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# 5. Quantitative genetics

Types of quantitative traits

metric traits (cont. data): height, weight meristic traits (discrete data): litter size, #bristles threshold traits (categorical data): affected or not

5.1 broad sense heritabitily

5.2 narrow sense heritabitily

5.3 truncation selection

5.4 resemblance between relatives

## 5.1 Broad sense heritabitily

As a rule a QT is influenced by many genes (polygenes) each gene exerting relatively small effect considerable environmental variation

## Ex 1: bristle number

Fig 9.1, p. 399: D.melanogaster

X = number of bristles on 5th abdominal sternite histogram with N( $\bar{X}, s^2$ ) curve,  $\bar{X} = 18.7, s = 2.1$ phenotypic variance  $\sigma_p^2 = \operatorname{Var}(X) \approx (2.1)^2$  Phenotypic value of an individual: P = M + Egenotype value  $M = \mu + G \pmod{\mu}$ environmental deviation  $E \pmod{0}$ Assumption: independent deviations G and E $P = \mu + G + E$ , variance decomposition  $\sigma_p^2 = \sigma_g^2 + \sigma_e^2$ 

Broad sense heritabitily  $H^2 = \sigma_g^2 / \sigma_p^2$ 

Absence of genotype-environment interaction:



Examples of environmental effects:

nutritional and climatic factors, maternal effects cultural environment

# Ex 2: estimation of variance components

1) estimate  $\sigma_e^2$  observing inbred populations 2) find  $\sigma_g^2 + \sigma_e^2$  from random-bred populations Thorax length in *D.melanogaster* (in 0.01 mm) inbred populations  $\sigma_e^2 = 0.186$ random-bred populations  $\sigma_p^2 = 0.366 \ (= \sigma_g^2 + \sigma_e^2)$  $\sigma_g^2 = \sigma_p^2 - \sigma_e^2 = 0.180, \ H^2 = 49.2\%$ 

# Ex 3: LDL-cholesterol level

Human Apo-E locus binds LDL receptor protein

three common alleles  $e_2$  (0.1),  $e_3$  (0.7),  $e_4$  (0.2) LDL-cholesterol level in  $\frac{\text{mg LDL-chol}}{\text{dL blood plasma}}$ 

$\operatorname{genot}$	$e_2 e_2$	$e_2e_3$	$e_2 e_4$	$e_3e_3$	$e_3e_4$	$e_4 e_4$	
freq	0.01	0.14	0.04	0.49	0.28	0.04	sum = 1
M	76	90	115	100	110	106	$\mu = 102$
G	-26	-12	13	-2	8	4	$\sigma_{q}^{2} = 54.2$
A	-16.8	-9.4	-0.7	-2	6.7	15.4	$\sigma_{a}^{2} = 39.2$
D	-9.2	-2.6	13.7	0	1.3	-11.4	$\sigma_{d}^{2} = 15.0$

Broad sense heritability

given  $\sigma_p^2 = 554.2$  compute  $\sigma_e^2 = 500.0$ ,  $H^2 = 0.098$ High LDL-chol increases risks of coronary heart desease

 $e_2e_4$  genotype is at greatest risk

 $e_4e_4$  genotype's children are at greatest risk

# Breeding value of a genotype

A =twice the average G across possible offspring

factor 2: only half of genes come from one parent Dominance effect D = G - A, whithin locus interaction

$$P = \mu + A + D + E$$

## 5.2 Narrow sense heritabitily

One locus model

two alleles  $A_1$  and  $A_2$  with frequencies p and q assuming random mating and HWE

genotype	$A_1A_1$	$A_1A_2$	$A_2A_2$
frequency	$p^2$	2pq	$q^2$
M	$\mu^* + a$	$\mu^* + d$	$\mu^*-a$
G	$2qlpha - 2q^2d$	$(q-p)\alpha + 2pqd$	$-2plpha-2p^2d$
A	2qlpha	(q-p)lpha	-2plpha
D	$-2q^2d$	2pqd	$-2p^2d$

Genotypic values M given around  $\mu^* = \frac{M_{11}+M_{22}}{2}$ do not depend on the allele frequency pGenotypic deviation  $G = M - \mu$  depends on psince population mean  $\mu = \mu^* + (p - q)a + 2pqd$ Average effect of gene substitution when a randomly chosen  $A_1$  is replaced by  $A_2$  $\alpha = p(a - d) + q(a + d)$ Breeding value of  $A_1A_1$  genotype  $A_{11} = 2(pG_{11} + qG_{12}) = 2q\alpha$ random mate contributes allele  $A_1$  with probability pA and D values are uncorrelated additive variance  $\sigma_a^2 = 2pq\alpha^2$ , additive gene effects whithin locus interaction component  $\sigma_d^2 = (2pqd)^2$  $\sigma_g^2 = \sigma_a^2 + \sigma_d^2$ , so that  $\sigma_p^2 = \sigma_a^2 + \sigma_d^2 + \sigma_e^2$ Narrow sense heritability  $h^2 = \sigma_a^2/\sigma_p^2$ 

Narrow heritability  $h^2$  is more important than broad  $H^2$ since parents pass their genes not genotypes

### Ex 3: LDL-cholesterol level

Narrow sense heritability

 $554.2 = 500.0 + 39.2 + 15.0, h^2 = 0.071$ 

## Ex 4: inheritance of rare diseases

autosomal disease allele  $A_2$  of low frequency  $q \approx 0$ assuming  $\sigma_e^2 = 0$ Rare recessive disease: d = a $\alpha = 2qa, \sigma_a^2 = 8pq^3a^2, \sigma_d^2 = 4p^2q^2a^2$ Low inheritance  $h^2 = \frac{\sigma_a^2}{\sigma_a^2 + \sigma_d^2} = \frac{q}{1+q} \approx 0$ affected offspring come usually from unaffected parents Rare dominant disease: d = -a $\alpha = 2pa, \sigma_a^2 = 8p^3qa^2, \sigma_d^2 = 4p^2q^2a^2$ High inheritance  $h^2 = 2\frac{p}{1+p} \approx 1$ affected offspring have one affected parent

## Dependence on allele frequency

Phenotypic value distribution is a  $(p^2, 2pq, q^2)$  mixture of three distributions for three genotypes



Draw two pdf curves for phenotypic value

1) at  $p = \frac{1}{2}$  with negative  $\mu = \frac{d}{2}$ 2) at  $p = \frac{3}{4}$  with positive  $\mu = \frac{a}{2} + \frac{3d}{8}$ 

## Ex 5: coat coloration

x = proportion of black color on the guinea pig coat Normalizing transformation

if  $0 \le x \le 1$ , then

 $P = \arcsin\sqrt{x}$  often has near normal distribution Fixed environment: P = M and  $\sigma_p^2 = \sigma_g^2$ 

genotype	x	P	$P-\mu^*$
$A_1A_1$	0.87	68.87	a = 68.87 - 61.60 = 7.27
$A_1A_2$	0.76	60.67	d = 60.67 - 61.60 = -0.93
$A_2A_2$	0.66	54.33	-a = 54.33 - 61.60 = -7.27

Variances as functions of p

$$\begin{split} \sigma_a^2 &= -6.92p^4 - 40.25p^3 - 33.22p^2 + 80.39p \\ \sigma_d^2 &= 3.46p^4 - 6.92p^3 + 3.46p^2 \\ \sigma_g^2 &= -3.46p^4 - 47.17p^3 - 29.76p^2 + 80.39p \\ \text{Fig 9.15A-C, p. 433: variance profiles} \end{split}$$

## Ex 6: chromosome inversions

D. pseudoobscura: inversions in the 3rd chromosome  $A_1 = \text{standard}, A_2 = \text{arrowhead chromosomes}$ overdominance  $w_{11} = 0.47, w_{12} = 1.00, w_{22} = 0.62$ Fig 9.15D, p. 433: variance profiles

p	0	0.2	0.418	0.8	1
$\alpha = 0.38 - 0.91p$	0.38	0.198	0	-0.348	-0.53
$\sigma_a^2 = 2pq\alpha^2$	0	0.0125	0	0.0388	0
$\sigma_d^2 = 0.83(pq)^2$	0	0.0212	0.049	0.0212	0
$\sigma_g^2 = \sigma_a^2 + \sigma_d^2$	0	0.0337	0.049	0.06	0
$h^2 = \sigma_a^2 / \sigma_g^2$	_	37.1%	0	64.7%	_

equilibrium frequency  $\hat{p} = \frac{1-0.62}{1-0.47+1-0.62} = 0.418$ 

Fundamental theorem of natural selection: the increase in average fitness at any time is the additive genetic variance in fitness at that time

# 5.3 Truncation selection

Artificial selection aiming at a certain phenotypic value use a truncation point T for parent selection so that the offspring of selected parents have

phenotypic distribution with a desired bias

To estimate heritability compare phenotypic mean values

 $\mu$  = parent mean before selection

 $\mu_s = \text{mean for selected parents}$ 

 $\mu'$  = mean for the offspring of selected parents

R/S = realized heritability

 $S = \mu_s - \mu$  selection differential  $R = \mu' - \mu$  response to selection

Prediction equation:  $R = Sh^2$  irrespective of T

#### Ex 7: seed weight

Fig 9.6, p. 409: edible beans of the genus *Phaseolus* 

$$P =$$
 weight of seed in mg, truncation point  $T = 650$   
 $\mu = 403.5, \, \mu_s = 691.7, \, \mu' = 609.1, \, \frac{R}{S} = \frac{205.6}{288.2} = 71.3\%$ 





verify that  $\mu = 19.304$ ,  $\mu_s = 22.727$ ,  $\mu' = 20.149$ realized heritability  $h^2 = \frac{\mu' - \mu}{\mu_s - \mu} = \frac{0.845}{3.423} = 0.247$ 

# **Repeated truncation selection**

Selection program over n generations with

new truncation points changing in certain direction  $\mu_0 \xrightarrow{T_0} \mu_{s0} \xrightarrow{h^2} \mu_1 \xrightarrow{T_1} \mu_{s1} \xrightarrow{h^2} \dots \mu_{n-1} \xrightarrow{T_{n-1}} \mu_{s(n-1)} \xrightarrow{h^2} \mu_n$   $S_0 = \mu_{s0} - \mu_0, R_0 = \mu_1 - \mu_0, R_0 = S_0 h^2$  $S_1 = \mu_{s1} - \mu_1, R_1 = \mu_2 - \mu_1, R_1 = S_1 h^2, \dots$  Total response to selection assuming constant  $h^2$   $\mu_n - \mu_0 = R_0 + R_1 + \ldots + R_{n-1} = (S_0 + \ldots + S_{n-1})h^2$ cumulative selection differential  $C_n = S_0 + \ldots + S_{n-1}$ 

## Ex 9: body weight in mice

Fig 9.19, p. 445 body weight in mice plotted against  $C_t$ linearity supports the assumption of constant  $h^2$ which is usally true for at least ten first generations

### Ex 10: oil content in corn

Fig 9.4, p. 407: selection for high oil content in corn seeds over 76 generations,  $\mu_0 = 4.8\%$ ,  $\mu_{76} = 18.8\%$ 

Given that  $C_t$  increased by 1.1% per generation estimate  $h^2 = \frac{18.8-4.8}{1.1\times76} = 0.168$ 

#### 5.4 Resemblance between relatives

Another characterisation of  $h^2$  via comparison of

 $P_o =$  male offspring's phenotypic values

 $P_f$  = father's phenotypic values

Regression line

 $P_o = \mu_o + b(P_f - \mu_f)$  with the slope  $b = \frac{\text{Cov}(P_o, P_f)}{\text{Var}(P_f)}$ Diallelic model neglecting the environmental component

$$\operatorname{Cov}(P_o, P_f) = \operatorname{E}(P_o \cdot P_f) - \mu^2 = pq\alpha^2 = \frac{1}{2}\sigma_a^2$$
$$b = \frac{\sigma_a^2}{2\sigma_p^2} = \frac{h^2}{2}$$

joint distribution	O = a	O = d	O = -a	total
$P = a,  A_1 A_1$	$p^3$	$p^2q$	0	$p^2$
$P = d,  A_1 A_2$	$p^2q$	pq	$pq^2$	2pq
$P = -a, \ A_2 A_2$	0	$pq^2$	$q^3$	$q^2$
total	$p^2$	2pq	$q^2$	1

Offspring and midparent value

$$P_h = \frac{1}{2}(P_m + P_f)$$
  
Cov $(P_o, P_h) = \frac{1}{2}\sigma_a^2$ , Var $(P_h) = \frac{1}{2}\sigma_p^2$ ,  $b = h^2$ 

# Ex 11: pupa weight

Fig 9.2, p.401: pupa weight of flour beetle (son, father) regression line slope b = 0.11,  $\hat{h}^2 = 0.22$ 

**Ex 12: shell breadth** in mm in 119 sibships of snail Observed frequencies in 119 sibships of snail

shell breadth in mm (midparent value, offspring mean)

22 (16.25, 17.73)	11 (23.75, 22.84)
$31 \ (18.75, \ 19.15)$	4(26.25, 23.75)
48 (21.25, 20.73)	3(28.75, 25.42)

Sample means and sample variances

 $\bar{P}_h = 20.26, \ \bar{P}_o = 20.18, \ s_h^2 = 8.18, \ s_o^2 = 3.31$ Sample covariance  $= \frac{1}{118} [22 \cdot (16.25 - 20.26) \cdot (17.73 - 20.18) + \dots]$ 

 $+ 3 \cdot (28.75 - 20.26) \cdot (25.42 - 20.18)] = 5.18$ Estimated narrow-sense heritability  $\hat{h}^2 = \frac{5.18}{8.18} = 0.634$ 

# **Observed** heritabilities

Fig 9.17-18, p. 438-9: animal and plant  $h^2$ , human  $H^2$ low heritabilities of fitness related traits

## General covariance and slope

Table 9.7 p. 436: covariances between close relatives



Coefficient of coancestry for two individuals  $\searrow$ 

 $F_{XY} = F_I = P(IBD \text{ genes of hypothetical offspring } I)$ 

В

A

## Ex 13: full siblings

Two genes in I are IBD if they both come

1. from the same grandparent I2. from the same chromosome of that grandparent  $F_{XY} = 0.5 \cdot 0.5 = 0.25$  $r = 2 \cdot 0.25 = 0.5$  $u = F_{AA}F_{BB} + F_{AB}F_{BA} = 0.5 \cdot 0.5 + 0 \cdot 0 = 0.25$ 

Covariance and slope

$$\operatorname{Cov}(X,Y) = \frac{\sigma_a^2}{2} + \frac{\sigma_d^2}{4}, \ b = \frac{h^2}{4} + \frac{H^2}{4}$$