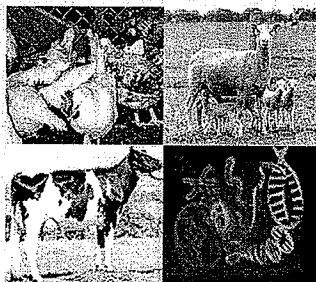


Multiple trait selection



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IAEA, Korea, April, 2006

Multiple trait breeding objectives

- ❖ Breeding objectives = “where you want to go”
- ❖ Should include all traits of economic importance
- ❖ Select on an index where index weights are derived taking into account
 - Relationships between traits
 - Economic value of each trait

Multiple trait selection

Range of possible responses in two traits

$$r_A = 1 \text{ or } -1$$

$r_A = 1$ (-1) both traits will always change in same (opposite) direction

$$r_A \text{ between } 0 \text{ and } 1$$

easy to change traits in same direction

possible to change traits in opposite direction

- ❖ harder if r_A is closer to 1
- ❖ compromise is that maximal response is not obtained for either trait

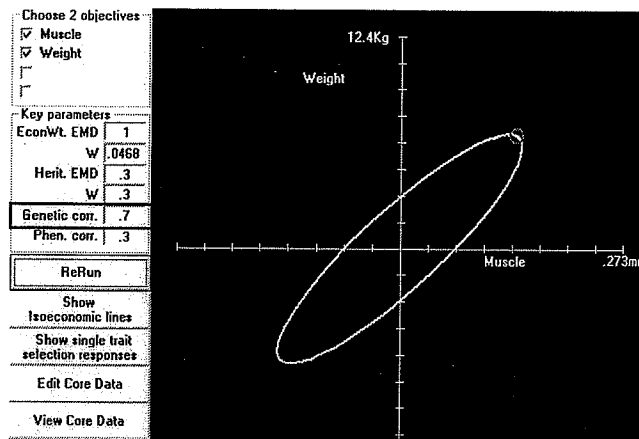
$$r_A \text{ between } 0 \text{ and } -1$$

easy to change traits in opposite direction

possible to change traits in same direction

- ❖ harder if r_A is closer to -1
- ❖ compromise that that maximal response is not obtained for either trait

Multiple trait selection



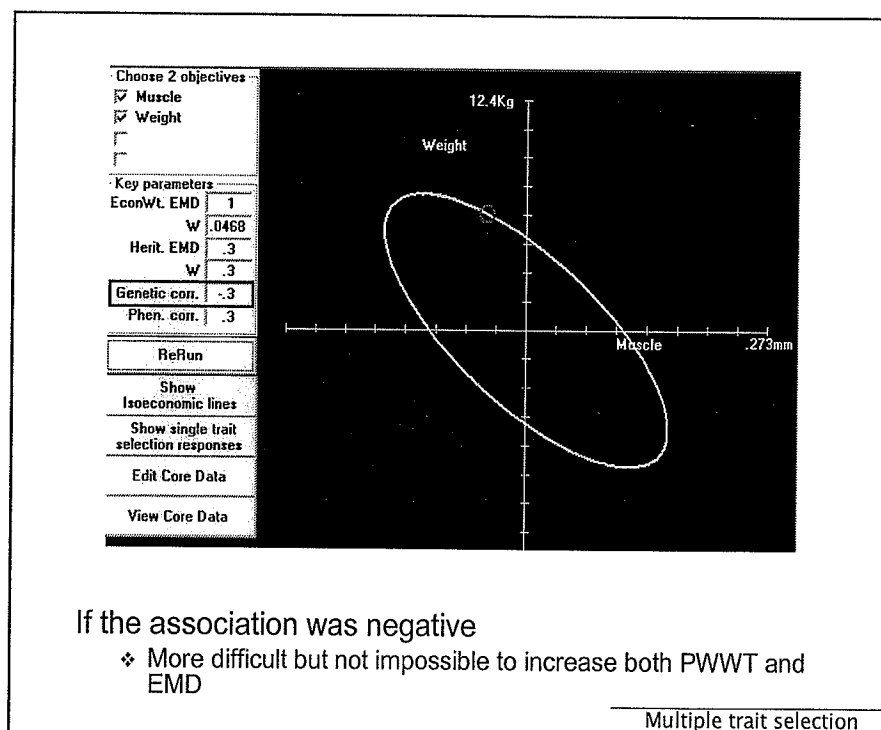
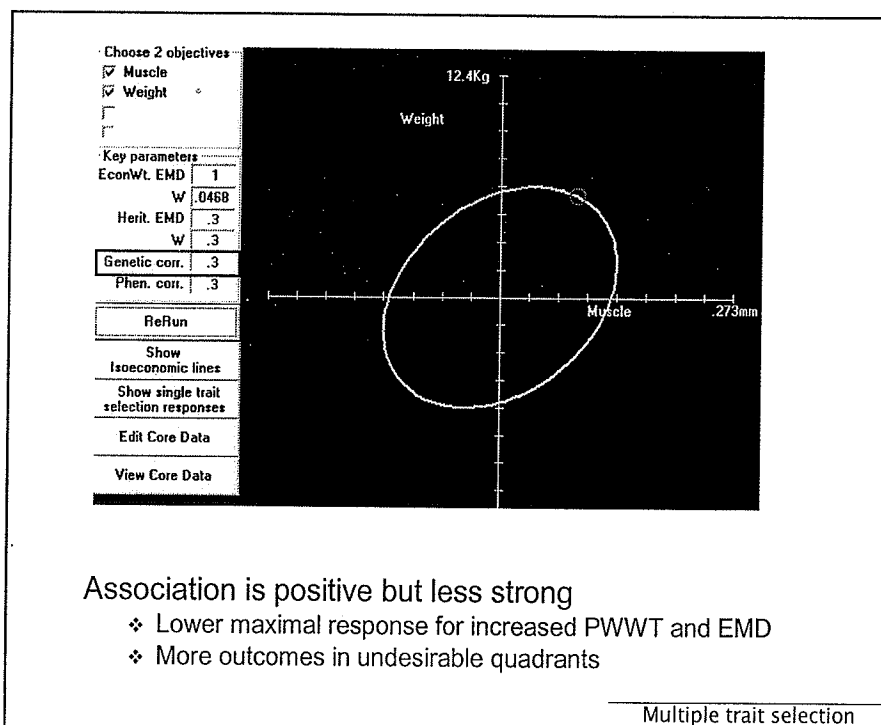
The 'ellipse' is the range of possible outcomes, in one generation

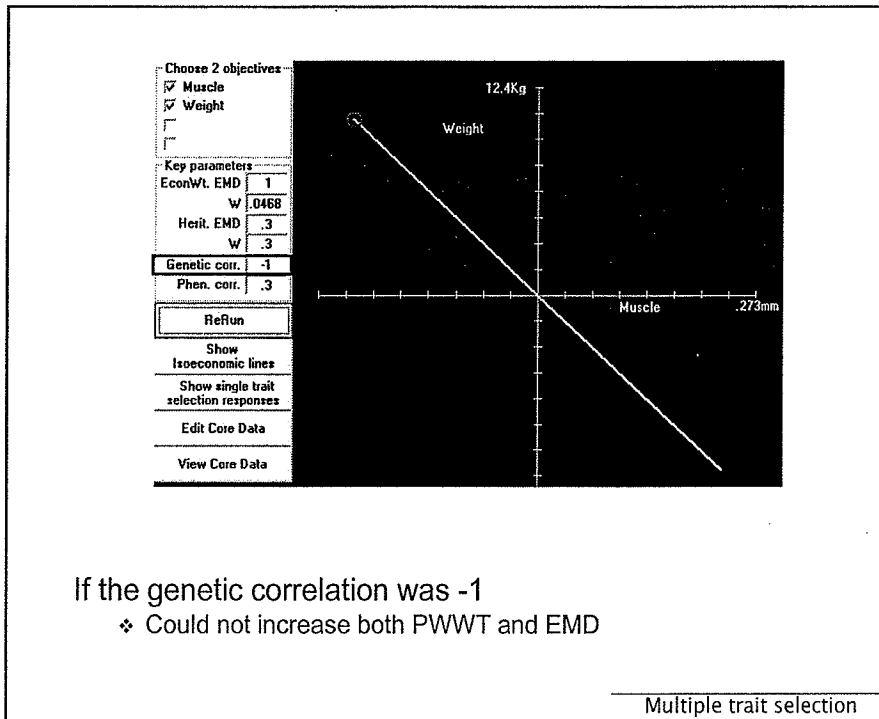
As association is positive

- ❖ most possible outcomes lie in quadrants for high PWWT and high EMD, or low PWWT and low EMD
- ❖ some possible outcomes lie in the other quadrants

Multiple trait selection

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Calculation of weights (b)

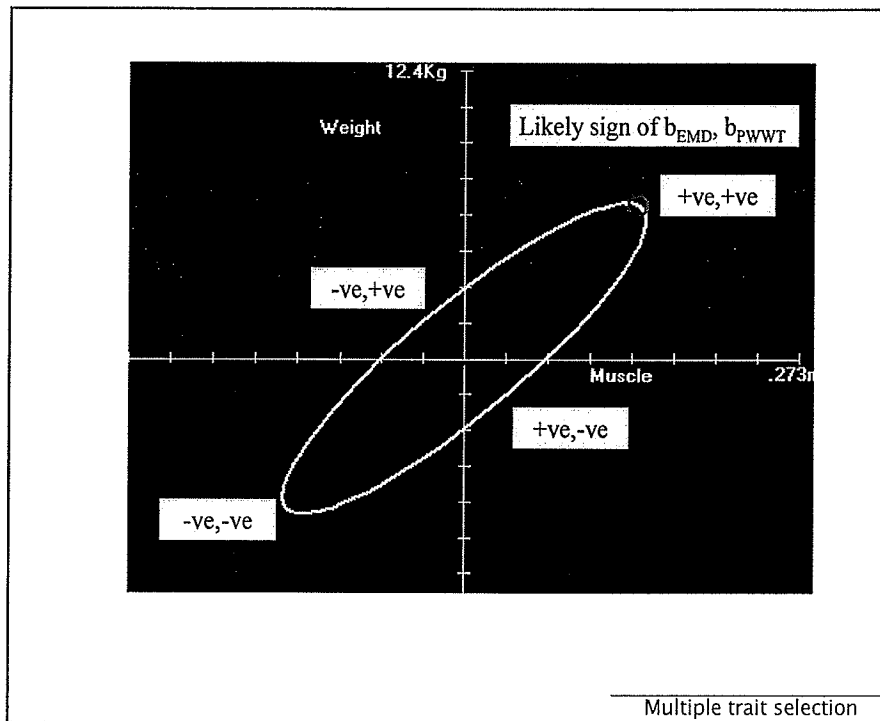
$$\text{Index} = b_1X_1 + b_2X_2 + b_3X_3 + \dots$$

Weights on each information source take into account

- ❖ relationships between traits (set)
- ❖ economic values of breeding objective traits (variable)
- ❖ $b = P^{-1}Ga$ (see later)

The relative response in each trait can be changed by altering the economic values and thus index weights of the traits

Multiple trait selection



Calculation of weights (b)

$$H \text{ (breeding objective)} = b_1X_1 + b_2X_2 + b_3X_3 + \dots$$

$$b = P^{-1}Ga$$

- ❖ **b** is a vector of selection index weights for traits in the selection criteria,
- ❖ **P** is the phenotypic variance-covariance matrix for traits in the selection criteria, $\text{Var}(X) = P$
- ❖ **G** is the genetic covariance matrix between traits in the breeding objective and the traits in the selection criteria, $\text{Cov}(X, H) = G$
- ❖ **a** is a vector of the economic values of traits in the breeding objective

Multiple trait selection

Example

| | | |
|---|--|--|
| <p>Objective</p> <ul style="list-style-type: none"> ❖ GR fat depth (GR) ❖ eye muscle area (EA) | <p>Criteria</p> <ul style="list-style-type: none"> ❖ C fat depth (CF) ❖ Eye muscle area (EA) ❖ Liveweight (LW) | |
|---|--|--|

$$\begin{bmatrix} b_{LW} \\ b_{CF} \\ b_{EA} \end{bmatrix} = \begin{bmatrix} CovP_{LW,LW} & CovP_{LW,CF} & CovP_{LW,EA} \\ CovP_{CF,LW} & CovP_{CF,CF} & CovP_{CF,EA} \\ CovP_{EA,LW} & CovP_{EA,CF} & CovP_{EA,EA} \end{bmatrix}^{-1} \begin{bmatrix} CovA_{LW,EA} & CovA_{LW,GR} \\ CovA_{CF,EA} & CovA_{CF,GR} \\ CovA_{EA,EA} & CovA_{EA,GR} \end{bmatrix} \begin{bmatrix} a_{EA} \\ a_{GR} \end{bmatrix}$$

| | | |
|---------------|---|--|
| Index weights | Phenotypic VCV matrix of traits in the selection criteria | Genetic covariance matrix between traits in the selection criteria and objective |
|---------------|---|--|

Economic values of breeding objective traits

Multiple trait selection

Index selection

| | |
|----------------------------|--|
| Variance of the index | $V_{Index} = V_{(b'X)} = b'V_x b = b'Pb$ |
| \$ response per generation | $\$R = i\sigma_{Index} = i\sqrt{b'Pb}$ |
| Component trait response | $\Delta G = \frac{b'G}{\sigma_{Index}}$ |

Case study

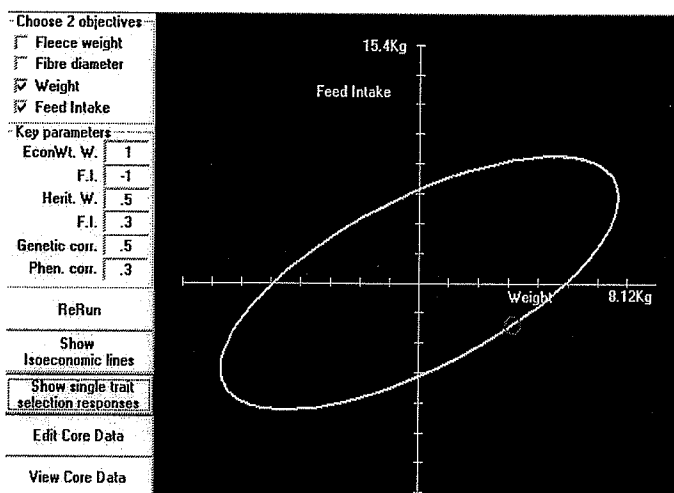
Weight (W) & Feed Intake (FI)

- ❖ Traits have a positive genetic and phenotypic correlation
- ❖ Typical industry objective is to increase weight and decrease feed intake

| | h^2 | σ_P |
|-------|-------|------------|
| W | 0.5 | 17kg |
| FI | 0.3 | 25kg |
| r_A | 0.5 | |
| r_P | 0.3 | |

Multiple trait selection

Ellipse of possible responses



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| Breeding objective & selection criteria | | Economic values | | Index weights | | Response | |
|---|------|-------------------|----------------------|---------------|----------|----------|----------|
| BO | SC | ev_W assumed | ev_{FI} assumed | b_W | b_{FI} | R_W | R_{FI} |
| W | W | 1 | 0 | 0.5 | na | 8.50 | 4.84 |
| W | W&FI | 1 | 0 | 0.49 | 0.03 | 8.53 | 5.40 |
| W&FI | W&FI | 1 | -1 | 0.32 | -0.23 | 4.02 | -2.64 |
| W&FI | W&FI | 1 | -3 | -0.97 | -7.65 | -3.40 | -7.54 |

Multiple trait selection

Relationship between economic values and breeding objectives

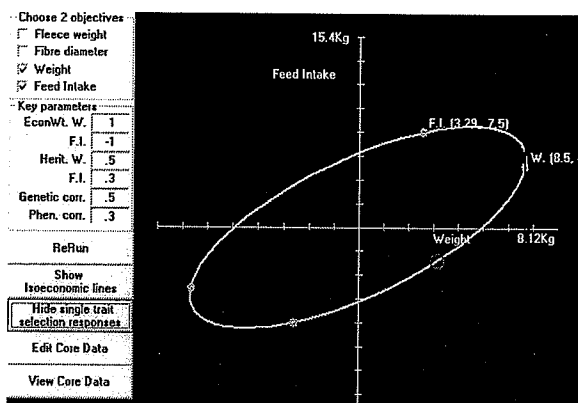
| BO | SC | ev_W assumed | ev_{FI} assumed | b_W | b_{FI} | R_W | R_{FI} |
|------|------|-------------------|----------------------|-------|----------|-------|----------|
| W | W | 1 | 0 | 0.5 | na | 8.50 | 4.84 |
| W | W&FI | 1 | 0 | 0.49 | 0.03 | 8.53 | 5.40 |
| W&FI | W&FI | 1 | -1 | 0.32 | -0.23 | 4.02 | -2.64 |
| W&FI | W&FI | 1 | -3 | -0.97 | -7.65 | -3.40 | -7.54 |

Multiple trait selection

Single trait breeding objective

| BO | SC | ev_W assumed | ev_{FI} assumed | b_W | b_{FI} | R_W | R_{FI} |
|------|------|-------------------|----------------------|-------|----------|-------|----------|
| W | W | 1 | 0 | 0.5 | na | 8.50 | 4.84 |
| W | W&FI | 1 | 0 | 0.49 | 0.03 | 8.53 | 5.40 |
| W&FI | W&FI | 1 | -1 | 0.32 | -0.23 | 4.02 | -2.64 |
| W&FI | W&FI | 1 | -3 | -0.97 | -7.65 | -3.40 | -7.54 |

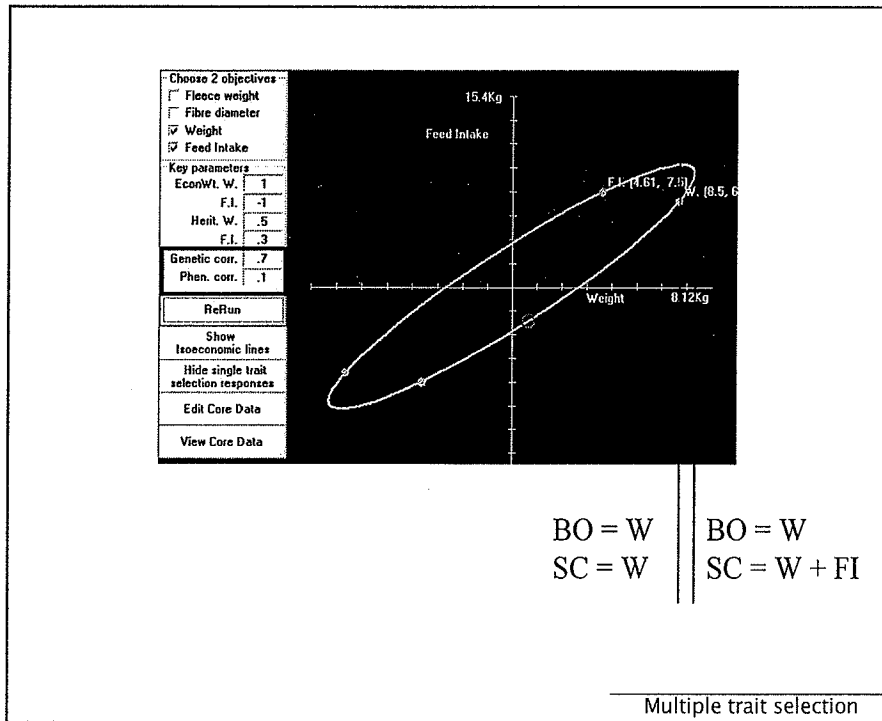
Multiple trait selection



$$\begin{array}{l|l} \text{BO} = W & \text{BO} = W \\ \text{SC} = W & \text{SC} = W + \text{FI} \end{array}$$

Multiple trait selection

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Multiple trait breeding objective

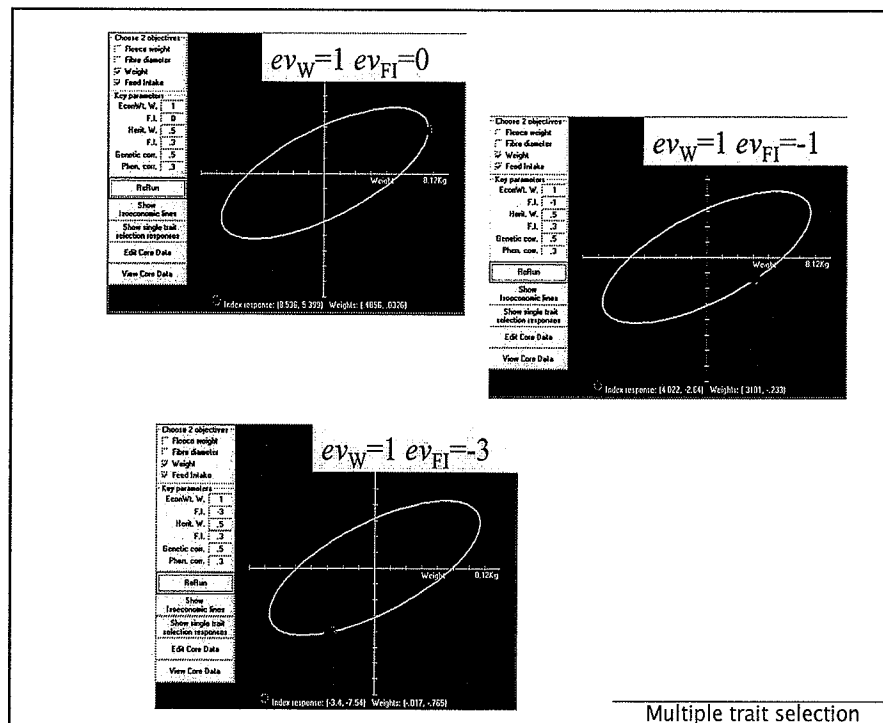
| BO | SC | ev_W assumed | ev_{FI} assumed | b_W | b_{FI} | R_W | R_{FI} |
|------|------|-------------------|----------------------|-------|----------|-------|----------|
| W | W | 1 | 0 | 0.5 | na | 8.50 | 4.84 |
| W | W&FI | 1 | 0 | 0.49 | 0.03 | 8.53 | 5.40 |
| W&FI | W&FI | 1 | -1 | 0.32 | -0.23 | 4.02 | -2.64 |
| W&FI | W&FI | 1 | -3 | -0.97 | -7.65 | -3.40 | -7.54 |

Multiple trait selection

Note the relationship between economic values, index weights, and subsequent response

| BO | SC | ev_W assumed | ev_{FI} assumed | b_W | b_{FI} | R_W | R_{FI} |
|------|------|-------------------|----------------------|-------|----------|-------|----------|
| W | W | 1 | 0 | 0.5 | na | 8.50 | 4.84 |
| W | W&FI | 1 | 0 | 0.49 | 0.03 | 8.53 | 5.40 |
| W&FI | W&FI | 1 | -1 | 0.32 | -0.23 | 4.02 | -2.64 |
| W&FI | W&FI | 1 | -3 | -0.97 | -7.65 | -3.40 | -7.54 |

Multiple trait selection



Note compromise in trait response

| BO | SC | ev_W assumed | ev_{FI} assumed | b_W | b_{FI} | R_W | R_{FI} |
|------|------|-------------------|----------------------|-------|----------|-------|----------|
| W | W | 1 | 0 | 0.5 | na | 8.50 | 4.84 |
| W | W&FI | 1 | 0 | 0.49 | 0.03 | 8.53 | 5.40 |
| W&FI | W&FI | 1 | -1 | 0.32 | -0.23 | 4.02 | -2.64 |
| W&FI | W&FI | 1 | -3 | -0.97 | -7.65 | -3.40 | -7.54 |

Multiple trait selection

Correct economic values → correct index weights → most \$ returns

| BO | SC | ev_W assumed | ev_{FI} assumed | b_W | b_{FI} | R_W | R_{FI} | \$ |
|------|------|-------------------|----------------------|-------|----------|-------|----------|------|
| W | W | 1 | 0 | 0.5 | na | 8.50 | 4.84 | 3.66 |
| W | W&FI | 1 | 0 | 0.49 | 0.03 | 8.53 | 5.40 | 3.13 |
| W&FI | W&FI | 1 | -1 | 0.32 | -0.23 | 4.02 | -2.64 | 6.66 |
| W&FI | W&FI | 1 | -3 | -0.97 | -7.65 | -3.40 | -7.54 | 4.14 |

\$ return was calculated using real economic values of +1 for weight and -1 for feed intake

Multiple trait selection

Correct economic values → correct index weights → most \$ returns

| BO | SC | ev _W assumed | ev _{FI} assumed | b _W | b _{FI} | R _W | R _{FI} | \$ |
|------|------|----------------------------|-----------------------------|----------------|-----------------|----------------|-----------------|-------|
| W | W | 1 | 0 | 0.5 | na | 8.50 | 4.84 | -6.02 |
| W | W&FI | 1 | 0 | 0.49 | 0.03 | 8.53 | 5.40 | -7.67 |
| W&FI | W&FI | 1 | -1 | 0.32 | -0.23 | 4.02 | -2.64 | 11.94 |
| W&FI | W&FI | 1 | -3 | -0.97 | -7.65 | -3.40 | -7.54 | 19.22 |

\$ return was calculated using real economic values of +1 for weight and -3 for feed intake

Multiple trait selection

Points to note

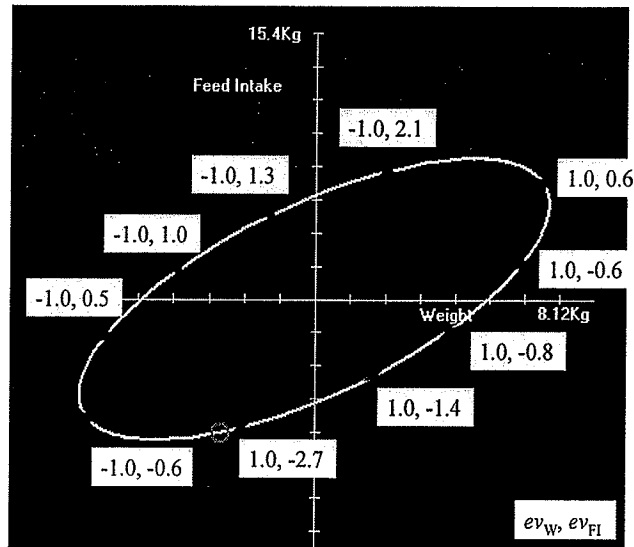
Changing the economic value of traits, alters the index weights, and thus response

The highest \$ return is achieved when the index weights are calculated using the true economic values

Definition of an economic value – is \$ return for a one unit trait increase (all other traits held constant)

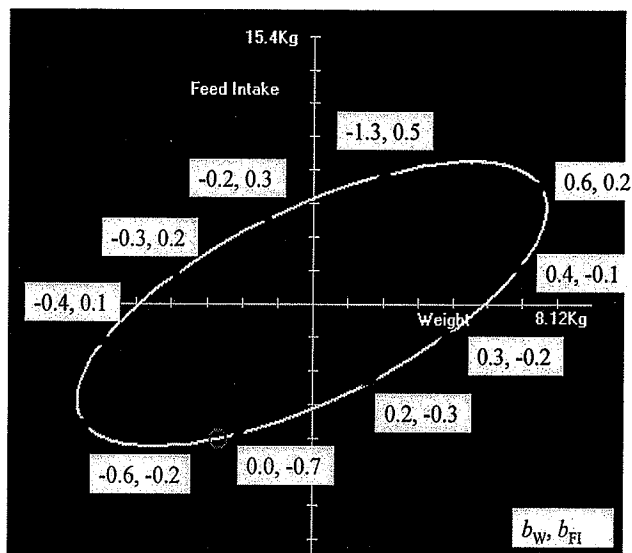
Multiple trait selection

Obtaining different responses by altering the economic value



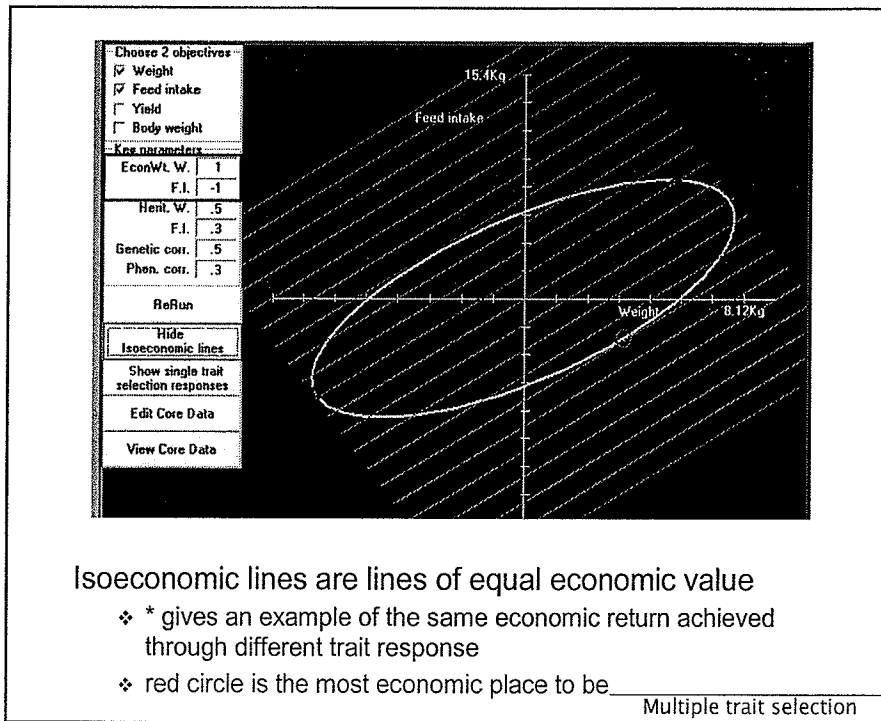
Multiple trait selection

Corresponding index weights



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Could we decrease feed intake with no change in weight?

| BO | SC | ev_W assumed | ev_{FI} assumed | b_W | b_{FI} | R_W | R_{FI} |
|------|------|-------------------|----------------------|-------|----------|-------|----------|
| W&FI | W&FI | 1 | -1 | 0.32 | -0.23 | 4.02 | -2.64 |
| W&FI | W&FI | 1 | -3.2 | 0.26 | -0.92 | 0.00 | -7.12 |
| W&FI | W&FI | 1 | -3 | -0.97 | -7.65 | -3.40 | -7.54 |

Multiple trait selection

A final note

EBVs calculated via multi-trait BLUP already account for relationship between the traits

To combine into an index, simply weight by the economic value

$$Index = ev_{trait1} \times EBV_{trait1} + ev_{trait2} \times EBV_{trait2} \dots$$

Multiple trait selection