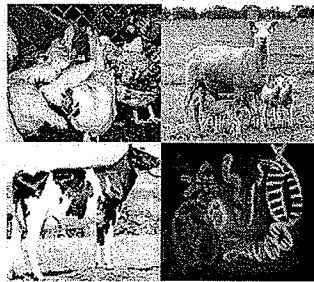


## Response to selection II



Karen Marshall



IAEA, Korea, April, 2006

## Response will be examined for

Own phenotype  $R = ih^2\sigma_p$   $R = ih\sigma_A$

Repeated measures

Correlated traits

Selection on BLUP EBVs / selection indices

Response to selection II

## Why do repeated measures differ?

Repeated measures differ due to *temporary environmental effects*

$$V_E = V_{EP} + V_{ET}$$

Environmental variance ( $V_E$ ) =

environmental variance due to permanent effects ( $V_{EP}$ ) +  
environmental variance due to temporary effects ( $V_{ET}$ )

Response to selection II

## Errors with repeated measures

Animal	E for measurement # 1 to 5; drawn from $N(0,1)$ *					Mean
	1	2	3	4	5	
1	-0.66	-1.01	-0.09	0.01	-1.44	-0.64
2	-1.40	2.11	0.64	1.53	1.46	0.87
3	0.67	0.66	-0.35	-0.80	-0.11	0.01
4	-0.94	0.48	0.32	-0.03	-1.75	-0.38
5	1.16	0.39	0.41	0.22	0.32	0.50
6	0.01	-1.73	1.85	1.22	0.09	0.29
7	-0.37	-0.97	0.75	0.76	2.65	0.56
8	-1.58	1.72	0.66	-0.83	-1.99	-0.40
9	-0.01	-0.81	-0.21	-2.11	-0.75	-0.78
10	-1.71	-0.43	-0.02	0.31	0.94	-0.18
11	0.62	-1.27	-0.45	-0.37	0.09	-0.28
12	0.15	-0.99	0.62	-0.74	0.25	-0.14
13	1.37	-1.04	-1.46	-0.24	0.38	-0.20
14	-1.42	-0.85	-0.14	0.97	1.83	0.08
15	-1.16	-1.36	-1.22	-1.06	0.43	-0.88
StdDev	1.01	1.15	0.82	0.97	1.29	0.50

\* Environmental measurements were randomly drawn from a normal distribution with mean 0 and standard deviation of 1.

Response to selection II

## Repeatability

Defined as

$$r = \frac{V_G + V_{EP}}{V_G + V_{EP} + V_{ET}}$$

ranges from 0 to 1

The larger the temporary environmental effects the lower the repeatability

Response to selection II

## Response using repeated measures

When the mean of repeated measures are used, temporary environmental effects tend to cancel out.

$$V_{P_n} = V_A + V_{PE} + \frac{V_{TE}}{n}$$

This results in a reduction in  $V_P$  (and  $\sigma_P$ )

$$V_{P_n} = \left( r + \frac{1-r}{n} \right) V_P \quad \sigma_{P_n} = \sqrt{\left( r + \frac{1-r}{n} \right)} \sigma_P$$

Response to selection II

## Response using repeated measures

Response when selecting on one measure

$$R = ih^2\sigma_p = i \frac{V_A}{V_P} \sigma_p = i \frac{\sigma_A \sigma_A}{\sigma_p \sigma_p} \sigma_p = i \frac{\sigma_A}{\sigma_p} \sigma_A$$

Response when selecting on mean of n measures

$$R_n = ih^2\sigma_{Pn} = i \frac{V_A}{V_{Pn}} \sigma_{Pn} = i \frac{\sigma_A \sigma_A}{\sigma_{Pn} \sigma_{Pn}} \sigma_{Pn} = i \frac{\sigma_A}{\sigma_{Pn}} \sigma_A$$

Proportional decrease in phenotypic standard deviation equates to proportional increase in response

$$R_n = R \frac{\sigma_p}{\sigma_{Pn}}$$

Response to selection II

## Additional response using repeated measures

Additional response depends on repeatability

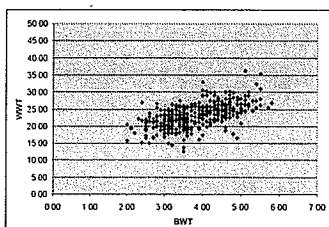
	n=2	n=5
r=0.10	35 %	89 %
r=0.50	16 %	29 %
r=0.90	2.6 %	4.3 %

Highly repeatable traits

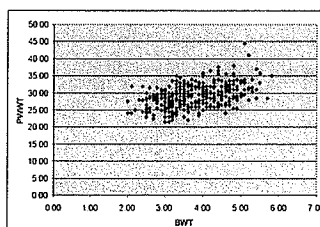
- ❖ measurements are similar
- ❖ additional measurements add little additional information repeated measures result in a small additional increase in response

Response to selection II

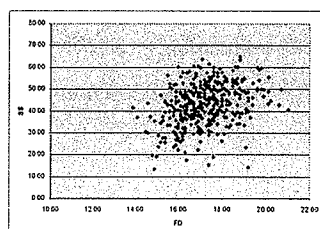
## Trait correlations



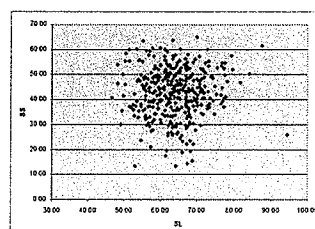
$r=0.57$



$r=0.47$



$r=0.34$



$r=0.02$

Response to selection II

## Correlations between traits

### Genetic basis

- ❖ Genes are pleiotrophic
  - same genes influence the traits
  - e.g. weights over ages, response in two environments
- ❖ Genes for each trait are linked and thus inherited together

### Environmental basis

- ❖ Environmental conditions affecting both traits
  - e.g. muscle and fertility both affected by nutrition

$r_G$  and  $r_E$  do not need to be the same sign

Response to selection II

## Response using correlated traits

$$CR_y = b_A R_x \quad R_x = i_x h_x^2 \sigma_{Px}$$

$$CR_y = i_x r_A h_x h_y \sigma_{Py}$$

correlated response in trait y when selecting on trait x

genetic correlation

phenotypic standard deviation for trait with correlated response

selection intensity (i) for trait you are selecting on

Response to selection II

## $CR_y/R_y$

Response for indirect selection for a trait relative to response for direct selection for a trait

$$\frac{CR_y}{R_y} = \frac{i_x r_A h_x h_y \sigma_{Py} / L_x}{i_y h_y^2 \sigma_{Py} / L_y} = \frac{i_x h_x L_y}{i_y h_y L_x} r_A$$

Response to selection II

## Use of correlated response

### Indirect selection

- ❖ Select on trait X, but interested in response of correlated trait Y
- ❖ Useful if trait X is more heritable or can be measured earlier
- ❖ May be only option if trait Y is too difficult or expensive to measure

Response to selection II

## Example

- ❖ Objective is to increase weight in Atlantic Salmon
- ❖ Can either select on weight directly, or select on length with a correlated response in weight

- $h^2$  weight = 0.09
- $h^2$  length = 0.16
- $r_A = 0.95$

$$\frac{CR_Y}{R_Y} = \frac{i_x h_x L_y}{i_y h_y L_x} r_A = \frac{h_x}{h_y} r_A = \frac{\sqrt{0.16}}{\sqrt{0.09}} 0.95 = 1.27$$

selecting on length gives 27% more response in weight than selecting on weight directly (length is more heritable and correlation is strong)

Response to selection II

## Example

❖ If weight was the more heritable trait

- $h^2$  weight = 0.39
  - $h^2$  length = 0.16
  - $r_A = 0.95$
- $$\frac{CR_Y}{R_Y} = \frac{i_x h_x L_y}{i_y h_y L_x} r_A = \frac{h_x}{h_y} r_A = \frac{\sqrt{0.16}}{\sqrt{0.39}} 0.95 = 0.608$$

*selecting on length gives less response in (weight is more heritable)*

Response to selection II

## Example

❖ If the genetic correlation is weak

- $h^2$  weight = 0.09
  - $h^2$  length = 0.16
  - $r_A = 0.15$
- $$\frac{CR_Y}{R_Y} = \frac{i_x h_x L_y}{i_y h_y L_x} r_A = \frac{h_x}{h_y} r_A = \frac{\sqrt{0.16}}{\sqrt{0.09}} 0.15 = 0.20$$

*selecting on length gives less response in weight than selecting on weight directly*

Response to selection II



## Use of correlated response

To account for genotype x environment (G x E) interactions

For example, wish to compare

- ❖ Breed animals in environment A , with animals sold to commercial users in environment A (direct response)

$$R_x = i_x h_x^2 \sigma_{Px}$$

- ❖ Breed animals in the more favourable environment B with animals sold to commercial users in environment A (correlated response)

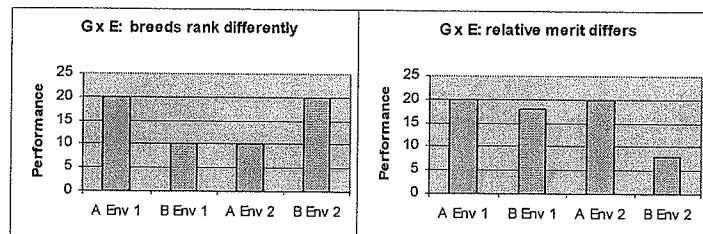
$$CR_y = i_x r_A h_x h_y \sigma_{Py}$$

Response to selection II

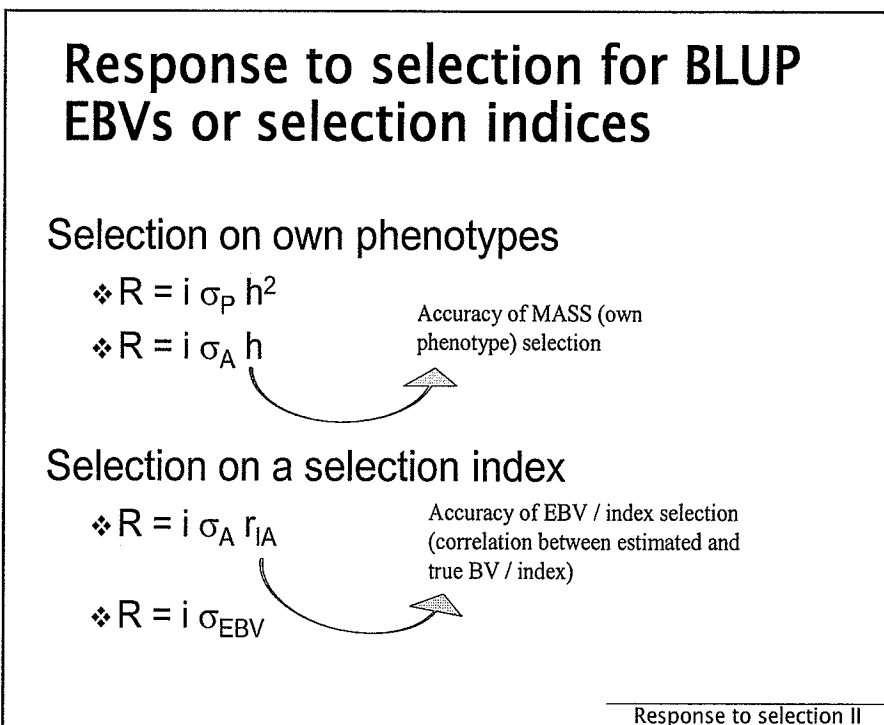
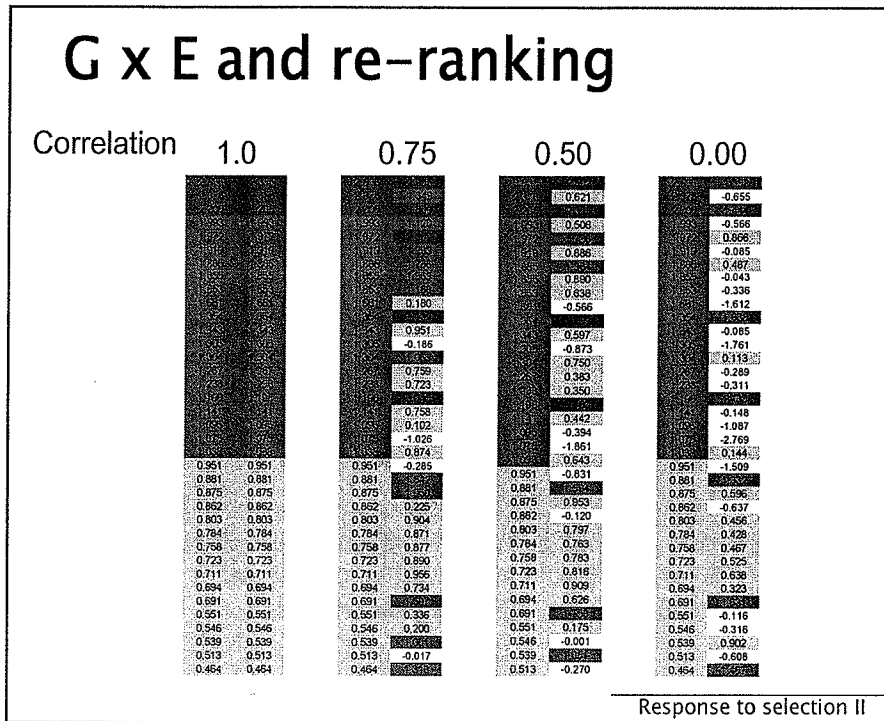
## G x E interaction

At breed / individuals level

- ❖ different breeds / individuals rank differently in different environments
- ❖ difference between breeds / individuals is smaller or larger in different environment



Response to selection II



## Selection accuracy and response

Selection accuracy  $R = i \sigma_A r_{IA}$

- ❖ Range is 0 to 1
  - 0 is no information, 1 is full information
- ❖ Relates to heritability
  - low heritability → less accuracy
- ❖ Can be improved
  - use of repeated measures
  - information from correlated traits
  - information from relatives, especially progeny testing

More information → more accuracy → more response

Response to selection II

## Realised versus predicted response

These can differ due to

- ❖ Random drift
- ❖ Incorrect heritability estimates
- ❖ Inbreeding
- ❖ Non-random mating
- ❖ Natural selection
- ❖ Maternal effects
- ❖ Variance loss due to selection
- ❖ Environmental variation
- ❖ Selection limit reached

Response to selection II

## Additional reading on this topic

**Falconer, D. S.** (1989) Introduction to quantitative genetics, 3<sup>rd</sup> edition. Longman Scientific and Technical, Essex, England

❖ Chapter - *Selection; I The response and its prediction*

**Cameron, N. D.** (1997) Selection indices and prediction of genetic merit in animal breeding. CAB International, Oxon, UK.

❖ Chapter 4 – Identification of animals of high genetic merit

Response to selection II