

Connecting Variety Trialling Systems Across Two Countries

Waqas Malik, Hans-Peter Piepho

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- This testing for VCU is done by examination offices (EO) at the national level in many European countries.
- Ususally, VCU trials last 2 to 3 years and involve 5 to 15 locations per year.

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- Once a variety is accepted to the national list of a country, it can be marketed in that country.
- Moreover, it may be marketed in other European countries as well, even if it has not been tested for VCU in that country.
- Up to that point, no performance assessment has been conducted in those other countries.

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 We investigate how VCU trialling systems of two countries can be connected and integrated.

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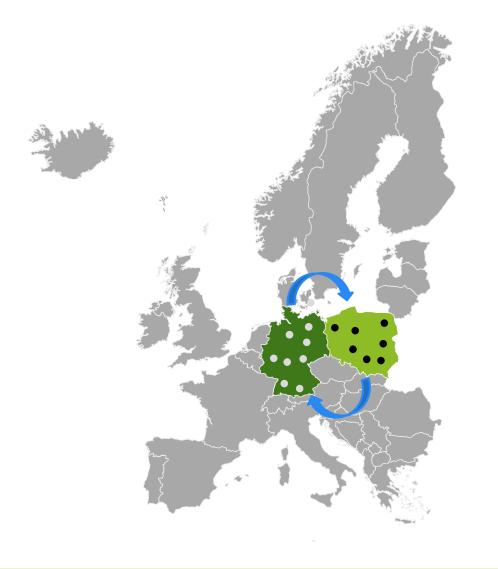
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- So that performance can be assessed for both countries without altering the capacity of the trialling systems.
- We highlight the benefit of a joint analysis of data from two countries, and show how the efficiency of each country's VCU testing system can be improved—without altering the overall capacity of the systems.

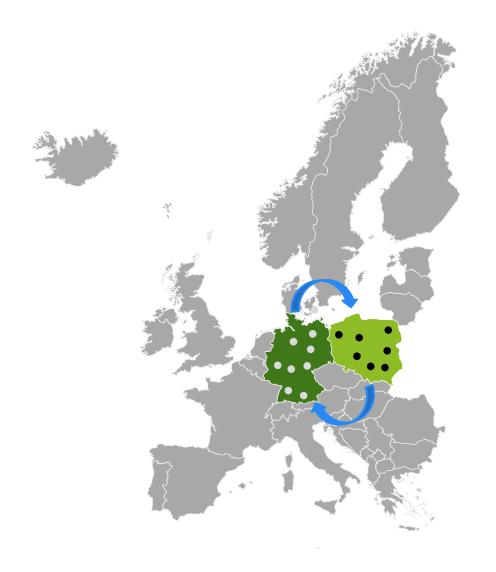
Joint analysis

 A joint analysis of data allows assessing the similarity in performance of those varieties tested in both countries.



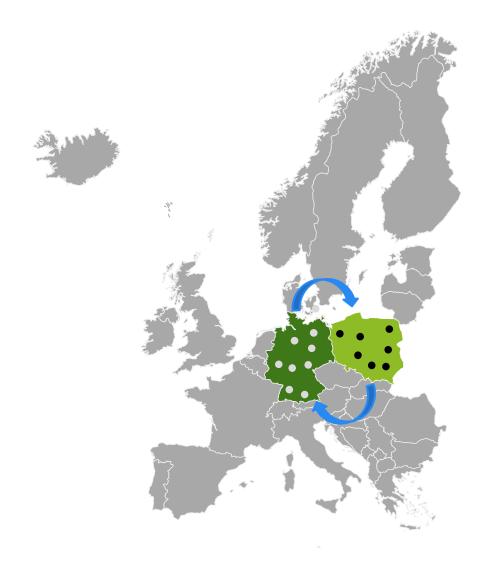
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- Varieties that are in common between countries can be regarded as checks providing some degree of connectivity between countries.
- This gives us an opportunity to borrow strength from the neighboring countries.



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- $(gy)_{ikl}$, $(sy)_{jkl}$, $(gs)_{ijl}$ and $(gsy)'_{ijkl}$ are random interactions.

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Three random effects for which a correlation between countries is allowed

• g_{il} for the <i>i</i> -th variety in the <i>I</i> -th country	$\operatorname{var} \binom{g_{i1}}{g_{i2}} = \begin{pmatrix} \sigma_{g1}^2 & \rho_g \sigma_{g1} \sigma_{g2} \\ \rho_g \sigma_{g2} \sigma_{g1} & \sigma_{g2}^2 \end{pmatrix}$

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• y_{kl} for the k -th year in the l -th country	$\operatorname{var} {y_{k1} \choose y_{k2}} = {\begin{pmatrix} \sigma_{y1}^2 & \rho_y \sigma_{y1} \sigma_{y2} \\ \rho_y \sigma_{y2} \sigma_{y1} & \sigma_{y2}^2 \end{pmatrix}}$

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• $(gy)_{ikl}$ for the <i>i</i> -th variety in the <i>k</i> -th year and <i>I</i> -th country	$\operatorname{var} \begin{pmatrix} (gy)_{ik1} \\ (gy)_{ik2} \end{pmatrix} = \begin{pmatrix} \sigma_{gy1}^2 & \rho_{gy}\sigma_{gy1}\sigma_{gy2} \\ \rho_{gy}\sigma_{gy2}\sigma_{gy1} & \sigma_{gy2}^2 \end{pmatrix}$

- Using variance components from historical data
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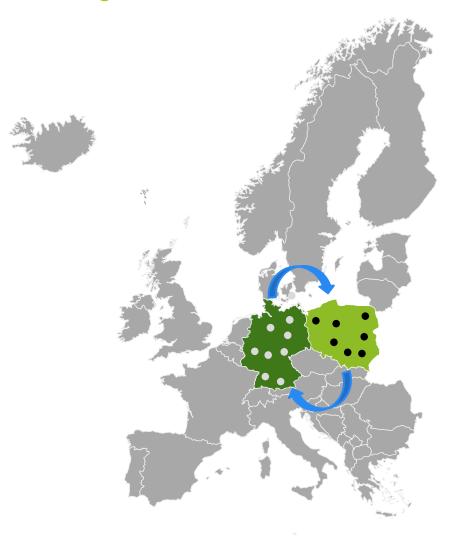
• From these variances of a difference, we computed pairwise heritabilities as given in Piepho et al (2024).

$$h_{ii'(l)}^2 = 1 - \frac{vd_{ii'(l)}}{var(g_{il} - g_{i'l})}$$

Historical maize VCU trial data in Germany and Poland

- Grain maize datasets of registered varieties from German and Polish VCU trials (Malik, 2022)
- Variety means per year and location are provided in the dataset

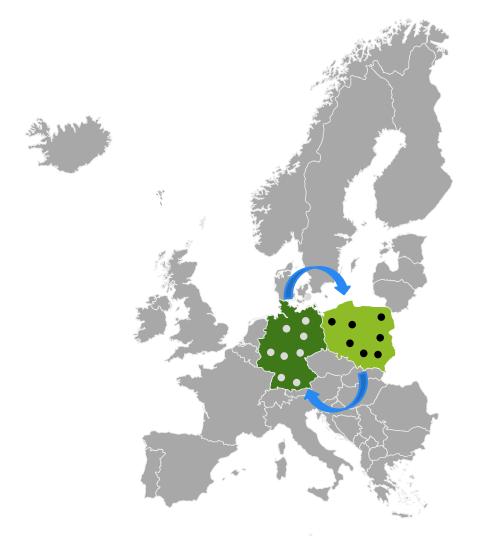
	Germany	Poland
Years	1987 – 2016	1994 – 2017
Varieties	350	634
Locations	121 32	
Common varieties		43



Joint analysis of German and Polish VCU trials

Variance components from Malik (2022)

	Germany	Poland	$ ho_{ ext{(Germany,Poland)}}$
G	11.292	15.021	0.890
Υ	59.706	191.284	0.812
GY	5.144	6.269	0.126
S	99.976	89.923	
GS	4.356	8.462	
YS	155.660	172.154	
Residual (GLY`)	27.775	27.359	



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- Each trial is assumed to have a testing capacity of 200 plots.
- In total, the systems of the two countries combined require a total capacity of 200 × 3 × 12 × 2 = 14,400 plots.
- Furthermore, we assume that a total of 180 varieties are tested across the two countries.

- Three MET designs across both countries will be considered.
 - 1. This MET design reflects the current practice with assuming 100 varieties tested in each country, from which 20 varieties are tested in both countries (180 varieties in total). For simplicity, we assume completely randomized design with two replicates.

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 - 2. We modify the design with all 180 varieties are tested in both countries and according to an incomplete block design with trials corresponding to incomplete blocks.
 - In this MET design, we modify the individual trial design. As the capacity is 200 plots, we have 20 additional plots, on which 20 of the 180 varieties can be duplicated, leading to a partially replicated (p-rep) design.

Comp arison		ountry	Prediction for	Heritabi	Heritability $(h_{ii'}^2)$	
type	Variety 1	Variety 2		Analysis scenario 1 (Correlation=0)	Analysis scenario 2 (Correlation=unstructured)	
1	Germany	+ Poland	Germany	0.82091	0.85993	
2	Germany	+ Poland	Poland	0.82552	0.86210	

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4	Germany		Poland	0	0.65024

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5	Poland	Germany	0	0.65389	
6	Poland	Poland	0.82552	0.82552	

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5	5 Poland6 Poland		Germany	0	0.65389
6			Poland	0.82552	0.82552
7	Germany	Poland	Germany	0.40636	0.73278
8	Germany	Poland	Poland	0.40864	0.82552

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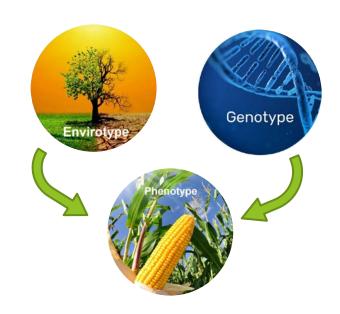
1	Germany + Poland	Germany	0.79682	0.84406
2	Germany + Poland	Poland	0.80479	0.84758

MET design (3): All 180 varieties tested in both countries, 180 varieties per trial, p-rep design per trial

1	Germany + Poland	Germany	0.83136	0.86674
2	Germany + Poland	Poland	0.83332	0.86769

Incorporating marker and environmental information

- Leveraging marker and environmental information allows for more precise estimation of genetic effects.
- Environmental information (covariates) from environmental data and soil properties.
- Fitting the same model but with regression on environmental covariates.



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- More precision can be achieved by adding marker and environmental information.

Reference

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Thank You for your Attention! w.malik@uni-hohenheim.de piepho@uni-hohenheim.de