

## Genetics in support of fisheries and aquaculture management

17-19 September Faro, Portugal





# Quantitative genetics and application to aquaculture

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#### Animal breeding and productivity



Figure 1.3. Genetic research initiated in the 1940's has resulted in remarkable developments in increasing the productivity of domestic mammals and birds. Reproduced from Eknath et al. (1991) by permission of World Fish Center.

#### Plant breeding and productivity



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#### **History of breeding**

- Development of breeds from 1700
- The development of the theory of animal breeding was pioneered by Sewall Wright and Jay L Lush early in last century
- In his book 'Animal breeding plans', first published in 1937, Jay L. Lush discussed the principles and elements of breeding plans for animals



#### Breeding

- Selective breeding exploits the underlying genetic variation in a species to change traits in the direction desired by the breeder
- Selection can change traits very fast
- Genetic changes are accumulative



Fig. 2.1 Result of selection for growth rate over six generations when genetic improvement is 12.3% each generation (a figure that has been obtained in several breeding programs). The generation interval is illustrated by the run of the stair (distance between 1st and 2nd) and the rise of the stair is the improvement in body weight as a result of selection

#### **Domestication**

- Domestication: "The process by which a population of animals become adapted to man and to the captive environment by some combination of genetic changes occurring over generations and environmentally induced developmental events recurring during each generation" (Price 1984)
- Domestication occur primarily through selection, i.e. animals that are best adapted to a particular environment produce more progeny that survive compared to those that are less adapted
- Domestication is a slow process that takes place over a relatively long time period



## Traits with a genetic background –single genes



Figure 2.9 Inheritance of albinism in rainbow trout.



#### Quantitative traits

- A **quantitative trait** is a measurable phenotype that depends on the cumulative actions of many genes and the environment
- As the number of genes (each with two alleles) affecting a trait increases the number of genotypes increases as well as the variation





Height (cm)

100

0-

10.000

#### Quantitative traits are also influenced by the environment

- Genetically identical individuals can have different phenotypes
- Quantitative traits are determined by the combined influence of the genotype at several loci and the environment
- genotype + environment + random variation phenotype



#### Measuring heritability

- The fraction of the *total phenotypic* variance that is due to variation in genes is called the *heritability* of the trait
- We need to partition the total phenotypic variation (V<sub>P</sub>) into a component due to *genetic variation* (V<sub>G</sub>) and to a component due to *environmental variation* (V<sub>E</sub>)
- If the phenotypic distribution can be moved by selection
  - then the trait has a *genetic* component
  - then the trait is heritable





#### Partitioning of phenotypic variation

Phenotypic value of an individual:
 P = G + E

• Phenotypic variance within a population:  $V_P = V_G + V_E + 2Cov_{GE}$ 

 $V_{P}$  = phenotypic variance

 $V_G$  = environmental variance

 $Cov_{GE}$  = interaction between genetic & environmental effects

#### Partitioning of genetic variation

- There are two broad categories of gene effects:
- Additive gene effects

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> occur when the combined effects of alleles at different loci are equal to the sum of their individual effects

#### Non-additive gene effects

- <u>dominance</u> effects, the effect of a given allele depends on the interaction with the other allele present at the same locus.
- *epistasis*, interaction between alleles at different loci
- Only additive genetic effects are fully transferred to the next generation in a strict and predictable way
- selection acts upon additive effects
  - Thus we want to estimate heritability of a trait based on additive effects only
  - This will allow us to predict how a population or strain will respond to selection

#### Heritability

Breeders need to know how much of the phenotypic variability of a trait is due to genetic variance, and how much is due to non-genetic environmental factors

This is the 'broad-sense heritability':  $H^2 = V_G/V_P$ 

More useful to know is the proportion of the phenotypic variation is due to additive gene effects

The heritability (narrow-sense) of a trait is defined as the proportion of the total phenotypic variation that is due to heritable (additive genetic) effects that can be passed on from parent to offspring :

$$V_A/V_P = h^2$$

#### Heritability estimates

- Offspring can resemble their parents for reasons other than their genetic relationships
- Heritability estimates are only reliable if there is no correlation between the environment of offspring and parents
- Heritability estimates only apply for specific environments and may change if moving the population to a new environment
- Economically important traits in aquaculture
  - $-h^2 = [0.1-0.4]$
  - Estimates are trait specific but also population specific

#### The breeders equation

h<sup>2</sup> allows prediction of response to artificial (or natural) selection

The relationship between h<sup>2</sup> and the response to selection, is given by:

#### $R = h^2 * S$

- R is the response to selection, given by the difference between the population mean before selection and the mean of the offspring of selected parents after one generation of selection.
- S is the selection coefficient, given by the difference between the unselected population mean, and the mean of the selected parents.
- If we know the heritability of a trait and the strength of artificial selection applied to it, we can predict the response to selection >>> so...



#### **Selection response**





#### **Selection response**



#### **Selection limits**

1 9

- There may be several reasons for reaching a plateau in genetic gain in a breeding program
  - -Narrow genetic variation in the base population
  - Small effective population size resulting in inbreeding and increased homozygosity
  - -Few loci controlling the traits selected for
  - Artificial selection may be outweighed by natural selection
- But for quantitative traits controlled by a large number of genes, selection limits will rarely be reached if inbreeding is kept low
  - Thus selection is a powerful tool to change animal populations in the desired direction

#### **Breeding value**









## Use of genetic/genomic tools in breeding programs



"He's being bred for Hawaiian pizza!"

#### **Breeding programs**

- A breeding program is the planned breeding of a group of animals or plants, usually involving at least several individuals and extending over several generations
- Simple individual based selection largest animals/plants used for next generation
- Family based breeding programs selecting for multiple traits



### Difference between breeding programs

Mass selection

• Family based breeding



What's the advantage/disadvantages of the two methods

#### Methods of artificial selection

- Many economically important traits cannot be recorded on live individuals
  - Disease resistance and product quality
  - Lipid content, feed conversion, fillet yield, flesh color, etc.
- family based selection is a key strategy
  - Records of close relatives allow selection for traits like disease resistance and product quality
- Breeding value of individual I

2 5

$$A_i = h^2 (X_i - \overline{X}_i)$$

• Breeding value of full sib families  $-r_{G} = 0.5$ 

$$A_{j} = \frac{nh^{2}(X_{jn} - \overline{X}_{jn})}{2 + (n-1)(h^{2} + 2c_{FS}^{2})}$$

• Breeding value of half sib families  $-r_{G} = 0.25$ 

$$A_{j} = \frac{nh^{2}(X_{jn} - \overline{X}_{jn})}{4 + (n-1)(h^{2} + 4c_{HS}^{2})}$$



## Basic conditions for a breeding program

- There must be variation between individuals for the traits of interest
- A part of the variation has to be under genetic control as this is the only part which will be transferred to the next generation
- The life-cycle of the organism must be known and possible to control
- Individuals must be identifiable (tagging!) in order to keep track of their pedigree

#### How to start a breeding program

- Establishment of a baseline population:
- General idea to use several wild and or farmed populations to assure sufficient genetic variation
- •
- However, depend on geographical and environmental coverage (local adapted populations?)
- Level of inbreeding in farmed populations should be assessed
- A minimum of 100 males and 100 females should be used – but more is better (more to choose from, less likelihood of inbreeding)

#### 2014 Survey of number of broodfish used

<u>Figure 3</u>: Number of programs according to the number of broodfish involved at each generation, grouped by species.



The values above series represent the number of lines used in each program. md: missing data.

#### **Breeding goals**

- Reduced cost of production (ensuring price competitiveness)
- High product quality (ensuring competitiveness in the market)
- Improved welfare and reduced stress

•

Traits:

- The trait must be of economic or ethical importance
- It must show variation and part of the variance must be heritable
- It should be possible to measure the trait accurately at a reasonable cost

#### **Breeding goals**

• Provide as many potential breeding goals with associated traits as possible in 5 minutes.





## Primary selected traits in European aquaculture

Figure 6: Number of programs according to the selected traits, all species included.

Nb of programs



#### Application of genetic/genomic tools

- Genetic traceablity
- Assessment of diversity/inbreeding
- Pedegreeing
- Mapping of traits (QTL)
- Marker assisted selection
- Genomic selection

#### **Genetic traceability**



Protection of Intellectual property rights

#### **Genetic diversity indices**

- Heterozygosity
- Number of alleles
- Inbreeding
- Effective number of breeders



#### DNA fingerprinting (pedigree establishment)





#### **Common Garden experiments** P = G + E

No need for tagging of individuals



**Overall Design** 

Five randomized blocks with eight pools each. Each of the 4 water and nutrient treatment combinations occurs in two pools within each block. Two pools are required since six plants are the maximum that can be placed in a single pool. Position of pools is randomized within block.



#### **Genetic mapping**

LG01	LG02	LG03	LG04	LG05	LG06	LG07	LG08	LG09	LG10
0.0 5ms/150-542 0.3 1.3 1.3 1.3 1.4 5ms-150288	0 0 1 5 5 5 5 5 5 5 5 5 5 5 5 5 5 5 5 5	0.0 4.1 5000 1.1 5000 1.2 50000 1.2 5000 1.2 50000 1.2 5000 1.2 50000 1.2 5000 1.2 5000 1.2 5000 1.2 5000 1.2 5000	0.0 insel507.190 0.1 insel507	0.0 5 5 5 5 5 5 5 5 5 5 5 5 5 5 5 5 5 5	0.0 SmaSkP.29 3.0 SmaUSC188 10.6 SmaUSC188 10.6 SmaUSC188 10.6 SmaUSC188 10.6 SmaUSC188 10.6 SmaUSC189 10.6 SmaUSC189	0.0 1.1 1.4 1.5 1.5 1.5 1.5 1.5 1.5 1.5 1.5	0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0	0.0         Sma-UBC/16           1.1         Sma-UBC/16           1.1         Sma-UBC/16           1.1         Sma-UBC/16           1.1         Sma-UBC/16           1.1         Sma-UBC/16           1.1         Sma-UBC/16           2.1         Sma-UBC/16           2.1         Sma-UBC/16           2.1         Sma-UBC/16           2.1         Sma-UBC/16           2.1         Sma-UBC/16           2.1         Sma-UBC/16           2.2         Sma-UBC/16           2.3         Sma-UBC/16           2.4         Sma-UBC/16           2.5         Sma-UBC/16           2.6         Sma-UBC/26           2.7         Sma-UBC/26           2.6         Sma-UBC/26           2.6         Sma-UBC/27           2.8         Sma-UBC/27           3.8         Sma-UBC/27	0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0
LG11	LG12	LG13	LG14	LG15	LG16	LG17	LG18	LG19	9

1627 // BAACAS 668 / BeaCA29/C 71.2/ Sma-USC226	
LG18 LG19	

0.0 YSK190 11.6 Senset 55 Simulation State 55 Si	0.0 5 mm-USC0 5 mm-USC2 5 mm-U	3011 South 128101A	0.0 8m+USC146 3m+USC26 7m+USC20 2m+USC20	0.0 SmellsCr0 5.0 Sm	0.0 Bea € 197 3.7 U Sector 197 5.7 U Sector 1	0.0 SMAC06 5.6 Sme4112 7.1 Sma493 10.7 Sm	0.0 9.1 9.1 9.1 9.1 9.1 9.1 9.1 9.1	0.0 920CA17 950TH 95
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		LG20	LG21	LG22	LG23	LG24
(1) Small Str. 10, 0044 (1) Small Str. 10, 1044 (2) Small F1 10, 1044 (3) Small F1 10004 (4) Small F1 10004 (5) Small F1	(14) Small(H) 23) 6 (34H; SmSNP_200, 6.44-M; YSK-124, 6.44-M (16) Small(H) 23, 16 (34H; SmSNP_200, 6.44-M; YSK-124, 6.44-M (16) Small(S), 804-M (17) Small(H), 804-M (18) Small(H), 804-M (19) Sm	0.0 5 5mb USC 116(20) 1.0 5mb USC 116(20) 1.0 5mb USC 28 1.0 5mb USC 28 1.0 5mb 238(20) 1.1 5mb 238(20) 1.0 5mb 238 1.0 5mb 238 1.0 5mb 238 1.0 5mb 238 1.0 5mb 238 1.0 5mb USC 284 1.0 5mb USC 284 1	0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0	0.0 5805 E157 2.5 5806 USC 1422 5806 USC 142	0.0 Sms-USC164 3ms-1160 3ms-1160 3ms-1952 21.9 Sms-USC23 21.9 Sms-USC30 21.9 Sms-USC30	249 0.0 — — Sma-USC210 2.9 — F8-H100/17(26) 6.8 — Sma-USC229 6)
					001 7 Our operation	



#### **Genetic mapping - markers**



- E.g., 3 billion base pairs in the human genom
  Two genomes differ by 0.1%
  - -3 million differences between two individuals
- > 9 million known variable sites in the genome (single nucleotide polymorphisms, SNPs)
- Objective is to find those genetic variants that are of importance
  - –directly important → genes influencing trait of interest
  - -indirectly important  $\rightarrow$  genetic markers

#### Linked alleles tend to be inherited together



#### **Tester cross**



#### **Concepts: Linkage and Linkage Mapping**

#### Linkage map:

- "is a map of the frequencies of recombination that occur between markers on homologous chromosomes during meiosis."
- distance is measured in cM.

#### **Physical map:**

- "shows the physical locations of genes and other DNA sequences of interest.
- distance measure in base pairs

#### Comparative map:

 a map that compares linkage maps or physical maps of related species based on shared markers or sequences, respectively (Fig. 2)



Source: Fig. 2 - www.pnas.org/content/102/37/13206/F3.expansion.html



## Basic principles of genetic mapping

Pr (Gene location | data)

4 2



Need many polymorphic markers and information on trait variation in strain

#### Length at age (1) in brown trout



Cumulative female recombination map position (cM)



# Different approaches to mapping



• Genetic mapping - Locating genes which affect the phenotype by examining genetic markers

#### •Pedigree based methods:

- -Linkage-mapping
- Count recombination events between markers and putative gene
- -Goal: use markers to find genes via linkage with markers

#### Population based methods:

- -Linkage disequilibrium or association mapping
- Use population history to detect markers in proximity with the putative gene
- Goal: use markers to find genes via Linkage Disequilibrium (LD)



#### QTL linkage-mapping

- In organisms where experimental breeding is possible
- Often done by crossing two inbred lines that have been exposed to selection on the trait of interest but in opposite directions
  - Not possible in humans
  - Not possible in blue whales





#### Association mapping

Goal: Use genetic markers to find functional genes via linkage disequilibrium (LD)

The essential idea is that markers close to the gene coding for the functional variation may also have allele frequency differences between phenotypes if there is linkage disequilibrium between the marker locus and the gene of interest

#### Linked alleles tend to be inherited together



### A marker M can be informative of

Causes of association

the gene D due to:

4 8

- Direct causation (M=D)
- Linkage disequilibrium (M in LD with D)
- Population substructure
- Statistical artefacts
- Technical artefacts

false-positive association



#### Marker Assisted Selection

- MAS is an indirect selection process where a trait of interest is selected based on a marker linked to a trait of interest (e.g. productivity, disease resistance, abiotic stress tolerance, and quality), rather than on the trait itself
- Can supplement/replace trait measurement, which can be tedious and expensive
- Can be used for traits not recordable on live individuals
- Is not influenced by environment
- Is not influenced by life/developmental stage of individual



#### Marker assisted selection

Development of resistant strains of strawberry

- Marker linked to QTL for resistance
- Crossing of elite non-resistant strain with wild conspecific
- Selection of F2 seedlings (embryos) homozygous for the resistance linked marker



#### **Genomic selection**

 Genomic selection is a form of marker-assisted selection in which genetic markers covering the whole genome are used so that all quantitative trait loci (QTL) are in linkage disequilibrium with at least one marker



#### **Breeding value**



#### Genomic breeding values (GEBVs)

Are recorded through:

- Reference or training population
  - 1) Estimation of trait values
  - 2) Molecular marker scores (LD with QTL's)
  - 3) Pedigree information or kinship
  - 4) Establishment of prediction equations
- Validation population
  - -Evaluation of precision of GEBVs

#### **Advantages of Genomic Selection**





## Use of molecular tools in European fish breeding

Figure 5: Use of molecular tools in each program.



#### Summary

- The theory of breeding genetics was developed early 20th century
- Estimation of the heritability is key for all breeding genetics
- The breeders equation allow estimation of the expected response to selection
- The breeding value of an individual and family can be estimated
- QTL mapping is an important application in modern breeding
- Mapping allow Marker Assisted Selection and Genomic selection to be performed
- Genetic tools are also used for traceability, variability and pedigree establisment