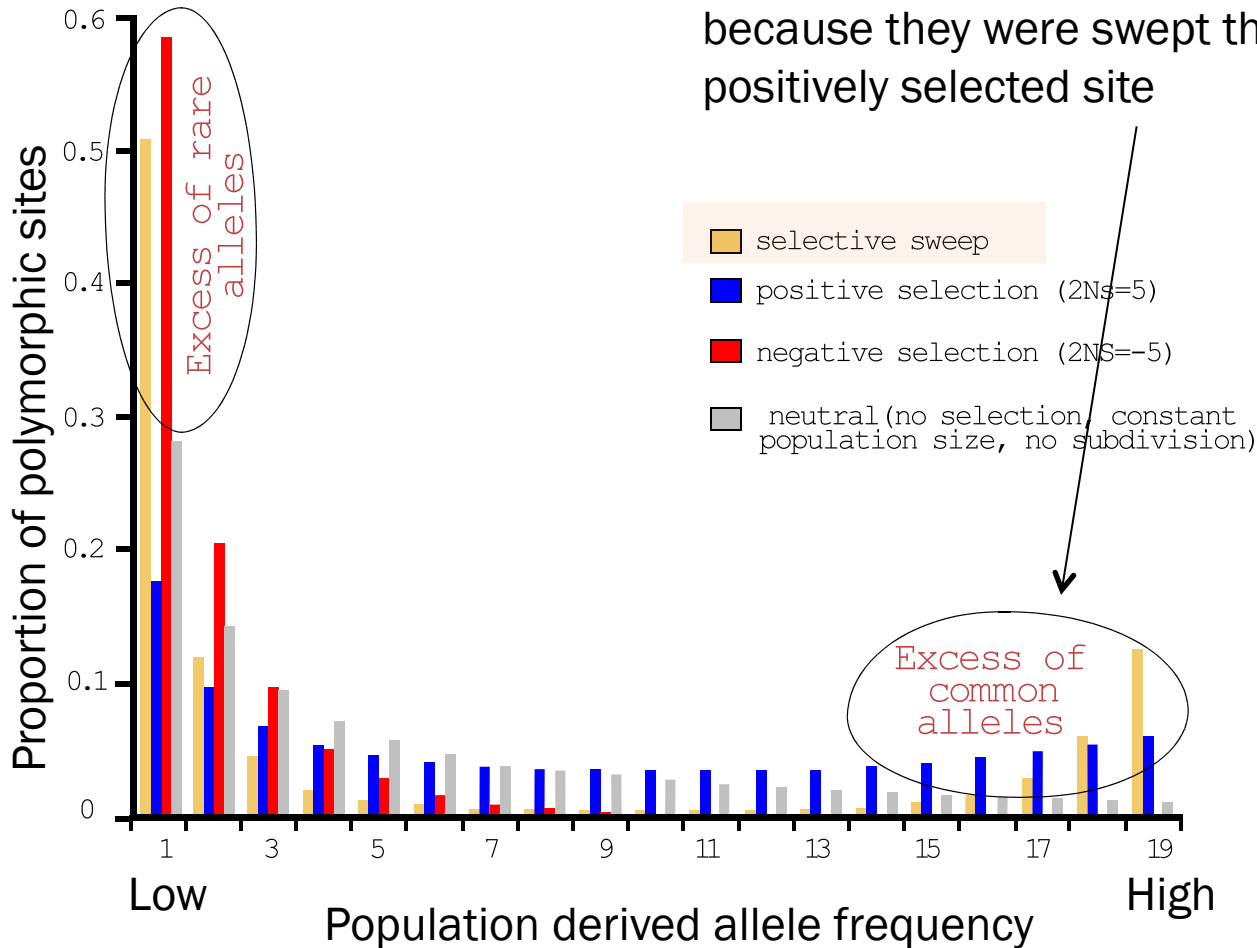
# B. Site Frequency Spectrum

- Selection affects the distribution of alleles within populations
- Method examines site frequency spectrum and compares to neutral expectations
- Could be applied to a single locus. Now used often for genomic scans for selective sweeps

# B. Site Frequency Spectrum



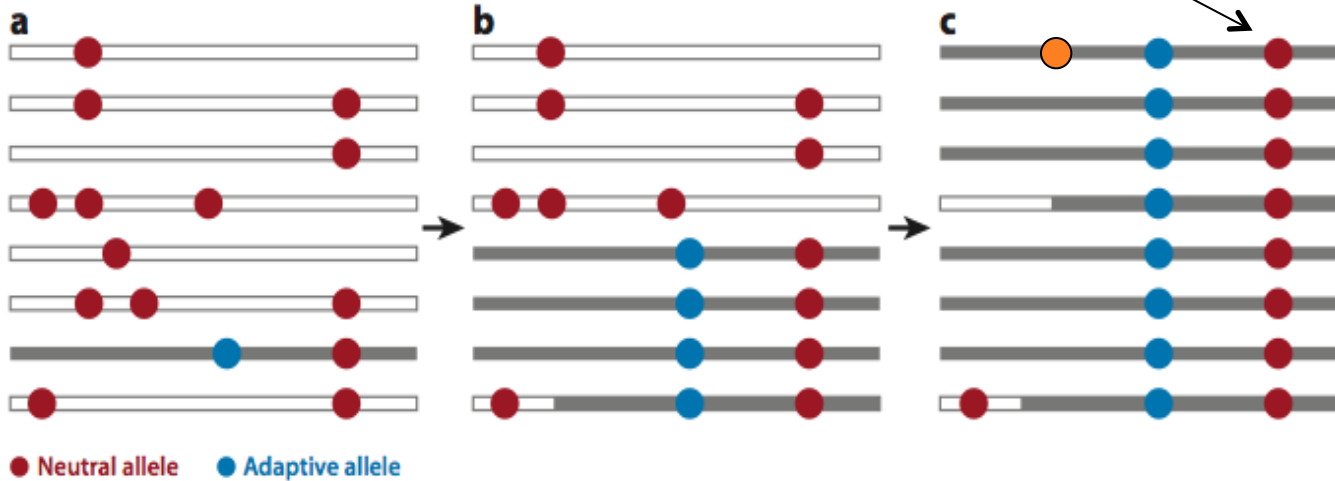
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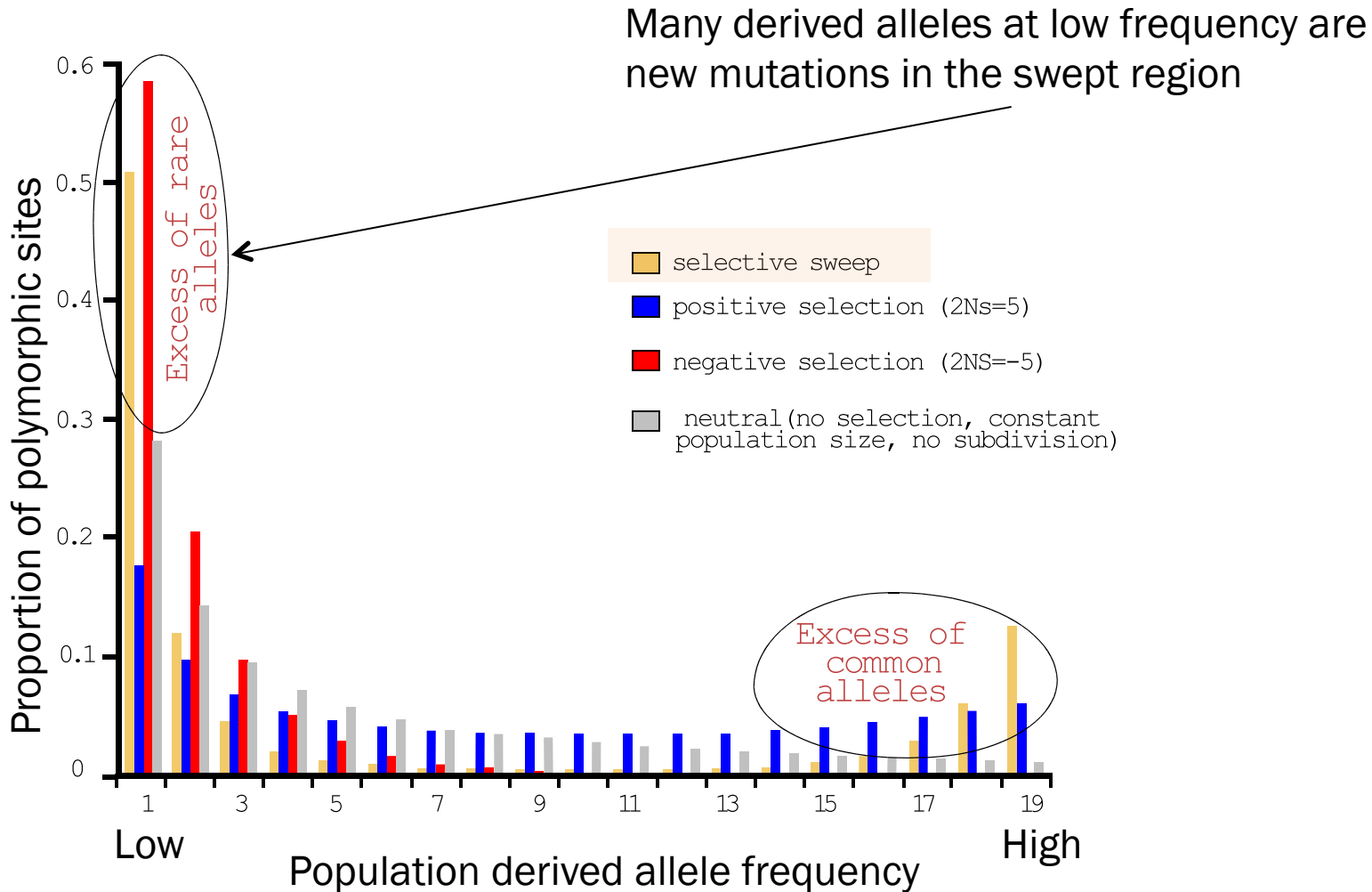
Many derived alleles at high frequency because they were swept there with the positively selected site

# B. Site Frequency Spectrum

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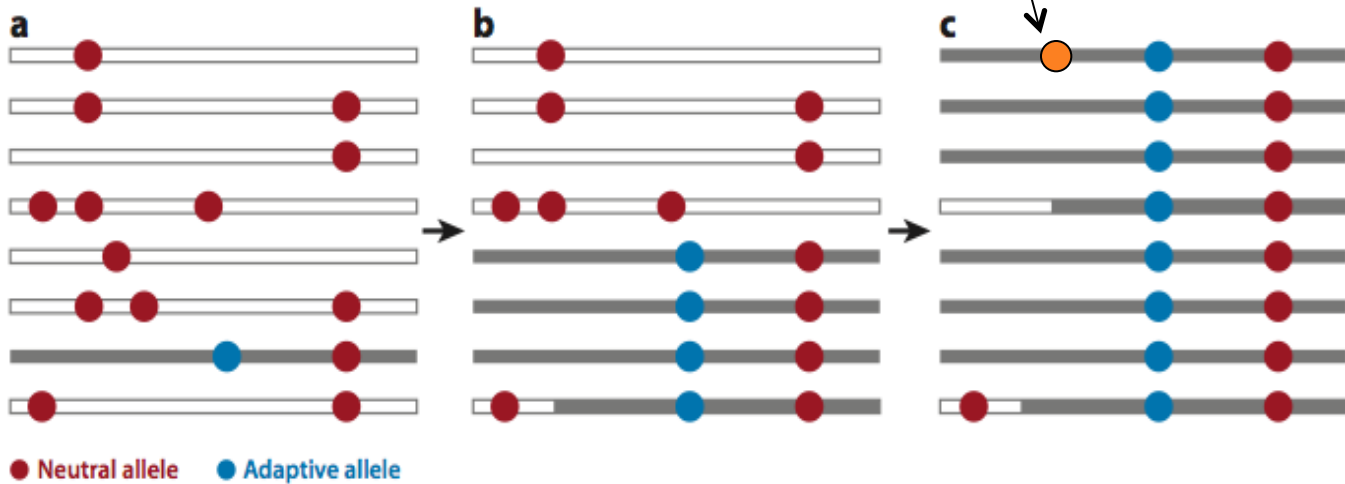
# B. Site Frequency Spectrum





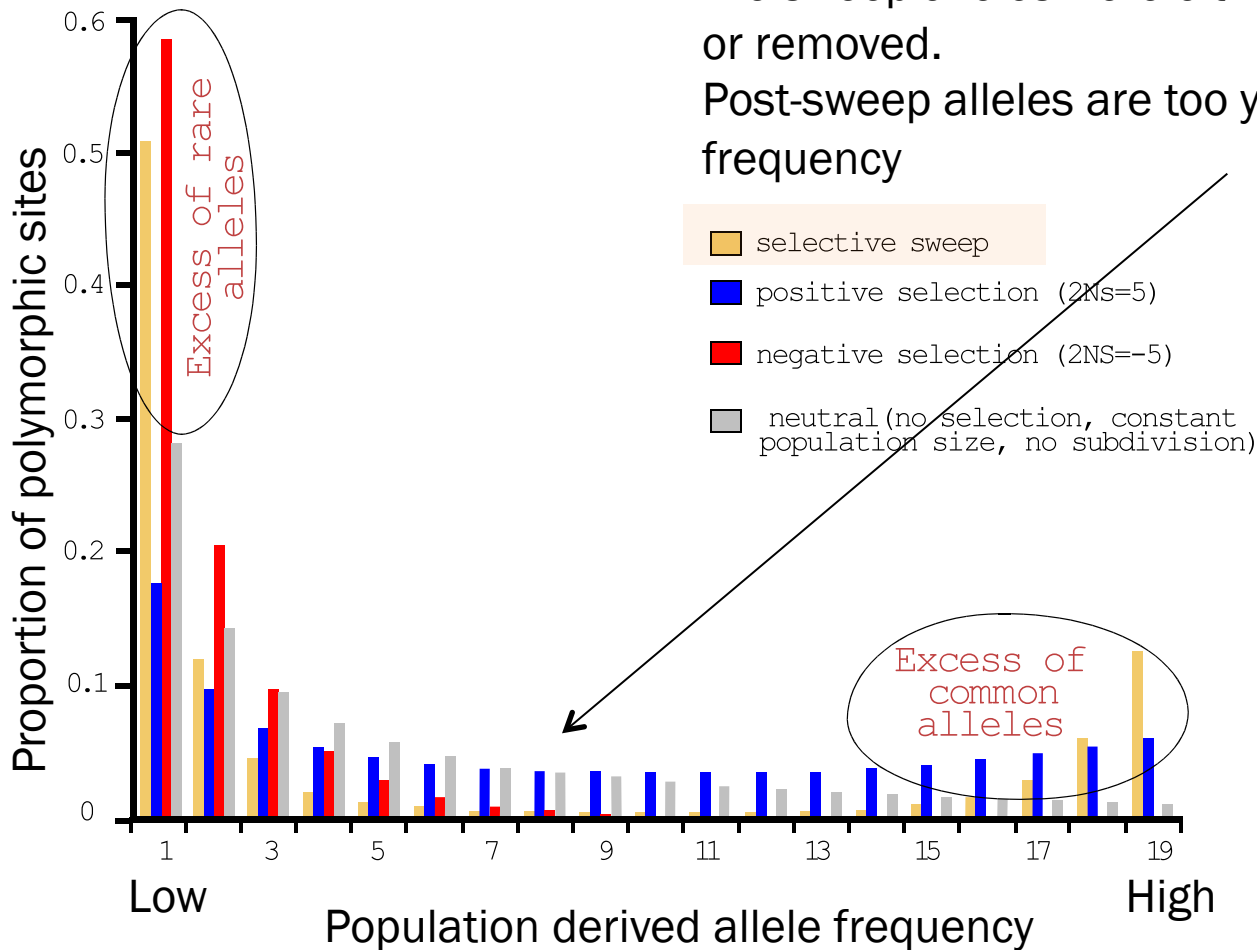
# B. Site Frequency Spectrum

Many derived alleles at low frequency are new mutations in the swept region



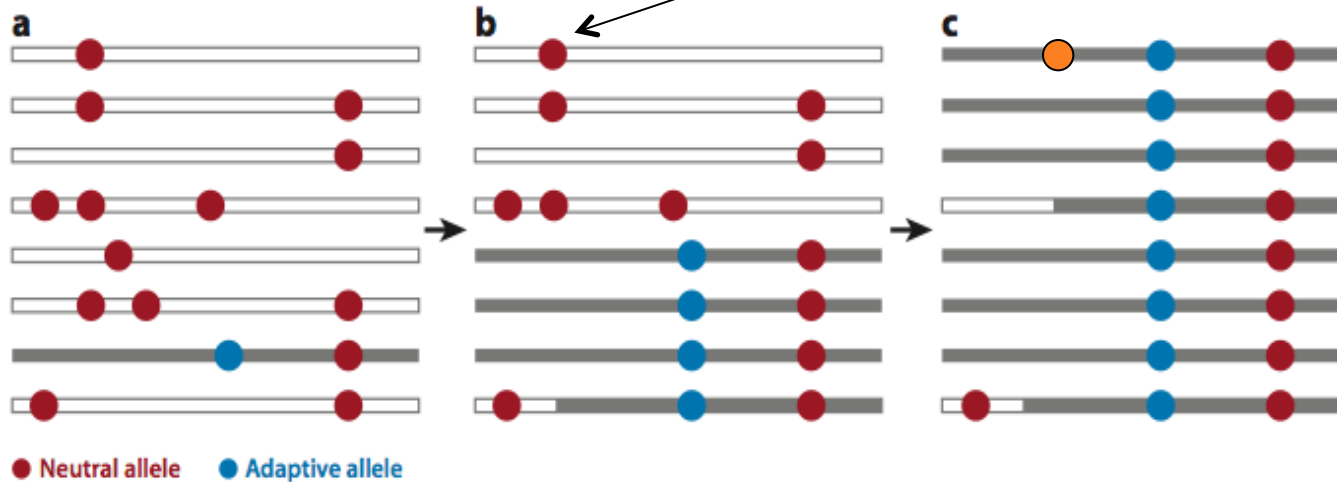
# B. Site Frequency Spectrum

Few medium frequency derived alleles.  
Pre-sweep alleles were either swept to high frequency or removed.  
Post-sweep alleles are too young to reach medium frequency

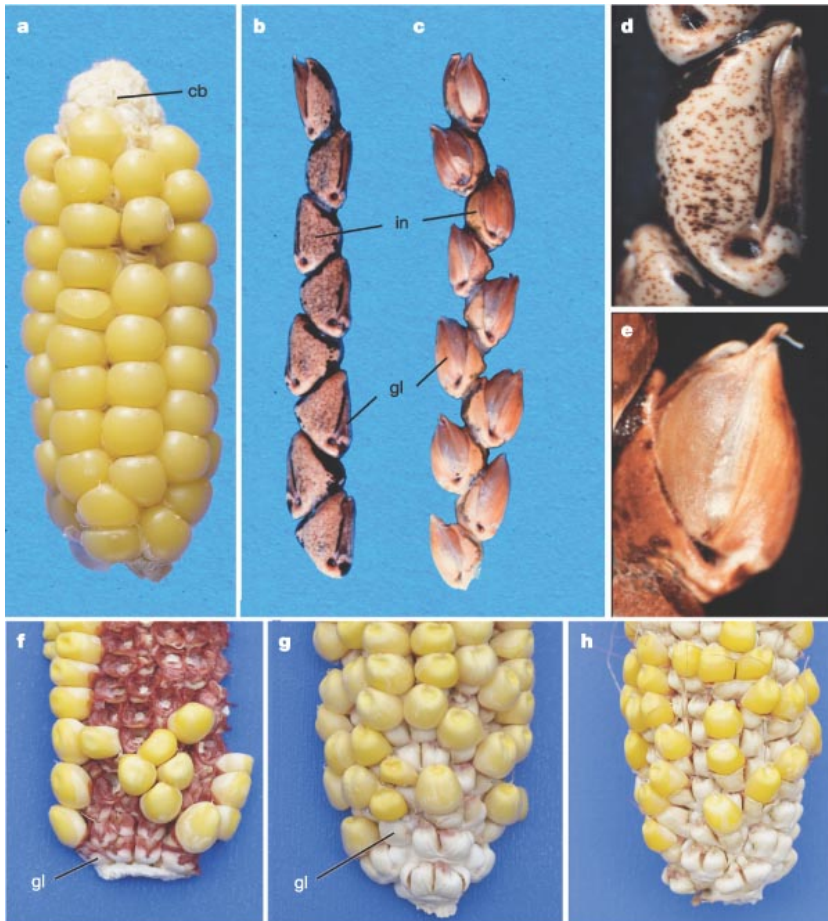


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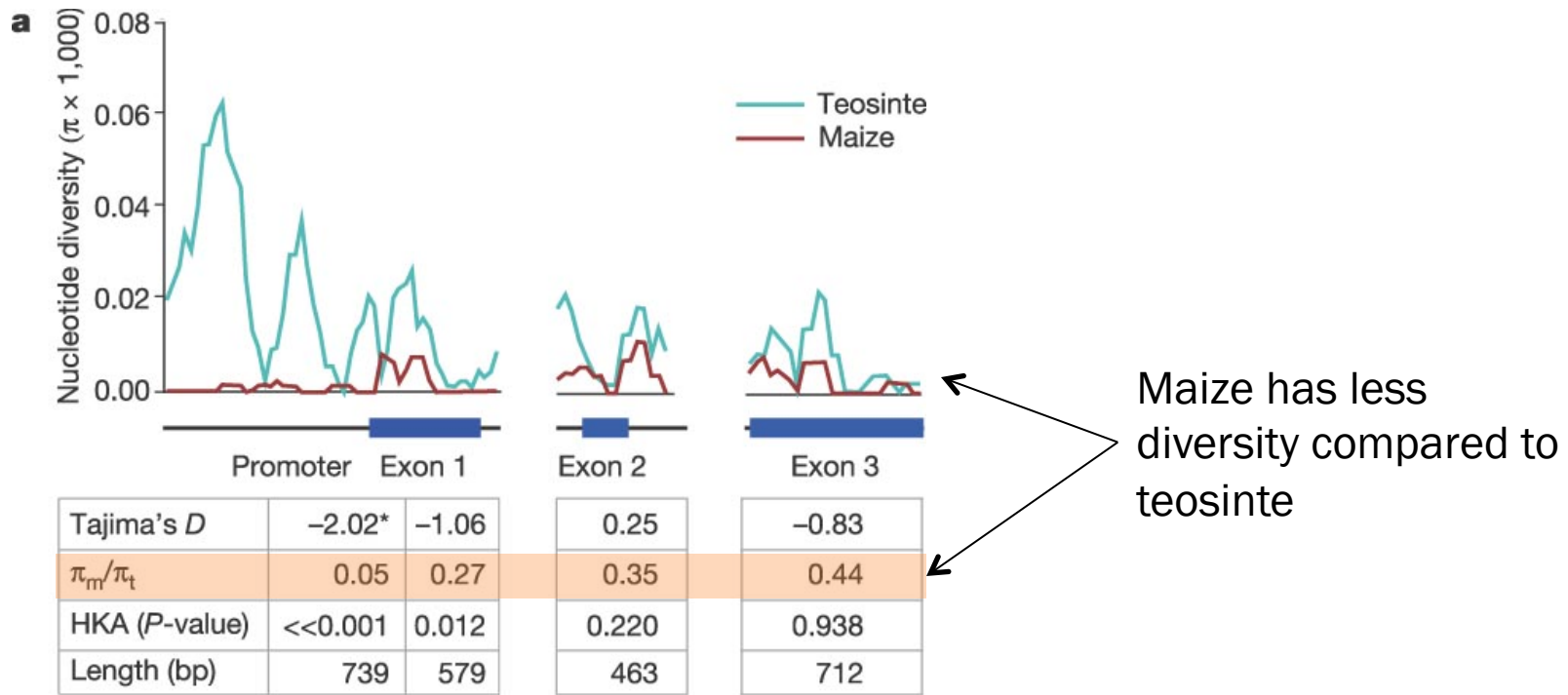
# Maize cupulate fruitcase genetics



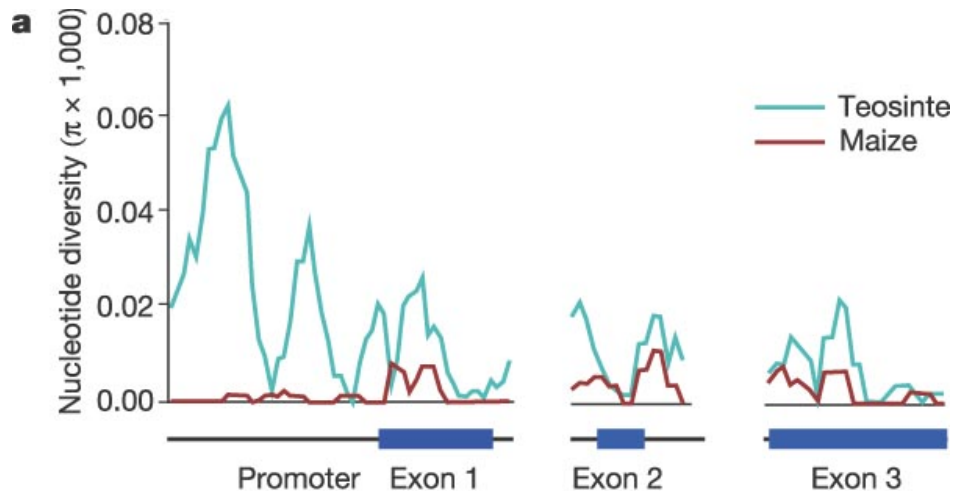
Wildtype teosinte hard fruitcase

Teosinte with maize *tga1* gene

# Maize cupulate fruitcase genetics



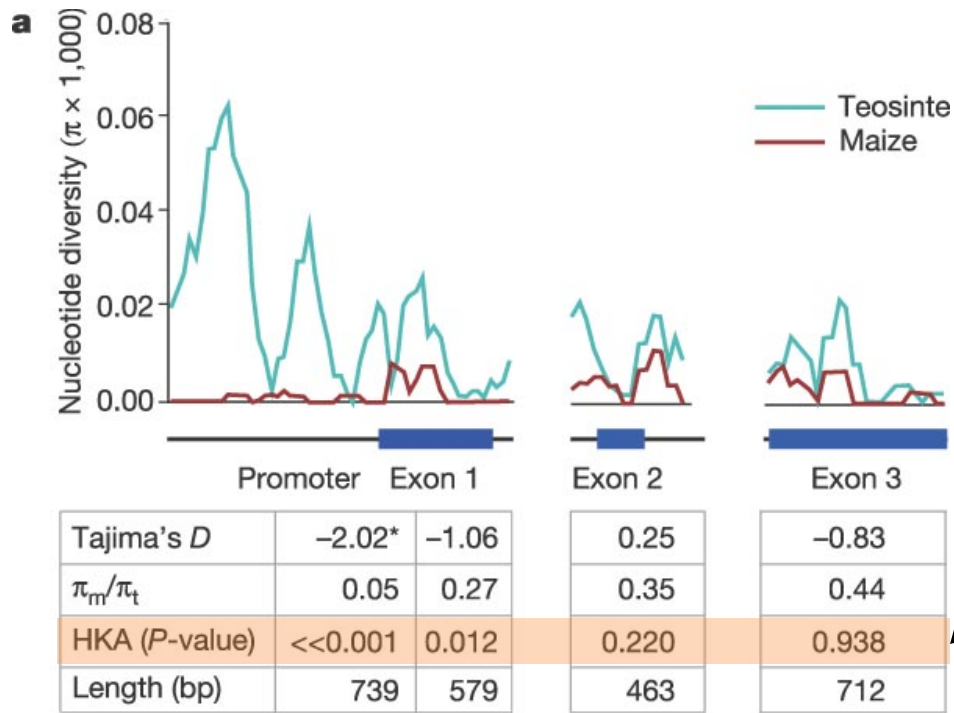
# Maize cupulate fruitcase genetics



Tajima's $D$	-2.02*	-1.06	0.25	-0.83
$\pi_m/\pi_t$	0.05	0.27	0.35	0.44
HKA ( $P$ -value)	<<0.001	0.012	0.220	0.938
Length (bp)	739	579	463	712

Tajima's  $D$  looks at site frequency spectrum. Negative values suggests many rare polymorphisms, which occurs during positive selection.

# Maize cupulate fruitcase genetics



HKA asks if there is more divergence between species than would be expected by the amount of polymorphism in the species

# C. Linkage Disequilibrium (LD)

- The nonrandom association of alleles from different loci
- Levels of linkage disequilibrium will increase during selective sweeps
  - As a new mutation rises in frequency, it will drag along linked sites
  - This haplotype block will have high LD until recombination breaks it up over time

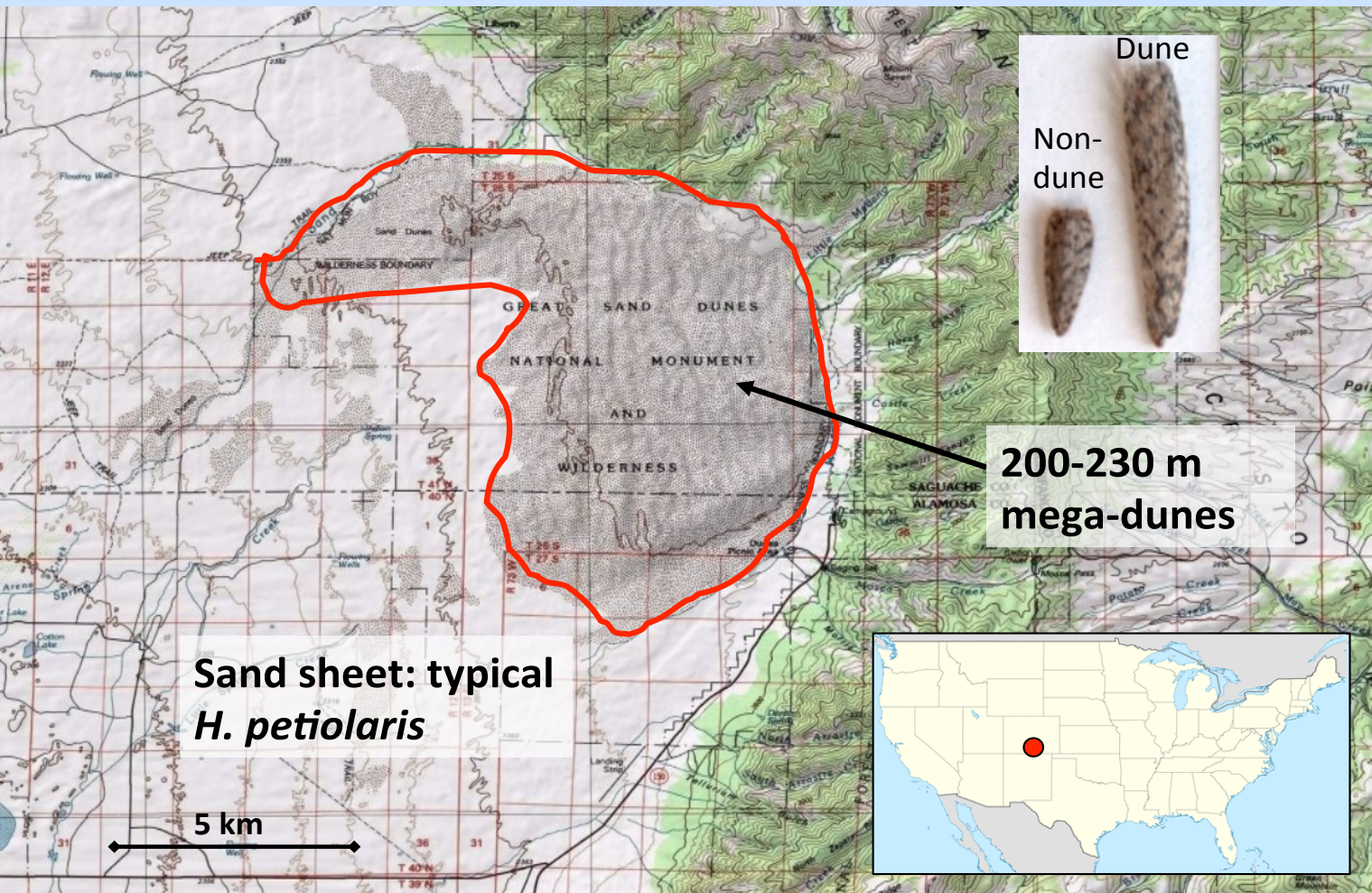


# D. Population Differentiation: Lewontin-Krakauer Methods

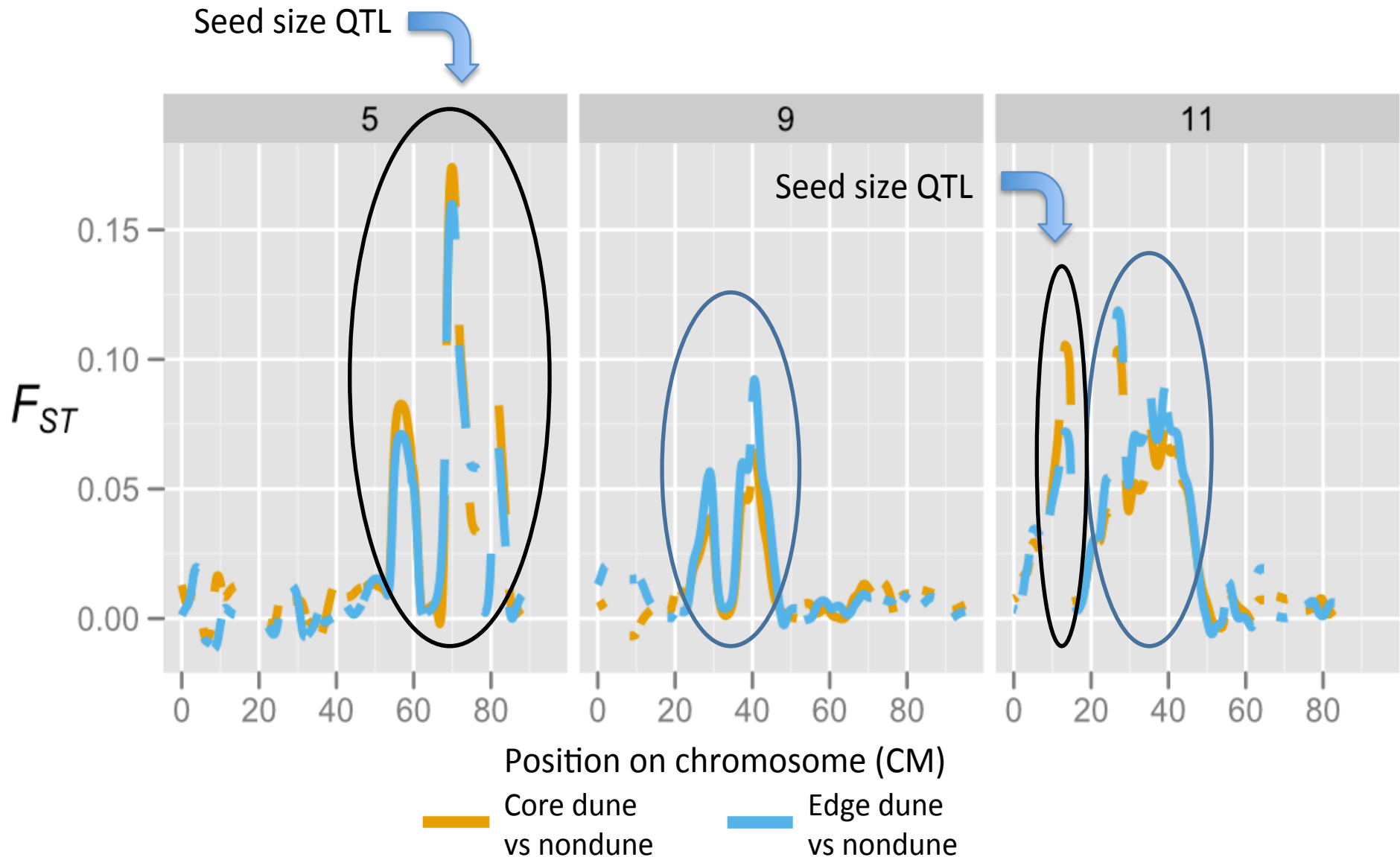
- Selection will often increase the degree of genetic distance between populations
- Compute pairwise genetic distances (*e.g.*,  $F_{ST}$ ) for many loci between populations
- When a locus shows extraordinary levels of genetic distance relative to other loci, this “outlier” locus is a candidate for positive selection

# Example of Genome Scan Approach in Sunflowers

Study System: Dune Sunflowers from Great Sand Dunes NP, CO



# Four regions of differentiation



# Unanswered questions

- What are the genes that underlie adaptation?
- Is it many genes or a few?
- How repeatable is the genetics of adaptation?
- Do adaptive mutations occur in coding or regulatory regions?
- What is the effect size adaptive alleles?
- What role does linkage play in adaptation?
- De novo mutations or standing genetic variation?