## Building Blocks of Quantitative Genetics

1) Single gene model

- effect of genotype on quantitative phenotype
- effect of a parent's genotype on quantitative phenotype of its progeny --- breeding value

2) Multiple gene model

- Functional model for quantitative phenotypes
- Breeding values
- Population distributions of phenotypes and breeding values


## Building Blocks of Quantitative Genetics

 Single gene model$p=$ population gene frequency of $B$ $q=$ population gene frequency of $b$


Population Genotype Frequencies under random mating ( $\rightarrow$ Hardy Weinberg Equilibrium)

|  | Eggs |  |
| :---: | :---: | :---: |
|  | $B(p)$ | $b(q)$ |
| $\frac{5}{⿺}$ | $B(p)$ | $p^{2}$ |
|  | $b(q)$ | $p q$ |

## Genetic Value

= effect of an animal's genes on its own phenotypic value

| Genotype | BB | Bb | bb |
| :--- | :---: | :--- | :--- |
| Average phenotype | $\mathbf{P}_{\mathrm{BB}}$ | $\mathbf{P}_{\mathrm{Bb}}$ | $\mathbf{P}_{\mathrm{bb}}$ |
| example | 320 | 310 | 280 |
| HWE Frequency | $\mathrm{p}^{2}$ | 2 pq | $\mathrm{q}^{2}$ |
| $\mathrm{p}=0.8$ | 0.64 | 0.32 | 0.04 |
| Genetic value G | $\mathbf{G}_{\mathrm{BB}}$ | $\mathbf{G}_{\mathrm{Bb}}$ | $\mathbf{G}_{\mathrm{bb}}$ |
| $=\mathrm{g}_{\mathrm{xy}}-315.2^{*}$ | $\mathbf{+ 4 . 8}$ | -5.2 | -35.2 |

* Population mean phenotype $=\mathrm{p}^{2} \mathrm{P}_{\mathrm{BB}}+2 \mathrm{pq} \mathrm{P}_{\mathrm{Bb}}+\mathrm{q}^{2} \mathrm{P}_{\mathrm{bb}}=315.2$

Population mean
G

$$
\begin{equation*}
=p^{2} G_{B B}+2 p q G_{B b}+q^{2} G_{b b}= \tag{0}
\end{equation*}
$$

## Genetic Value in Falconer Notation

(Falconer and Mackay, 1996)

| Genotype | BB | Bb | bb |
| :--- | :--- | :--- | :--- |
| Average phenotype | $\mathrm{P}_{\mathrm{BB}}$ | $\mathrm{P}_{\mathrm{Bb}}$ | $\mathbf{P}_{\mathrm{bb}}$ |
| example | 320 | 310 | 280 |
| Genetic value | $\mathrm{G}_{\mathrm{BB}}$ | $\mathrm{G}_{\mathrm{Bb}}$ | $\mathbf{G}_{\mathrm{bb}}$ |
| $=\mathrm{g}_{\mathrm{xy}}$-mean | +4.8 | -5.2 | -35.2 |
| Falconer genetic | +a | d | -a |
| value | +20 | +10 | -20 |

$\mathrm{a}=$ additive effect $\quad=\frac{1}{2}\left(\mathrm{P}_{\mathrm{BB}}-\mathrm{P}_{\mathrm{bb}}\right) \quad=+20$
$=$ half the difference between two homozygotes
$d=$ dominance effect $=P_{B b}{ }^{-1} / 2\left(P_{B B}-P_{b b}\right) \quad=+10$
= deviation of heterozygote from homozygote mean

## Genetic Value in Falconer Notation

 (Falconer and Mackay, 1996)| bb | 0 | Bb | BB |
| :---: | :---: | :---: | :---: |
| $-a$ |  | $d$ | $+a$ |

$$
\begin{aligned}
d=0 & \text { no dominance (additive gene) } \\
0<d<a & \text { partial dominance } \\
d=a & \text { complete dominance } \\
d>a & \text { overdominance }
\end{aligned}
$$

## Breeding Value (BV)

$=2 x$ average effect of animal's alleles on progeny phenotype Parent has 2 alleles (e.g. Bb) but only one is ( $\mathrm{B} / \mathrm{b}$ ) passed on to a progeny BV = effect of allele $1+$ effect allele 2 on progeny phenotype

Average effect of allele B

| Sperm Egg |  | Frequency | Progeny genotype | Genetic value | Mean genetic value progeny |
| :---: | :---: | :---: | :---: | :---: | :---: |
| B | B | P |  | $\mathrm{G}_{\mathrm{BB}}[4.8]$ | $\begin{array}{r} \alpha_{B}=p G_{B B}+q G_{B b} \\ =.8(4.8)+.2(-5.2)=+2.8 \end{array}$ |
|  | b | q [.2] | Bb | $\mathrm{G}_{\text {Bb }}[-5.2]$ |  |
| Average effect of allele b |  |  |  |  |  |
| Sperm | Egg | Frequency | Progeny genotype | Genetic value | Mean genetic value progeny |
| b | B | P [.8] | Bb | $\mathbf{G B b}^{\text {[-5.2] }}$ | $\alpha_{b}=p G^{\text {b }}$ |
|  | b | 9 [.2] | bb | $\mathbf{G}_{\mathrm{bb}}[-35.2]$ | (5.2)+2(-35.2)= |

## Breeding Value (BV)

$$
\begin{gathered}
\quad \text { Average effect of alleles } \\
\alpha_{\mathrm{B}}=\mathrm{pG} \mathrm{~GB}_{\mathrm{BB}}+\mathrm{qG}_{\mathrm{Bb}}=.8(4.8)+.2(-5.2)=+2.8 \\
\alpha_{\mathrm{b}}=\mathrm{pG} \mathrm{Bb}_{\mathrm{Bb}}+\mathrm{qG}_{\mathrm{bb}}=.8(-5.2)+.2(-35.2)=-11.2
\end{gathered}
$$

Breeding value $=$ Sum of average effects
$\mathrm{BV}_{\mathrm{BB}}=\alpha_{\mathrm{B}}+\alpha_{\mathrm{B}}=(+2.8)+(+2.8)=+5.6$
$B V_{B b}=\alpha_{B}+\alpha_{b}=(+2.8)+(-11.2)=-8.4$
$B V_{b b}=\alpha_{b}+\alpha_{b}=(-11.2)+(-11.2)=-22.4$
'Value' of each copy of $\mathbf{B = + 1 4}$

$$
\begin{aligned}
& =\alpha_{B}+\alpha_{b}=\alpha \\
& =\text { allele substitution effect }
\end{aligned}
$$

# Genetic value Breeding value (BV) <br> Dominance value (D) $\quad \mathrm{D}=\mathrm{G}-\mathrm{BV}$ 



| Genotype | BB | Bb | bb |
| :--- | :--- | :--- | :--- |
| Average phenotype | $\mathrm{P}_{\mathrm{BB}}$ | $\mathrm{P}_{\mathrm{Bb}}$ | $\mathrm{P}_{\mathrm{bb}}$ |
| example | 320 | 310 | 280 |
| Frequency | $\mathrm{p}^{2}$ | 2 pq | $\mathrm{q}^{2}$ |
| $\mathrm{p}=0.8$ | 0.64 | 0.32 | 0.04 |
| Genetic value | $\mathrm{G}_{\mathrm{BB}}$ | $\mathrm{G}_{\mathrm{Bb}}$ | $\mathrm{G}_{\mathrm{bb}}$ |
| G=g $\mathrm{g}_{\mathrm{xy}}$-Mean | +4.8 | -5.2 | -35.2 |
| Breeding value | $\mathrm{BV}_{\mathrm{BB}}$ | $\mathrm{BV}_{\mathrm{Bb}}$ | $\mathrm{BV}_{\mathrm{bb}}$ |
| $\mathrm{BV}=\alpha_{\mathrm{x}}+\alpha_{\mathrm{y}}$ | +5.6 | -8.4 | -22.4 |
| Dominance value | $\mathrm{D}_{\mathrm{BB}}$ | $\mathrm{D}_{\mathrm{Bb}}$ | $\mathrm{D}_{\mathrm{bb}}$ |
| D=G-BV | -0.8 | +3.2 | -12.8 |
|  |  |  |  |


| Genotype | BB | Bb | bb |
| :--- | :---: | :--- | :--- |
| Average phenotype | $\mathrm{g}_{\mathrm{BB}}$ | $\mathrm{g}_{\mathrm{Bb}}$ | $\mathrm{g}_{\mathrm{bb}}$ |
| example | 320 | 310 | 280 |
| Frequency | $\mathrm{p}^{2}$ | 2 pq | $\mathrm{q}^{2}$ |
| $\mathrm{p}=0.8$ | 0.64 | 0.32 | 0.04 |
| Genetic value | $\mathrm{G}_{\mathrm{BB}}$ | $\mathrm{G}_{\mathrm{Bb}}$ | $\mathrm{G}_{\mathrm{bb}}$ |
| $\mathrm{G}=\mathrm{g}_{\mathrm{xy}}-$ Mean | +4.8 | -5.2 | -35.2 |
| Breeding value | $\mathrm{BV}_{\mathrm{BB}}$ | $\mathrm{BV}_{\mathrm{Bb}}$ | $\mathrm{BV}_{\mathrm{bb}}$ |
| $\mathrm{BV}=\alpha_{\mathrm{x}}+\alpha_{\mathrm{y}}$ | +5.6 | -8.4 | -22.4 |
| Dominance value | $\mathrm{D}_{\mathrm{BB}}$ | $\mathrm{D}_{\mathrm{Bb}}$ | $\mathrm{D}_{\mathrm{bb}}$ |
| $\mathrm{D}=\mathrm{G}-\mathrm{BV}$ | -0.8 | +3.2 | -12.8 |

## Population variance $=\Sigma$ frequency * (value-mean) ${ }^{2}$

Additive genetic variance

$$
\sigma_{\mathrm{A}}^{2}=\mathrm{p}^{2} * \mathrm{BV}_{\mathrm{BB}}^{2}+2 \mathrm{pq} * \mathrm{BV}_{\mathrm{Bb}}^{2}+\mathrm{q}^{2} * \mathrm{BV}_{\mathrm{bb}}^{2}=2 \mathrm{pq} \alpha^{2}=62.72
$$

Dominance variance

$$
\sigma_{\mathrm{D}}^{2}=\mathrm{p}^{2} * \mathrm{D}_{\mathrm{BB}}^{2}+2 p q * D_{B b}^{2}+q^{2} * D_{b b}^{2}=(2 p q d)^{2}=10.24
$$

Total genetic variance

$$
\sigma_{\mathrm{G}}{ }^{2}=\mathrm{p}^{2} * \mathbf{G}_{\mathrm{BB}}^{2}+2 \mathrm{pq} * \mathrm{G}_{\mathrm{Bb}}^{2}+\mathrm{q}^{2} * \mathbf{G}_{\mathrm{bb}}^{2}=\sigma_{\mathrm{A}}^{2}+\sigma_{\mathrm{D}}^{2}=72.96
$$

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Building Blocks of Quantitative Genetics

## Multiple gene models

Quantitative phenotype is affected by
many genes plus environment

$$
P=\mu+G+E
$$

$\mu=$ mean (systematic environmental effects)
$\mathbf{G}=$ collective genetic value of all genes

$$
=\Sigma G_{i} \quad G_{i}=\text { Genetic value of } i^{\text {th }} \text { gene }
$$

$E=$ collective effect of all environmental factors

## Multiple gene models

$$
\mathbf{P}=\mu+\overbrace{\text { BV }+\mathbf{D}+\mathrm{I}}+\mathbf{E}
$$

BV = collective breeding value of all genes
$=\Sigma B V_{i} \quad B V_{i}=$ Breeding value for $i^{\text {th }}$ gene
D = collective dominance value of all genes
$=\Sigma D_{i} \quad D_{i}=$ Dominance value for $i^{\text {th }}$ gene
I = collective effect of epistatic interactions among genes
$=\Sigma \mathrm{l}_{\mathrm{ij}} \quad \mathrm{I}_{\mathrm{ij}}=$ Interaction between genes i and j

## Dominance vs. Epistasis



$\mathrm{D}_{1}$
$D_{2}$

Chromosome pair 2 gene 3 gene 4

$D_{3}$
$D_{4}$


Dominance $=$ interaction between alleles at the same locus/gene

Epistasis = interaction between alleles at the different loci/genes

## How does a Parent's phenotype relate

 to phenotype of its Progeny?$$
\begin{aligned}
P_{\text {sire }}=\mu+B V_{\text {sire }}
\end{aligned}+\underbrace{D_{\text {sire }}+I_{\text {sire }}}_{\text {sire }}+\mathrm{E}_{\text {sire }}
$$

$P_{\text {prog }}=\mu+B V_{\text {prog }}+D_{\text {prog }}+I_{\text {prog }}+E_{\text {prog }}$
Only Additive Effects of genes (=Breeding Value) are transmitted from a parent to its progeny
(regardless of mating)
Dominance and Epistatic effects depend on mating

## Parents pass a sample half of their alleles to progeny



## Parents pass a sample half of their Breeding Value to progeny

E.g.: average additive effect of each capital allele is +1 average additive effect of each small allele is $\mathbf{- 1}$


## Relationship between BV of parents and progeny

 half of genes from sire

dam



Mendelian sampling (Random Assortment) effect from sire dam
$\sqrt{\square}$
$B V_{\text {prog }}=1 / 2 B V_{\text {sire }}+1 / 2 B V_{\text {dam }}+R A_{\text {sire }}+R A_{\text {dam }}$

Increased by using parents with high BV Common to full sibs

## Quantitative Trait Parameters

$$
\begin{aligned}
& P=\mu+B V+D+I+E \\
& \sigma_{P}{ }^{2}=\sigma_{A}^{2}+\sigma_{D}^{2}+\sigma_{I}^{2}+\sigma_{E}^{2}
\end{aligned}
$$

Heritability in the BROAD sense $\mathbf{H}^{2}$
$=$ fraction of phenotypic variance due to genetics

$$
H^{2}=\frac{\sigma_{A}^{2}+\sigma_{D}^{2}+\sigma_{I}^{2}}{\sigma_{P}^{2}}=\frac{\sigma_{G}^{2}}{\sigma_{P}^{2}}
$$

Heritability in the NARROW sense $h^{2}$
$=$ fraction of phenotypic variance due to additive genetics

$$
h^{2}=\frac{\sigma_{A}^{2}}{\sigma_{P}^{2}}
$$

## Population Variances



## Between and Within Family Variances



## Correlations between Traits

Phenotypic correlation ( $r_{p}$ )
$=$ correlation between phenotypes for traits 1 and 2 observed on the same individuals

Causes for existence of a phenotypic correlation:

1) Some genes can have effects on both traits
= Pleiotropy
$\square$ genetic correlation $\left(r_{g}\right)$
2) Some environmental factors can affect both traits
$\square$ environmental correlation $\left(r_{e}\right)$

## Correlations between Traits

$$
r_{g}=\frac{\operatorname{Cov}\left(B V_{1}, B V_{2}\right)}{\sigma_{B V_{1}} \sigma_{B V_{7}}}
$$

$r_{P}=\frac{\operatorname{Cov}\left(P_{1}, P_{2}\right)}{\sigma_{P_{1}} \sigma_{P_{2}}}$
$r_{E}=\frac{\operatorname{Cov}\left(E_{1}, E_{2}\right)}{\sigma_{E_{1}} \sigma_{E_{2}}}$

factors

## (Additive) Genetic Relationship

$$
\begin{gathered}
a_{x y}=\text { additive genetic relationship } \\
\text { between } x \text { and } y
\end{gathered}
$$

$a_{x y}=$ fraction of genes $x$ and $y$ share due to common ancestry
$=$ probability that a randomly chosen allele at a locus (gene) in $y$ is also present in $x$
$a_{\text {parent-offspring }} \quad=1 / 2$ Parent passes on half of its genes
$a_{\text {grandparent-offspring }}=1 / 4$ Grand sire $\stackrel{1 / 2}{\square}$ Sire $\stackrel{1 / 2}{\square}$ Progeny

## (Additive) Genetic Relationship

## $a_{x y}=$ fraction of genes $x$ and $y$ share due

 to common ancestry$=$ probability that a randomly chosen allele at a locus (gene) in $y$ is also present in $x$

$$
a_{\text {half-sibs }}=1 / 2 x^{1} / 2=1 / 4
$$

$$
a_{\text {full-sibs }}=2\left(1 / 2 x^{1 / 2}\right)=1 / 2
$$

$$
V(-,-)
$$

$$
1 / 2 \downarrow
$$

$$
x(-,-)
$$

$$
y(*,-)
$$

## Coefficient of Inbreeding

$F_{z}=$ probability that, for a random locus, the allele $z$ received from its sire is identical by descent to
the allele $z$ received from its dam
$=1 / 2$ of the genetic relationship between the sire and dam of $z$

$$
\begin{gathered}
F_{z}=1 / 2 a_{v w} \\
v(-,-) \stackrel{1 / 2}{\stackrel{a_{v w}}{\rightleftharpoons}} \boldsymbol{w}(-,--) \\
z(-,-)
\end{gathered}
$$

$$
\begin{aligned}
a_{z z} & =1+F_{z} \\
& =1+\frac{1}{2} a_{v w}
\end{aligned}
$$

## Coefficients of Inbreeding for simple pedigrees

| Mating | (non- inbred parents) | $\mathrm{a}_{\text {parents }}$ | $\mathrm{F}_{\text {progeny }}$ |  |
| :--- | :--- | :--- | :--- | :--- |
| sire | $\mathbf{x}$ | daughter | $1 / 2$ | $1 / 4$ |
| sire | $\mathbf{x}$ | grand-daughter | $1 / 4$ | $1 / 8$ |
| half-sib | x | half-sib | $1 / 4$ | $1 / 8$ |
| full-sib | x | full-sib | $1 / 2$ | $1 / 4$ |
| clone | X | clone | 1 | $1 / 2$ |

Assumes parents are themselves NOT inbred

Are two alleles the same? Identity By State (IBS) versus Identity By Descent (IBD)

- IBS: if we can genotype individuals o and o' for this locus (QTL), then we can directly determine whether the alleles the two individuals carry are indeed the same - if they are the same, this is referred to as the alleles being IBS.
- IBD: if we cannot genotype the locus (ie. the usual case), then we cannot determine IBS directly but, if $\mathbf{o}$ and $\mathbf{o}$ ' have a common ancestor, than we can determine the probability that the two alleles are identical because they may have originated from a common ancestor


## IBD probabilities from pedigree:

$\operatorname{Prob}(o p$ is IBD to o' $p)=P\left(o p \equiv o^{\prime} p\right)$
= probability that alleles op and o'p originated from the same allele of the common ancestor

Example IBD probabilities, coefficients of coancestry and additive and dominance coefficients

|  | IBD probabilities for pairs of alleles |  |  |  | Coancestry coefficient | $\begin{gathered} \text { Additive } \\ \text { relationship } \\ \text { coefficient } \end{gathered}$ | Dominance relationship coefficient |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Individual 0-0' | op-o'p | om-o'm | op-o'm | om-o'p | $\mathrm{f}_{0}$, | $\mathrm{raO}_{0}$, | $\mathbf{u}_{0}{ }^{\prime}$ |
| Sire(o) - Offspring(o') | $1 / 2$ | 0 | 0 | 1/2 | $1 / 4$ | $1 / 2$ | 0 |
| Dam - Offspring | 0 | 1/2 | $1 / 2$ | 0 | $1 / 4$ | $1 / 2$ | 0 |
| Paternal half-sibs | $1 / 2$ | 0 | 0 | 0 | 1/8 | $1 / 4$ | 0 |
| Full sibs | $1 / 2$ | $1 / 2$ | 0 | 0 | $1 / 4$ | $1 / 2$ | $1 / 4$ |
| Identical twins | 1 | 1 | 0 | 0 | 1/2 | 1 | 1 |

Example IBD probabilities, coefficients of coancestry and additive and dominance coefficients

|  | IBD probabilities for pairs of alleles |  |  |  | Coancestry coefficient | $\begin{gathered} \text { Additive } \\ \text { relationship } \\ \text { coefficient } \end{gathered}$ | Dominance relationship coefficient |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Individual 0-0' | op-o'p | om-o'm | op-o'm | om-o'p | $\mathrm{f}_{00}$, | $\mathrm{raO}_{0}$, | $\mathrm{u}_{00}$, |
| Sire(o) - Offspring(o) | 1/2 | 0 | 0 | 1/2 | $1 / 4$ | 1/2 | 0 |
| Dam - Offspring | 0 | 1/2 | 1/2 | 0 | $1 / 4$ | $1 / 2$ | 0 |
| Paternal half-sibs | $1 / 2$ | 0 | 0 | 0 | $1 / 8$ | $1 / 4$ | 0 |
| Full sibs | 1/2 | $1 / 2$ | 0 | 0 | $1 / 4$ | 1/2 | $1 / 4$ |
| Identical twins | 1 | 1 | 0 | 0 | $1 / 2$ | 1 | 1 |

## Some side notes:

Coefficient of coancestry (also coeff. of kinship or consanguinity) between 0 and $\mathbf{o}^{\prime}$
$=f_{00^{\prime}}=$ probability that an allele drawn at random from o is IBD to an allele drawn random from $\mathbf{o}^{\prime}$ $=$ average of the 4 possible IBD probabilities between alleles at o and o'
$r_{00^{\prime}}=2 f_{00^{\prime}}=$ coefficient of relationship $=$ additive genetic relationship coefficient
NOTE: $f_{00^{\prime}}$ is also equal to the coefficient of inbreeding of a progeny produced by 0 and $\mathbf{o}^{\prime}$
= probability that an individual's alleles are IBD

