



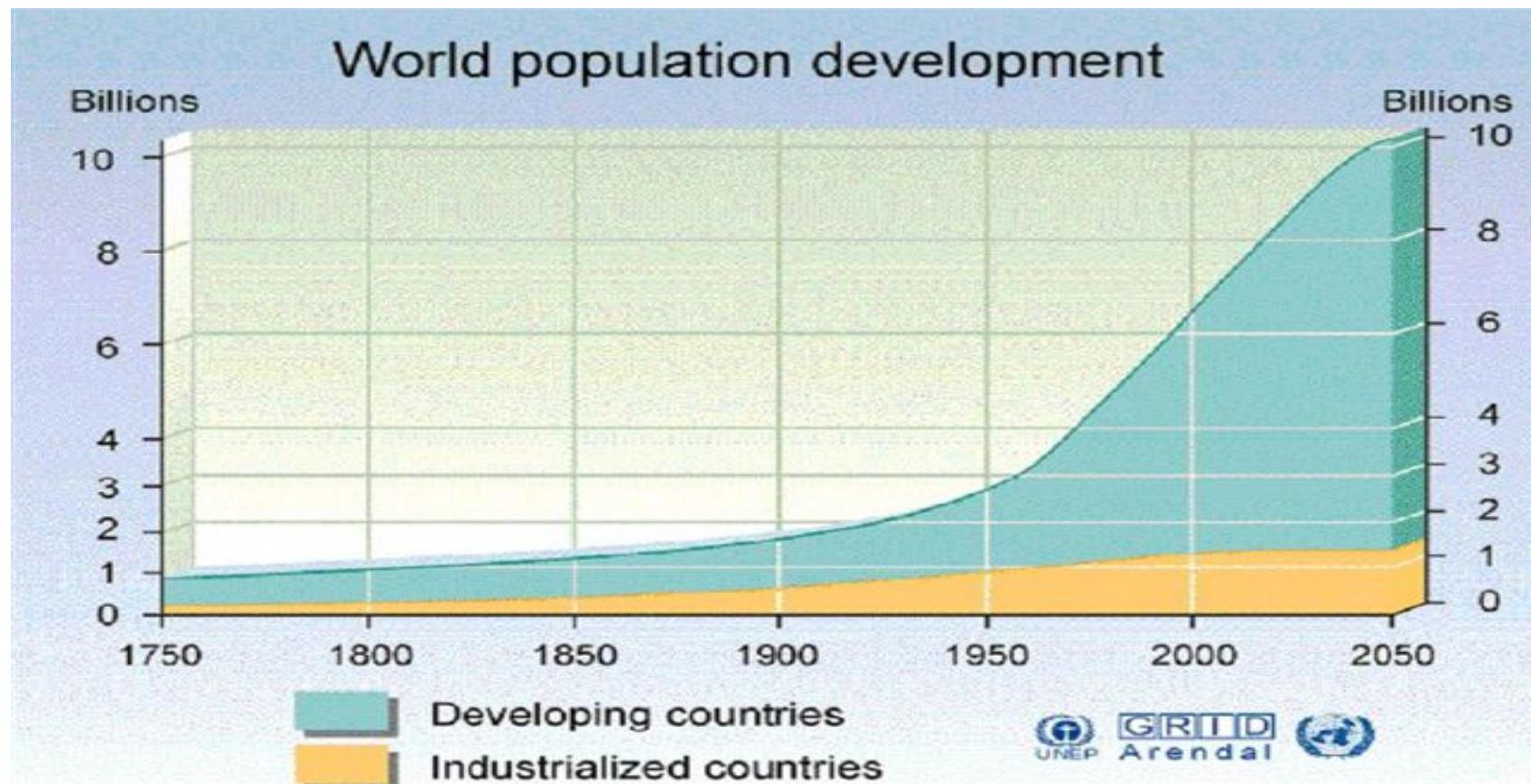
Statistical Analysis of Milk Yield by AMMI Analysis of Genotype-Environment Interaction

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Justifications

1. The world's population is expected to reach 9.1 billion by 2050.



Justifications

2. Population growth led to a massive increase in demand for products of animal origin.

Northern Countries

Specialized breeds
High yields

World trade of genetics

Gene Flow

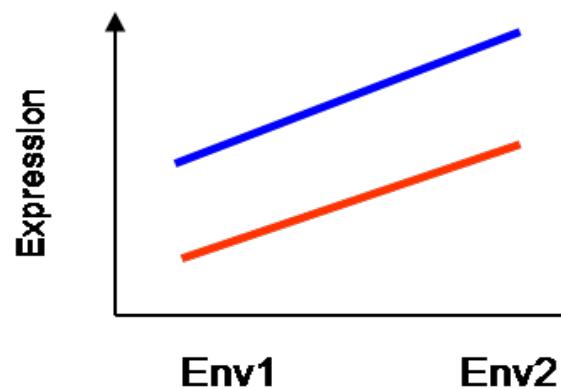
Southern Countries

Indigenous breeds
Low production

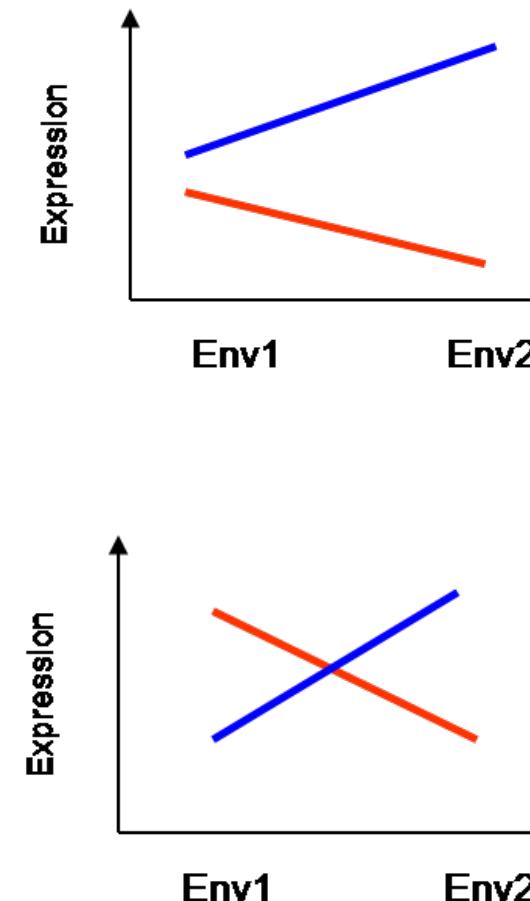
Demand of high
yielding animals

Justifications

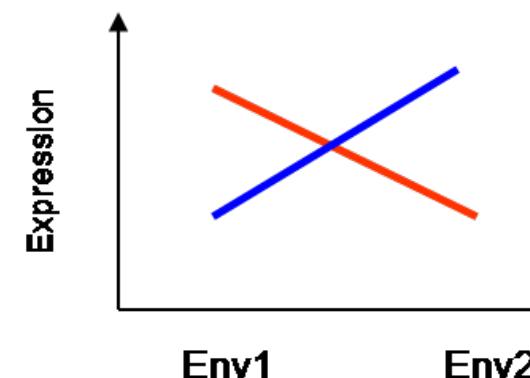
3. A diversity of situations translating G and E



1) No $G \times E$ interaction



2) Interaction
 $G \times E$
(Scaling effect)



3) Interaction
 $G \times E$
(Re-ranking) of
individuals

Genetic Correlations for Production Traits

Regions	Genetic correlations	Authors
US-Latin America	0.78-0.90	Stanton et al. 1991
US-Spain	0.82	Carabano et al. 1989
Canada-New Zealand	0.25-0.29	Charagu et al. 1998
Kenya -UK	0.49	Ojango et al. 2002
European countries	0.75-0.84	Rekya et al. 2001

Objectives

- 1) Evaluate genetic parameters of milk yield in 3 different regions as separate traits**

- 2) Apply the AMMI model to evaluate the GxE interaction in milk yield**

Material and Methods

Data provided by the National Milk Recording Program (OEP)



North

Centre

South

Material and Methods

Means and variation of 305-days milk yield by region

Region	Northern	Central	Southern
Test-day records	54289	6335	2945
Number of cows	5760	677	475
Number of sires	519	70	159
Milk₃₀₅ (Kg)	6125 ±1798	5664 ±1574	5946 ±1632
Fat₃₀₅ (Kg)	207 ±63	194 ±57	203 ±62
Protein₃₀₅ (Kg)	191 ±56	176 ±48	189 ±54

Material and Methods

Number of sires by region

North	Centre	South
519	70	159

Common Sires by region

North- South	North-Centre	South-Centre	North-Centre-South
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63

45

26

26

Model 1 : Additive by Region

Milk yield₃₀₅

=

Overall mean

+

Herd-Year + Season + Age of Dam + Lactation Number + Sire + MGS

+

Residual Error

Model 2. Additive Main Effects and Multiplicative Interaction model (AMMi)

$$Y_{ij} = \mu + G_i + E_j + \sum i_n U_{ni} V_{nj} + e_{ij}$$

Y_{ij} = Milk yield

G_i = The effect of the i^{th} genotype;

E_j = The effect of the j^{th} environment;

i_n = Value of the n^{th} interaction principal component analysis (IPCA), ($n = 1, 2, \dots, P$), where p is the maximum number of estimable main components);

U_{ni} = Value for the i^{th} genotype in the n^{th} IPCA;

V_{nj} = Value of the j^{th} environment in the n^{th} IPCA;

e_{ij} = Residual error.

AMMI Model

$$Y_{ijk} = \mu + g_i + e_j + ge_{ij} + E_{ijk}$$

$$Y_{ijk} - \mu - g_i - e_j - E_{ijk} = ge_{ij}$$

$$ge_{11} \ ge_{12} \ ge_{13} \ \dots \ ge_{1n}$$

$$ge_{21} \ ge_{22} \ ge_{23} \ \dots \ ge_{2n}$$

$$\cdot \quad \cdot \quad \cdot \quad \dots \quad \cdot$$

$$ge_{i1} \ ge_{i2} \ ge_{i3} \ \dots \ ge_{in}$$

$$\cdot \quad \cdot \quad \cdot \quad \dots \quad \cdot$$

$$ge_{k1} \ ge_{k2} \ ge_{k3} \ \dots \ ge_{kn}$$

Results

Rank correlations for the 26 top sires (below diagonal), estimated 305-days heritabilities (on diagonals) and 305-days genetic correlations (above diagonal) by production region

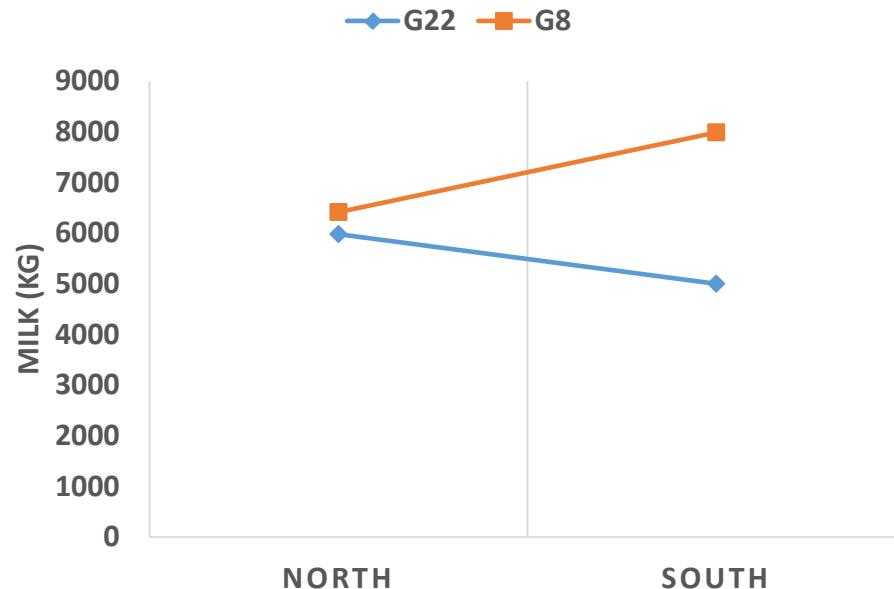
		Region		
		Northern	Central	Southern
Milk ₃₀₅	Nord	0,18 ± 0,06	0,55	0,48
	Centre	0,20	0,11 ± 0,04	0,37
	Sud	0,24	0,41	0,39 ± 0,13
Fat ₃₀₅	Nord	0,09 ± 0,02	0,59	0,37
	Centre	0,52	0,14 ± 0,05	0,31
	Sud	0,46	0,41	0,32 ± 0,11
Protein ₃₀₅	Nord	0,19 ± 0,07	0,56	0,46
	Centre	0,49	0,12 ± 0,04	0,31
	Sud	0,33	0,38	0,30 ± 0,10

Ranking of Genotypes by Region

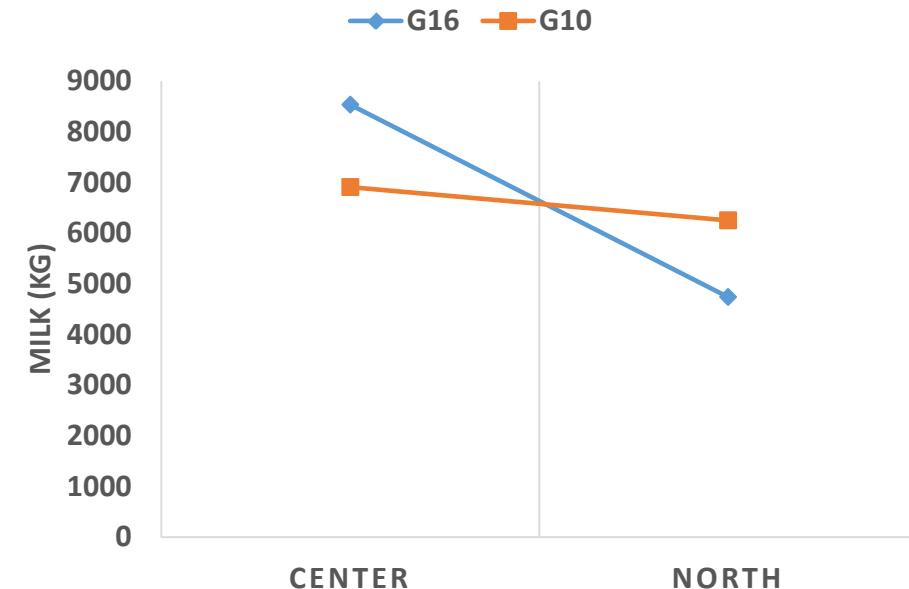
Rank	North	Center	South
1	G9	G19	G 8
2	G12	G8	G4
3	G14	G10	G10
4	G8	G12	G24
5	G5	G9	G13
6	G13	G7	G7
7	G10	G13	G6
8	G11	G6	G11
9	G7	G11	G23
10	G15	G5	G12
11	G1	G15	G1
12	G6	G22	G15
13	G22	G3	G18
14	G3	G24	G14
15	G26	G26	G16
16	G18	G4	G26
17	G2	G23	G19
18	G24	G2	G20
19	G20	G1	G22
20	G21	G18	G3
21	G4	G25	G17
22	G23	G20	G25
23	G17	G21	G5
24	G19	G16	G2
25	G16	G14	G9
26	G25	G17	G21

Results

Example of Interaction Genotype × Region



1) Interaction GxE
(Scaling effect)

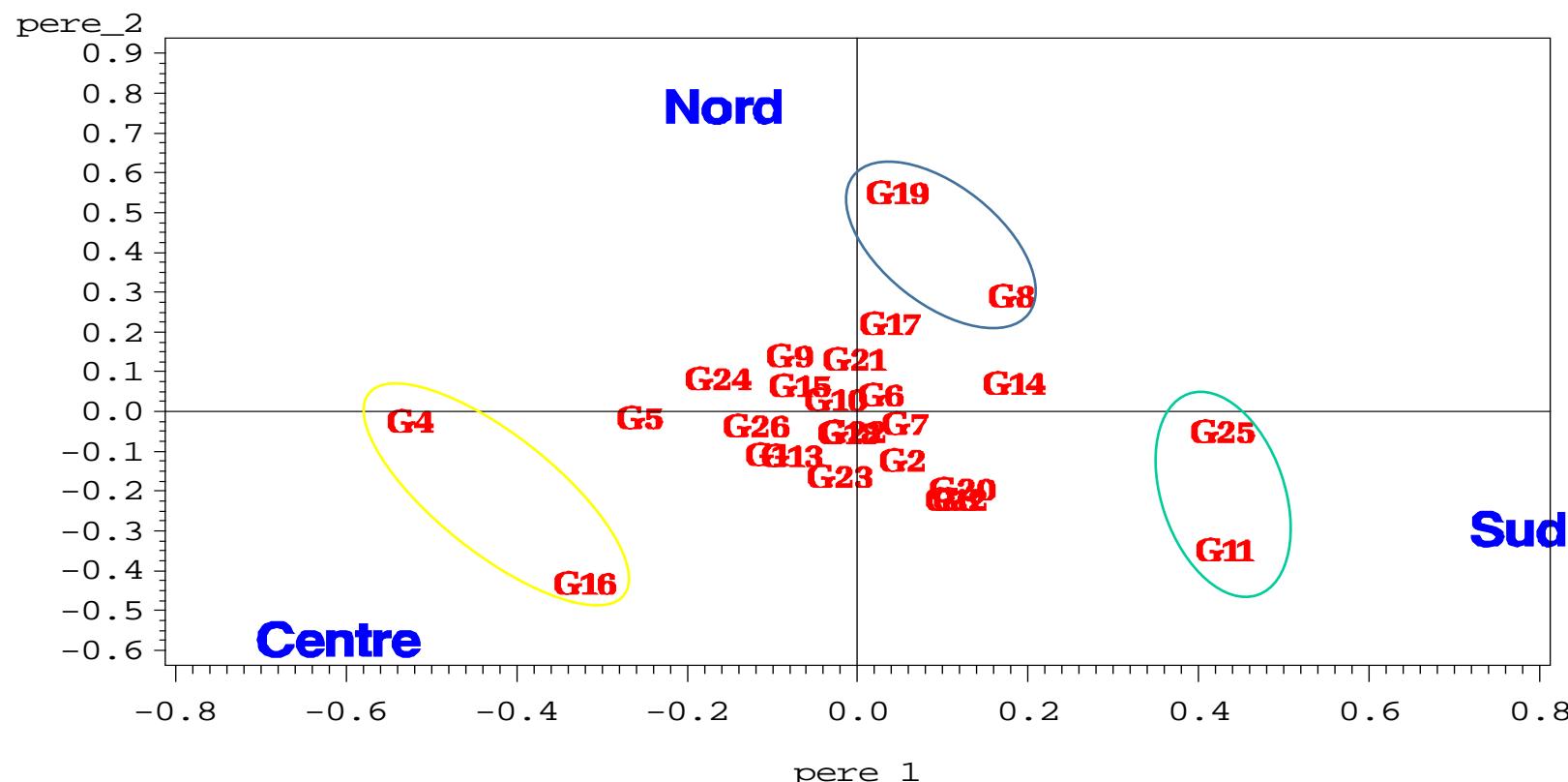


2) Interaction GxE
(Re-ranking) of individuals

Results

AMMI Biplot showing the first two principal axes of interaction (IPCA1-IPCA2) for milk yield and 26 genotypes evaluated in 3 regions

Biplot of G*E Interaction



Conclusions

- Obtained low genetic correlations among regions might indicate the existence of GxE.
- The AMMI method allowed for easy visual identification of superior genotypes for each set of environments.

شکرا



Acknowledgments

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