

## L5. Quantitative population genetics

### OVERVIEW

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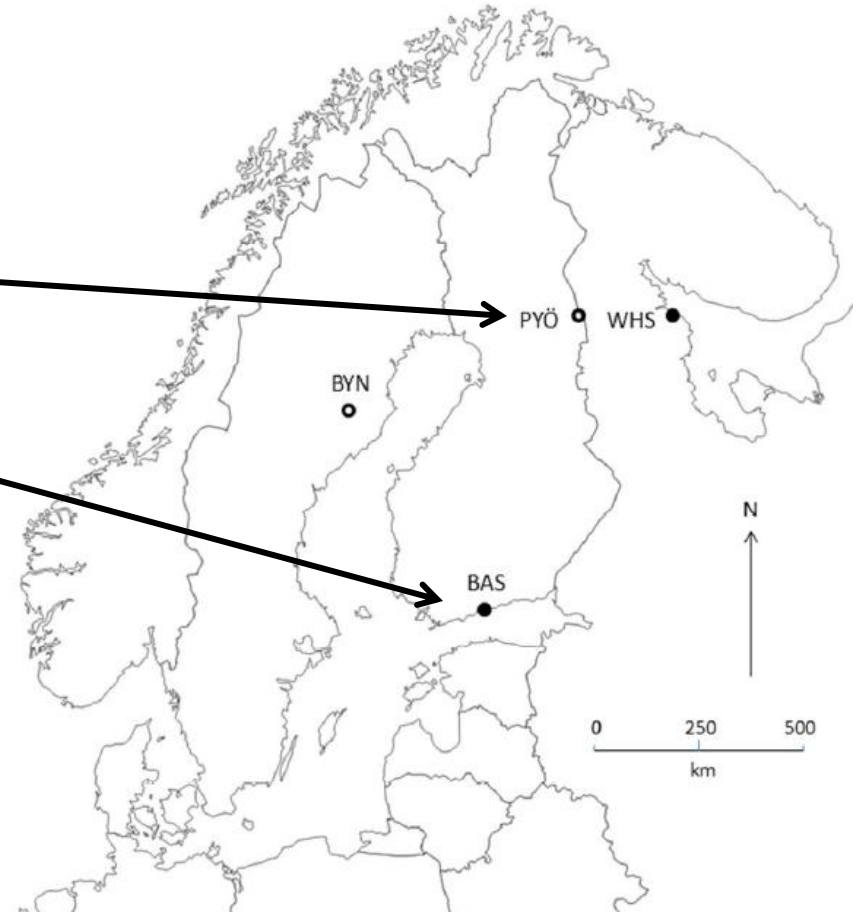
- . L1. Approaches to ecological modelling
- . L2. Model parameterization and validation
- . L3. Stochastic models of population dynamics (math)
- . L4. Animal movement (math + stat)
- . L5. Quantitative population genetics (math + stat)
- . L6. Community ecology (stat)

# There is variation among individuals

This nine-spined stickleback originates from Pond Pyöreälampi population



This nine-spined stickleback originates from the Baltic Sea population



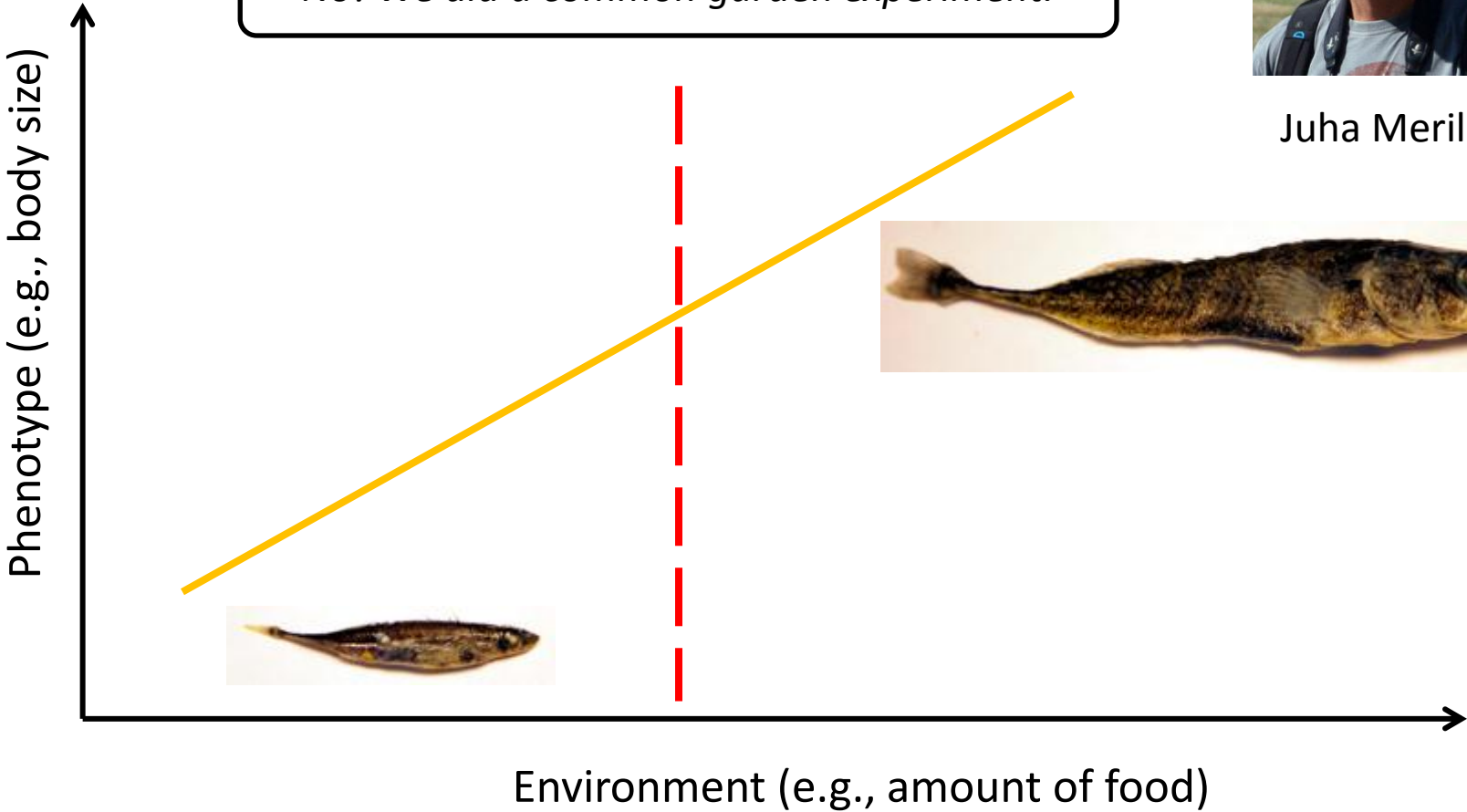
**Why are they different?**

# Environmental effect?

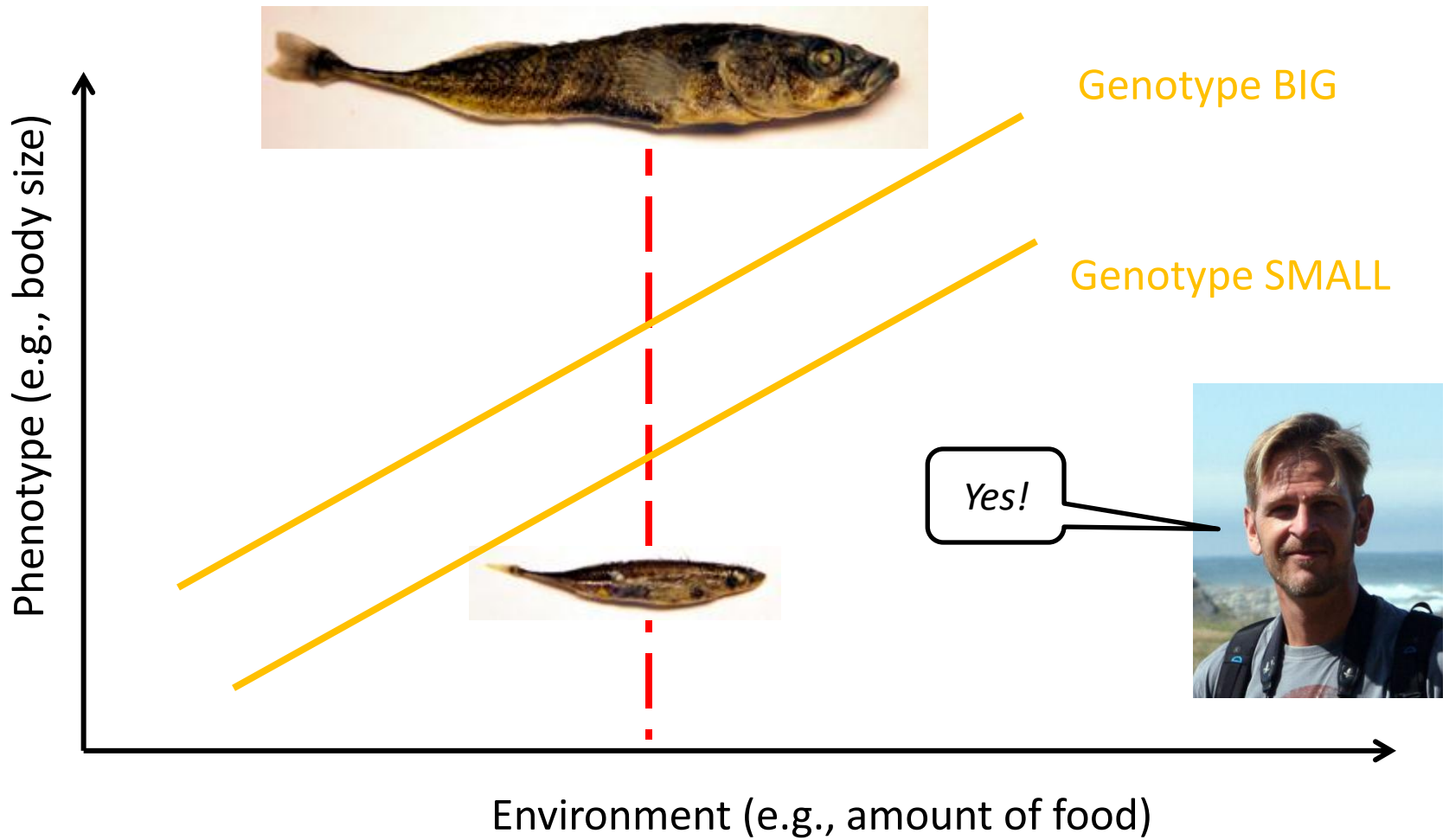


Juha Merilä

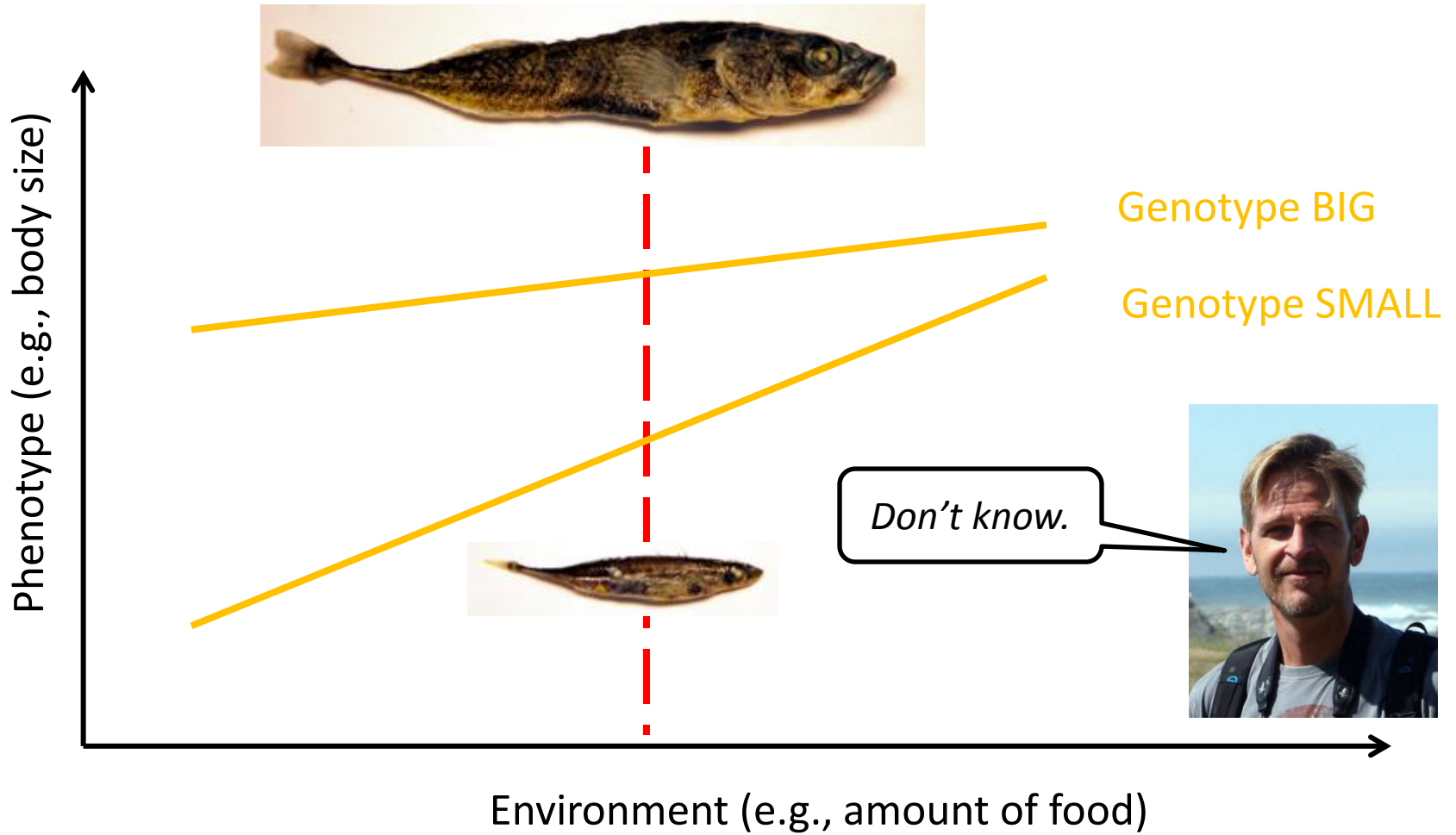
*No! We did a common garden experiment.*



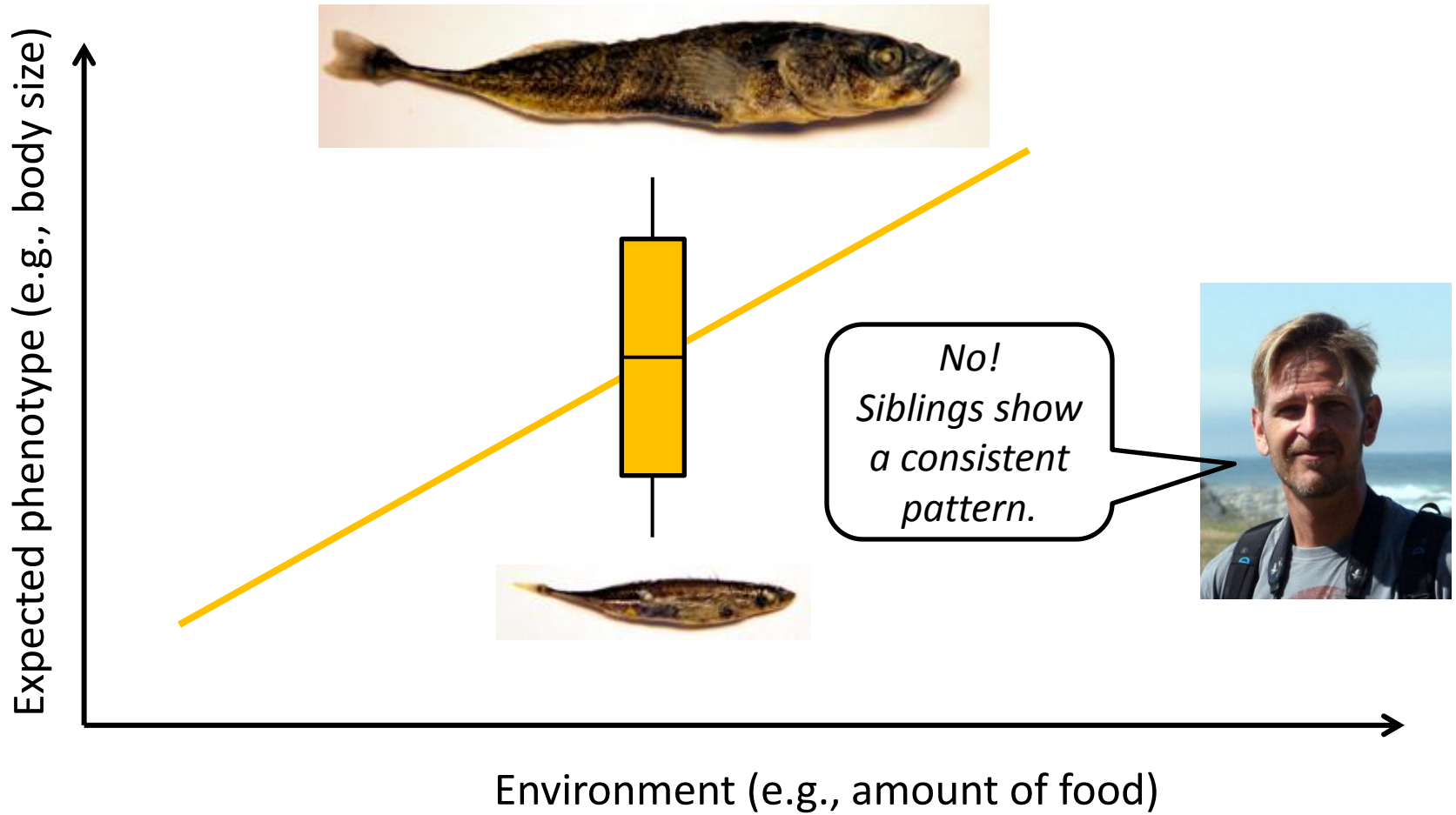
# Environmental + genetic effect?



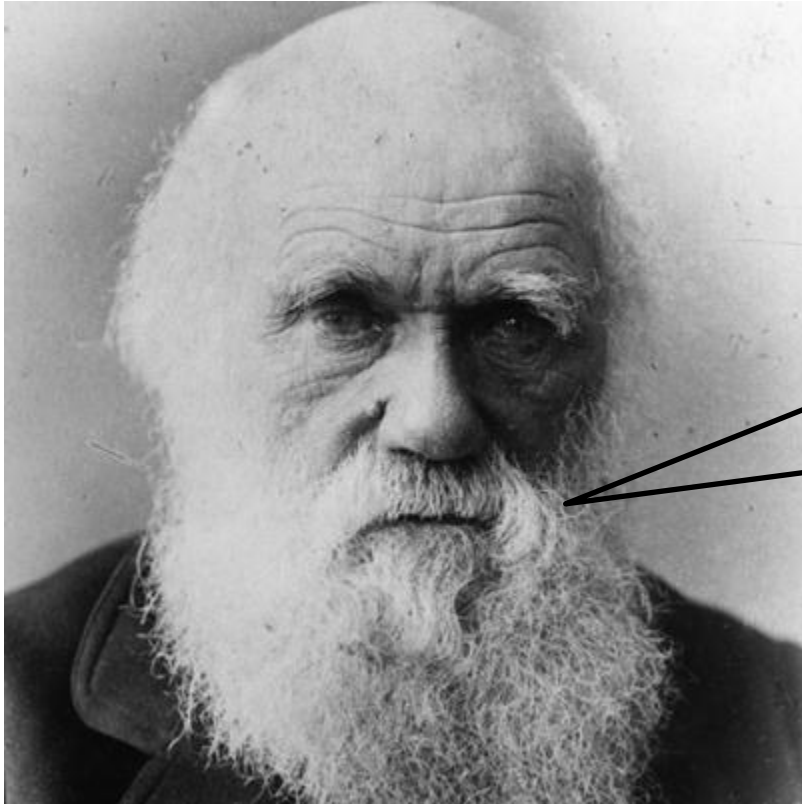
# Environmental | genetic effect?



# Developmental instability?



# Why is there a genetic difference?



*Natural selection.*

*Survival of the  
fittest!*

Charles Darwin(1809-1882)

# Natural selection?



*The fish are different because of local adaptation.*

*Small fish are better in escaping predators (important in sea), big fish are better in competing for food (important in ponds).*

Juha Merilä



# Not only natural selection?



Sewall Wright (1889-1988)

*Mutation, migration  
and genetic drift.*

*Adaptive landscapes.*

# Genetic drift?



*Maybe the fish are different just by chance?*

*Could the difference be generated by the random assortment of genes from parents to offspring?*

Juha Merilä

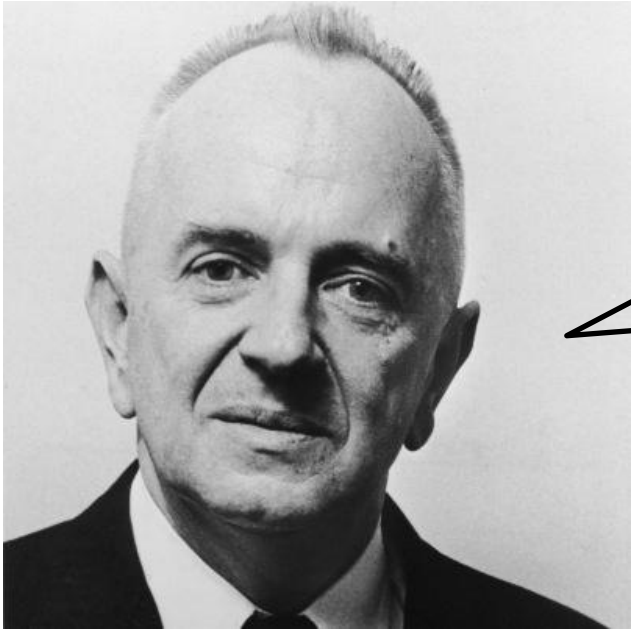
# Is drift a plausible hypothesis?



Ronald Fisher (1890-1962)

*Most natural populations are too large for drift to be important.*

# Is drift a plausible hypothesis?



*Drift can still be important in genetically isolated sub-populations.*

Theodosius Dobzhansky (1900-1975)

# Genetic drift?



*I am studying genetically isolated sub-populations, so drift could be a plausible explanation...*

Juha Merilä

To separate drift and selection,  
we need quantitative tools



Russel Lande

*Quantitative genetics  
for evolutionary  
biology of natural  
populations.*



# How does one apply quantitative genetics theory in practice?



Juha Merilä

*Hire a student  
PhD student*



Markku Karhunen

# Statistical methods for detecting signals of natural selection in the wild

(PhD dissertation in Helsinki, 18<sup>th</sup> October 2013)



Markku Karhunen

I. Ovaskainen, Karhunen, Zheng, Cano Arias and Merilä, *Genetics* 2011

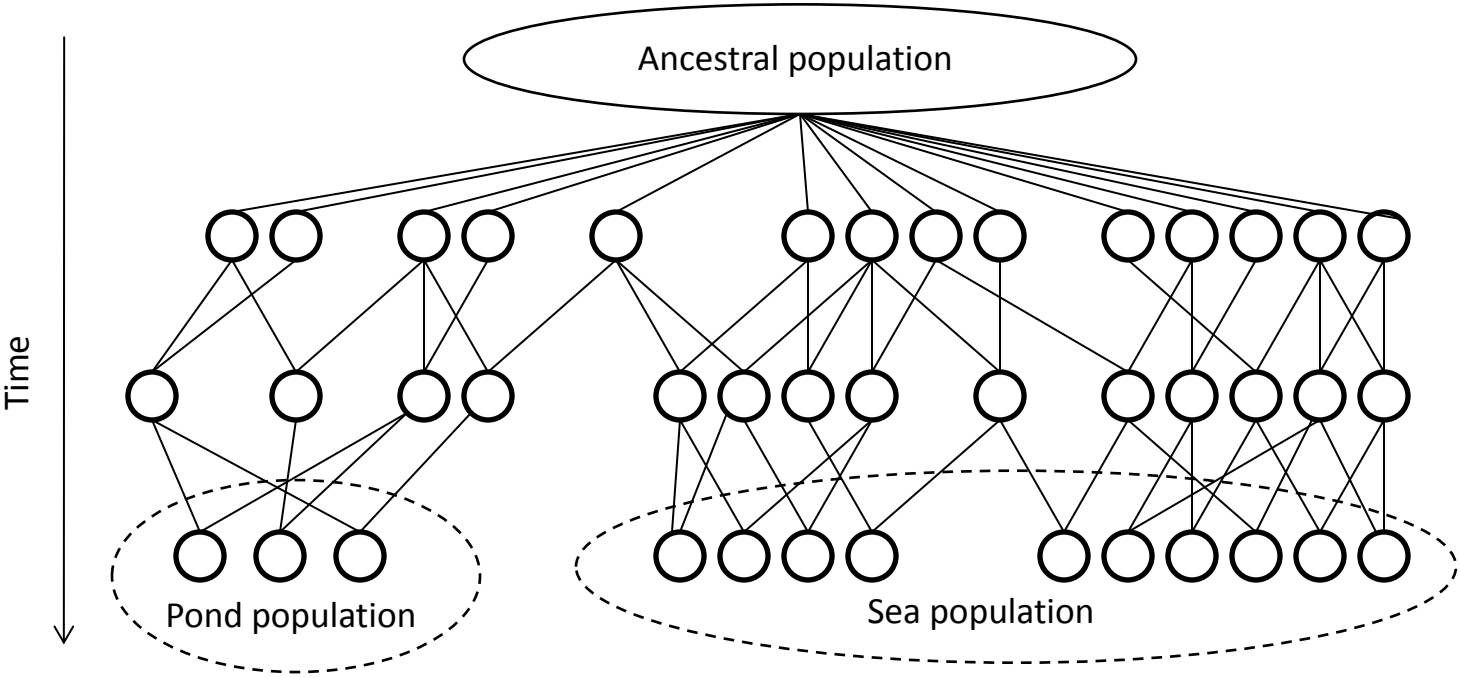
II. Karhunen and Ovaskainen, *Genetics* 2012

III. Karhunen, Merilä, Leinonen, Cano Arias and Ovaskainen, *Molecular Ecology Resources* 2013

IV. Karhunen, Ovaskainen, Herczeg and Merilä, *Evolution* (in press)



# Genetic differentiation by drift or selection?

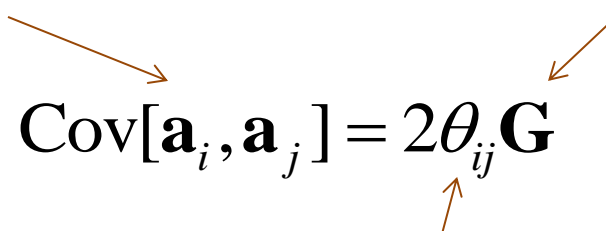


# Null model: what happens under neutrality?

Related individuals resemble each other:

Breeding values of individuals  $i$  and  $j$

Amount of additive variance


$$\text{Cov}[\mathbf{a}_i, \mathbf{a}_j] = 2\theta_{ij} \mathbf{G}$$

Coancestry (relatedness) between individuals  $i$  and  $j$

Related populations resemble each other:

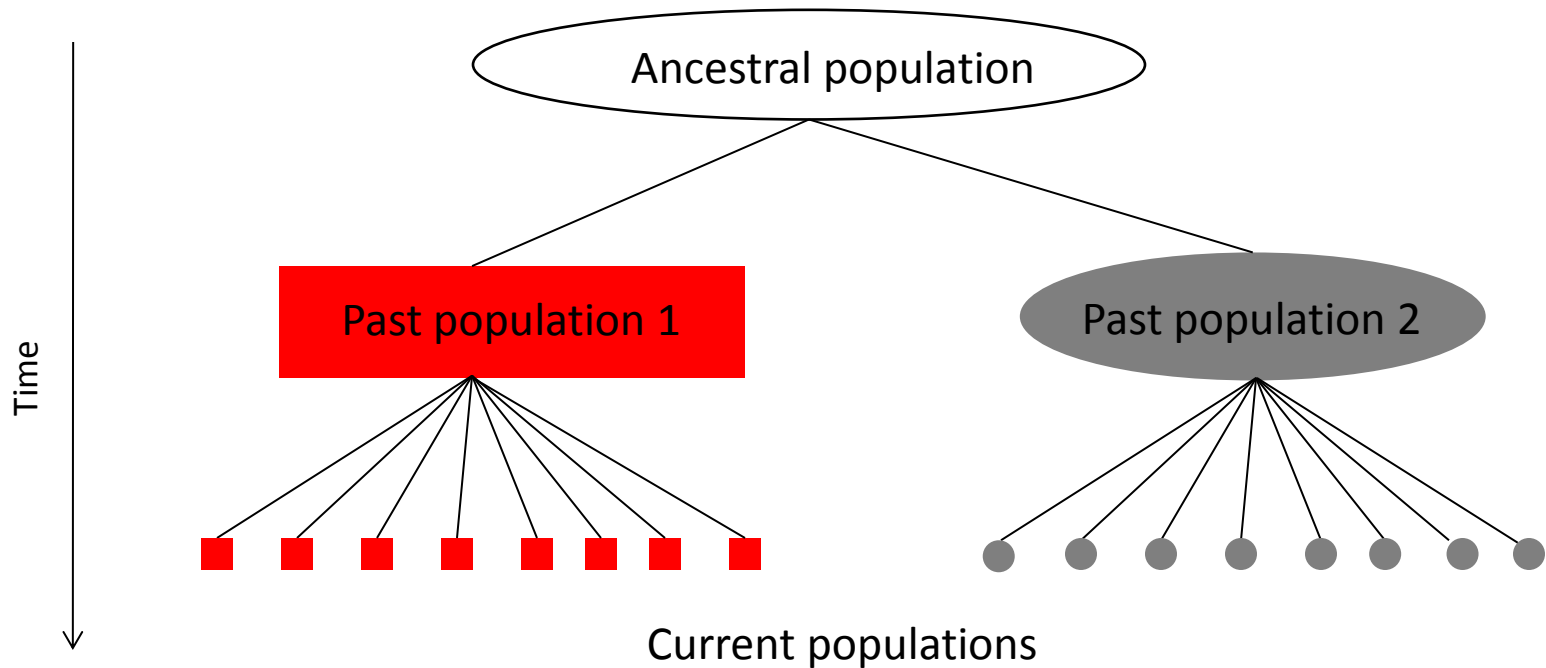
MEAN breeding values in POPULATIONS  $A$  and  $B$


$$\text{Cov}[\mathbf{a}_A, \mathbf{a}_B] = 2\theta_{AB} \mathbf{G}$$

MEAN coancestry (relatedness) between individuals in POPULATIONS  $A$  and  $B$

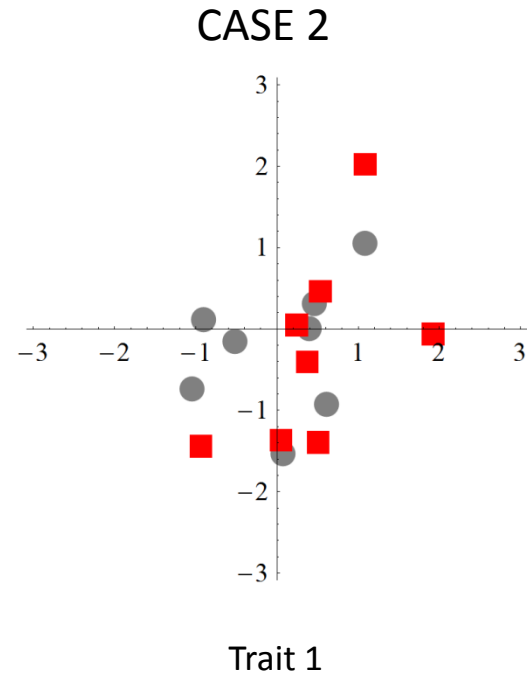
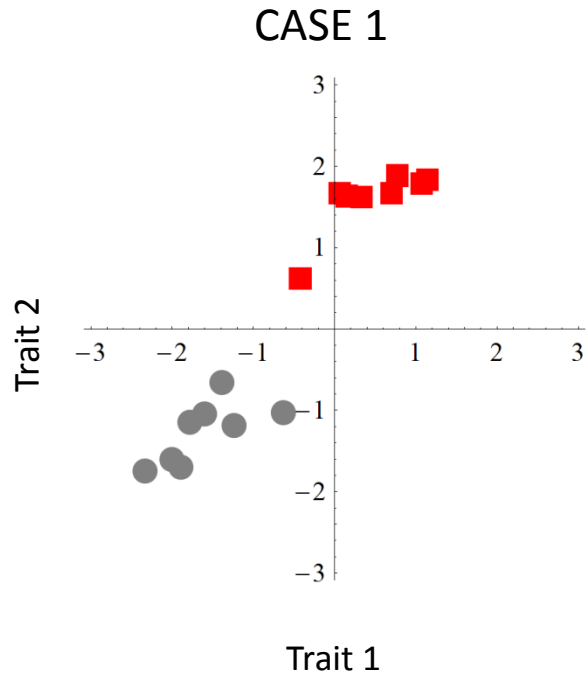
# Exercise: what happens under drift?

Assume that neutral molecular data tells that in terms of coancestry the populations form 2 groups:



# Exercise: what happens under drift?

Which of these patterns is more likely to have evolved due to random genetic drift?



Related populations resemble each other:  $\text{Cov}[\mathbf{a}_A, \mathbf{a}_B] = 2\theta_{AB} \mathbf{G}$

# How to turn the eyeballing exercise into a statistical test?

Assume  $\text{Cov}[\mathbf{a}_A, \mathbf{a}_B] = 2\theta_{AB}\mathbf{G}$  and e.g. normally distributed traits. Then

Vector of population means

Matrix of ancestral genetic variances and co-variances

$$\mathbf{A}^{\mathcal{P}} \sim N\left(\boldsymbol{\mu} \otimes \mathbf{I}_{n_{\mathcal{P}}}, 2\mathbf{G}^{\mathcal{A}} \otimes \boldsymbol{\theta}^{\mathcal{P}}\right).$$

Overall mean

Population-to-population relatedness matrix

S-statistic (based on Mahalanobis distance): does the observed vector of population means fit into the “core” of this distribution or is it an “outlier”?

S close to 0: stabilizing selection

S close to 1: diversifying selection

S close to 0.5: drift plausible

# How does this relate to FST-QST tests?

- FST: population divergence in neutral markers
- QST: population divergence in quantitative traits
- FST < QST: diversifying selection
- FST > QST: stabilizing selection
- FST = QST: drift plausible

$$\text{Cov}[\mathbf{a}_A, \mathbf{a}_B] = 2\theta_{AB} \mathbf{G}$$

The diagram illustrates the relationship between FST and QST in the equation  $\text{Cov}[\mathbf{a}_A, \mathbf{a}_B] = 2\theta_{AB} \mathbf{G}$ . A yellow box labeled "QST" has two arrows pointing to  $\theta_{AB}$  and  $\mathbf{G}$ . A yellow box labeled "FST" has an arrow pointing to  $\theta_{AB}$ .

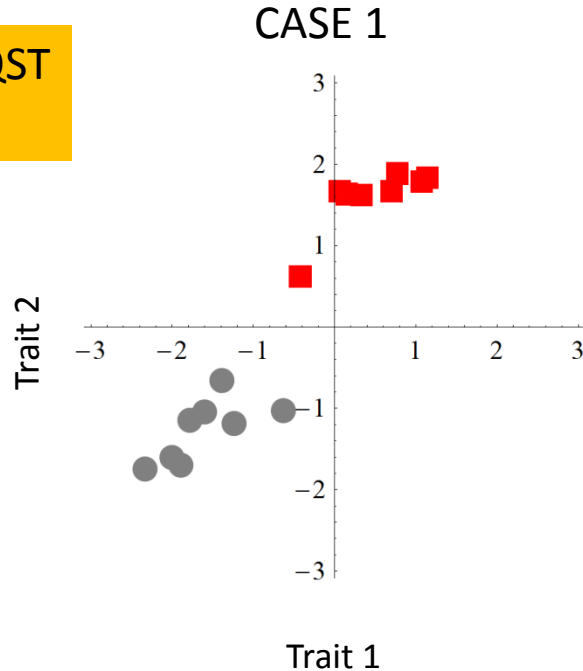
Unlike FST-QST tests, this equation

- accounts for evolutionary stochasticity
- utilizes population-specific information
- extends naturally to multivariate traits

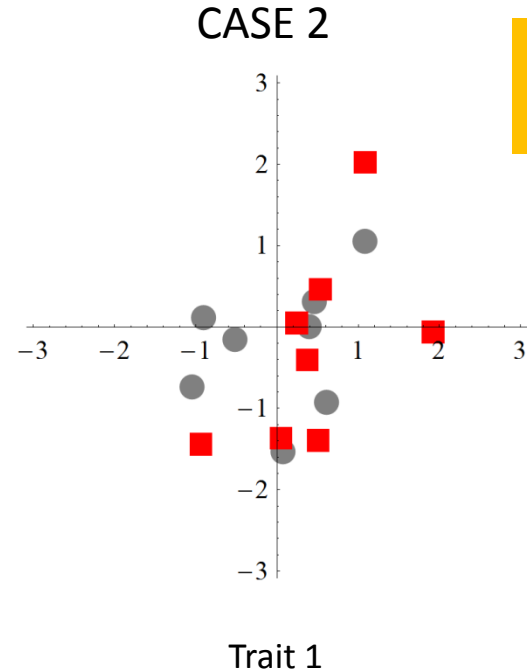
# Exercise: what happens under drift?

Which of these patterns is more likely to have evolved due to random genetic drift?

$F_{ST}=Q_{ST}$   
 $S=0.5$

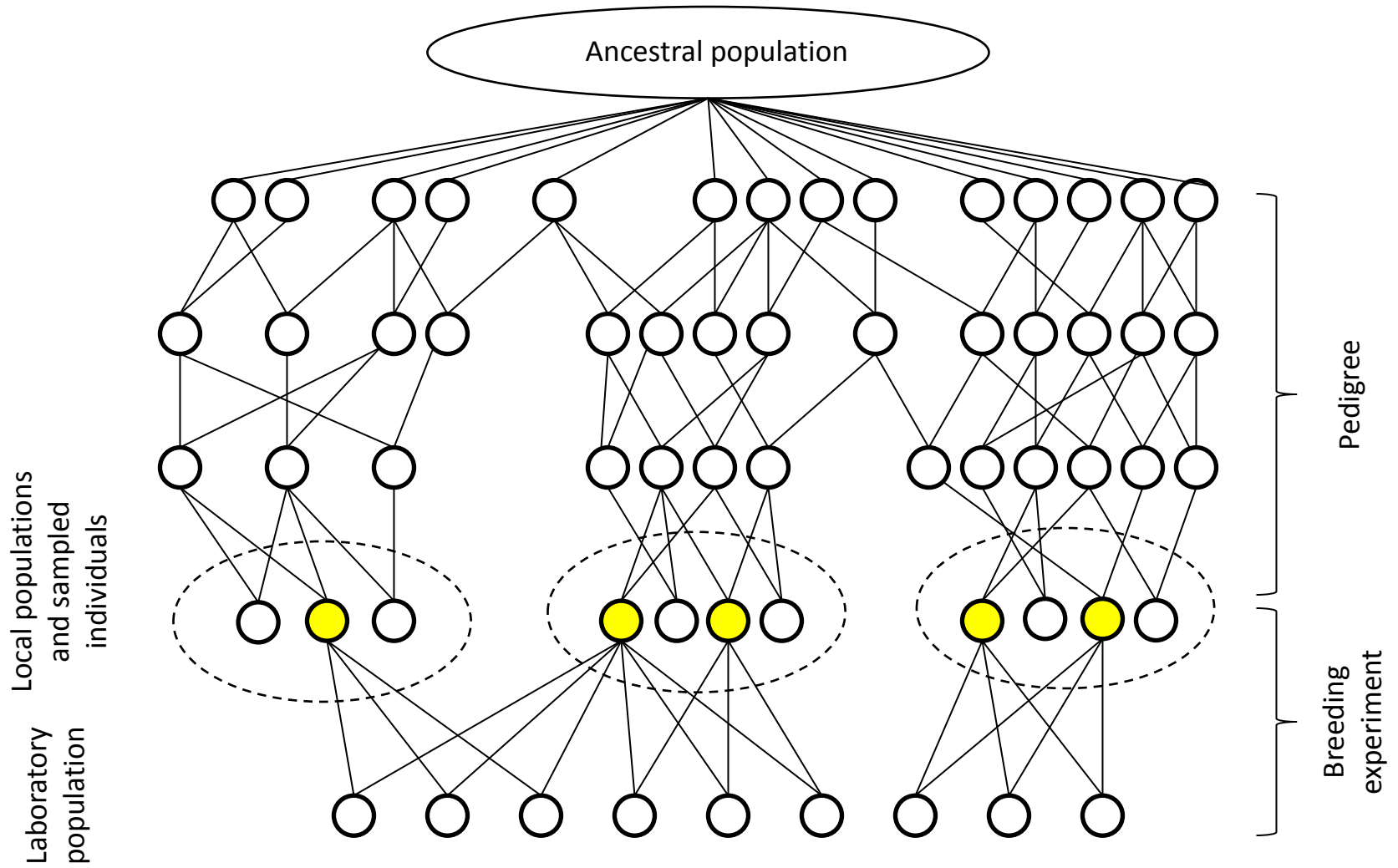


$F_{ST}=Q_{ST}$   
 $S>0.99$



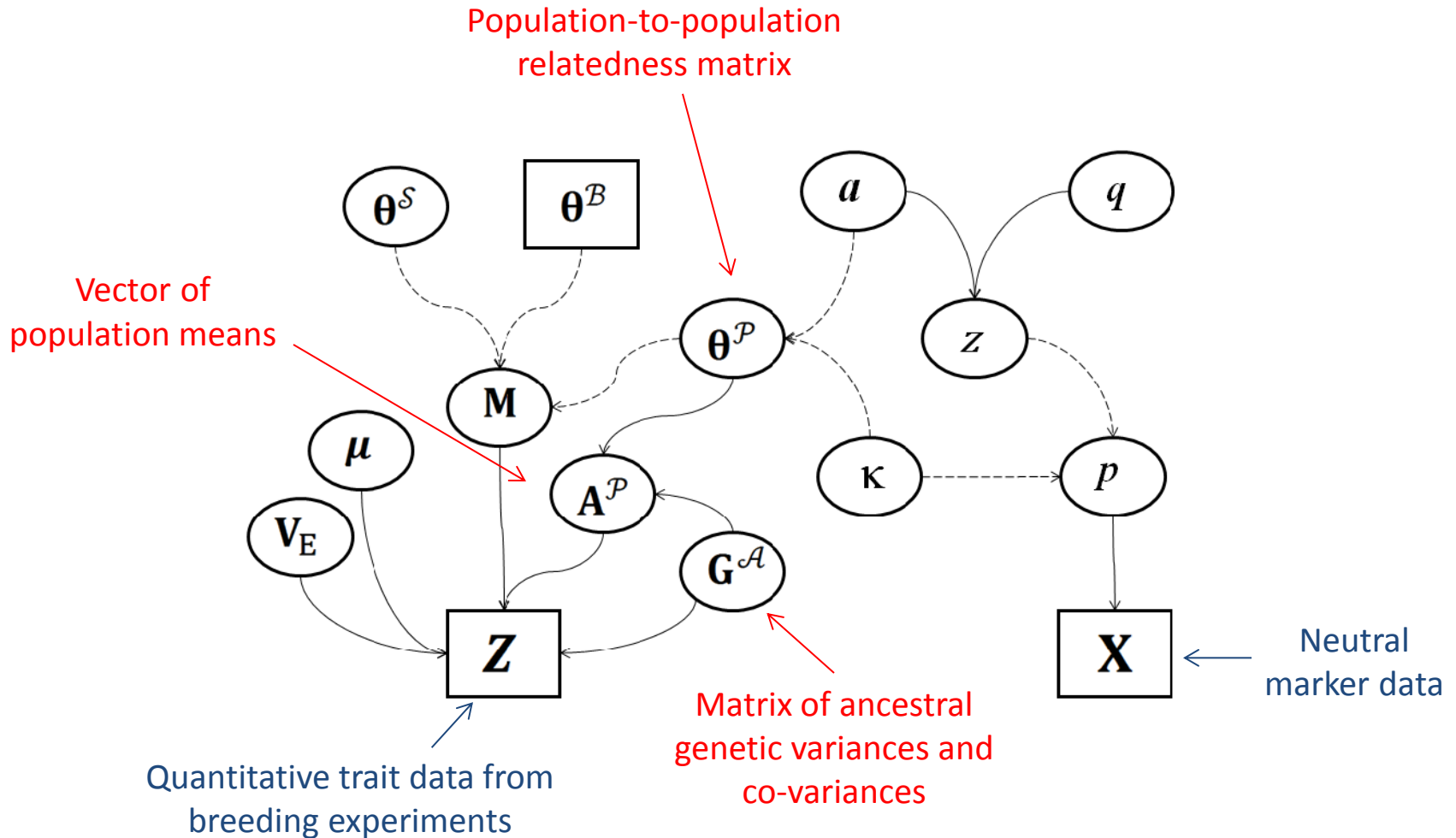
Related populations resemble each other:  $\text{Cov}[\mathbf{a}_A, \mathbf{a}_B] = 2\theta_{AB} \mathbf{G}$

# Data: neutral markers + quantitative traits





# Parameter estimation with a Bayesian approach



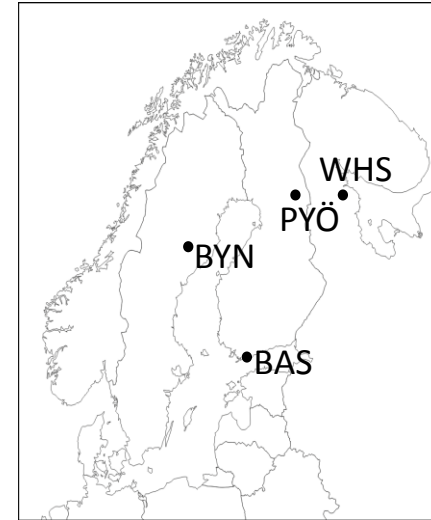
Directed Acyclic Graph (DAG) representing a hierarchical Bayesian model

# Example results on nine-spine sticklebacks

Morphological traits:  $S=1.00$

Behavioural traits:  $S=0.91$

$S$  close to 0: stabilizing selection  
 $S$  close to 1: diversifying selection  
 $S$  close to 0.5: drift plausible



# Signature of local adaptation from habitat information?



Juha Merilä

*We found small fish from BOTH sea populations, and large fish from BOTH pond populations – this must give additional evidence of selection operating.*

H-statistic: are populations from similar habitats more similar than expected by random drift?

Mantel test statistic

$$H := P\{M(\mathbf{D}^E, \mathbf{D}^T) > M(\mathbf{D}^E, \mathbf{D}^{T,R})\}.$$

Distance matrices of environmental covariates and mean trait values

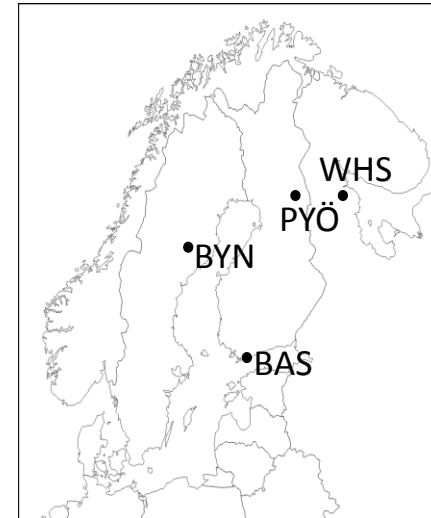
# Example results on nine-spine sticklebacks

Morphological traits:  $S=1.00$

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Morphological traits:  $H=1.00$

Behavioural traits:  $H=0.99$



# L5: take home messages

- Major forces behind evolution include selection, drift, mutation and migration (gene-flow)
- Showing that two populations are genetically different does not necessarily mean that the populations have been influenced by different selection pressures.
- To rule out the alternative explanation of genetic drift, the pattern of genetic divergence among the populations can be compared to patterns that would be generated by drift alone.
- Quantitative genetic theory provides theoretically well-founded and statistically powerful approaches for testing hypotheses related to selection and drift, as well as estimating related key parameters (e.g. G-matrices, gene-flows, coancestry matrices at the individual and population levels, etc.)