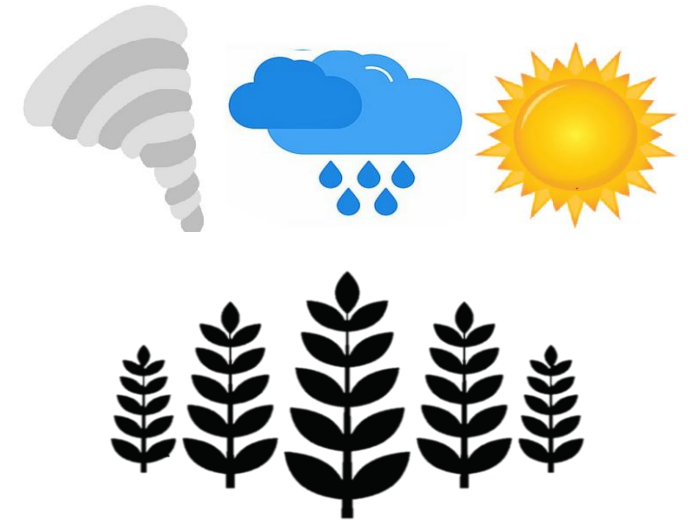


Prediction of genotype performance in untested environments using environmental covariates

Emilia Koch

University of Hohenheim

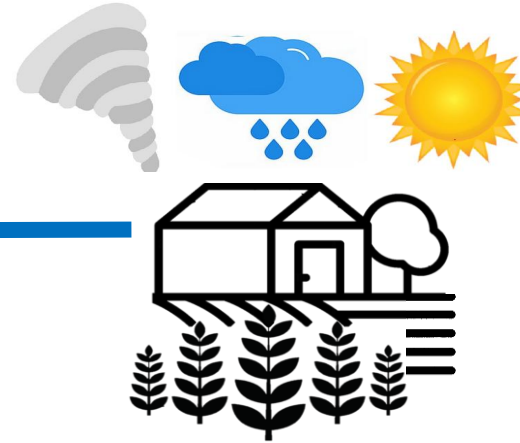
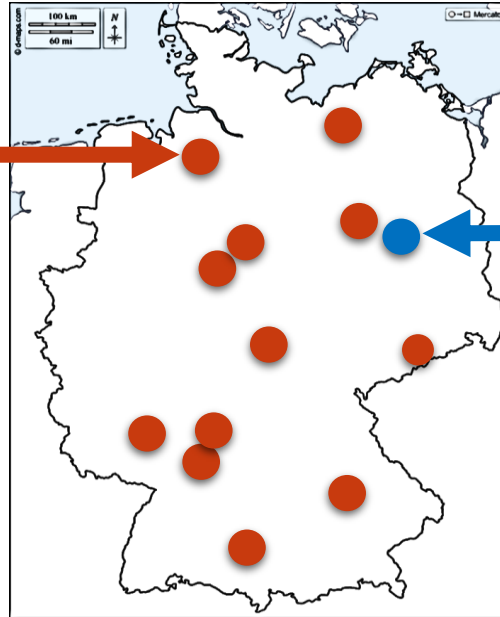
Coauthors: H.P. Piepho, M. Hrachov, J. Hartung



Aim

Federal plant
variety office:

Variety
trials



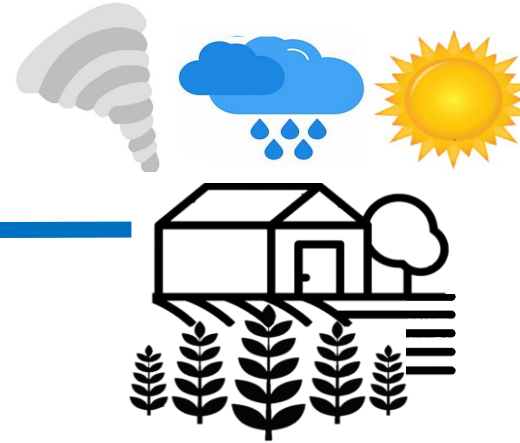
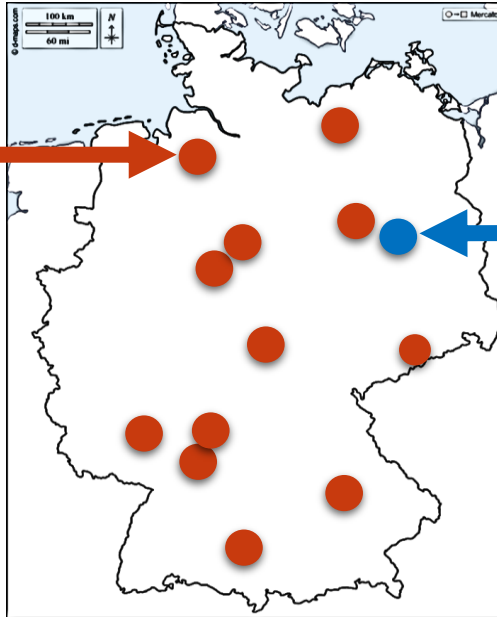
Farmer:
No yield trial

➡ **Which winter wheat
variety to plant next year?**

Aim

Federal plant
variety office:

Variety
trials



Farmer:

No yield trial

➡ Which variety to plant
next year?

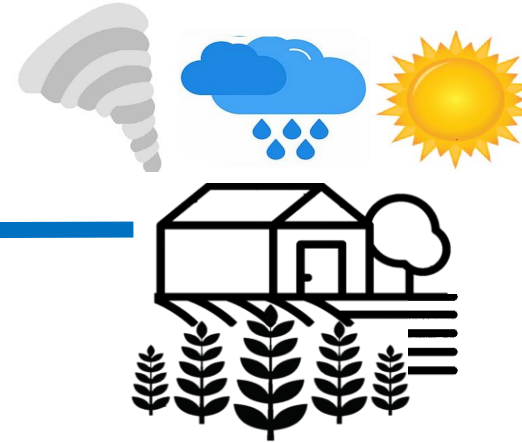
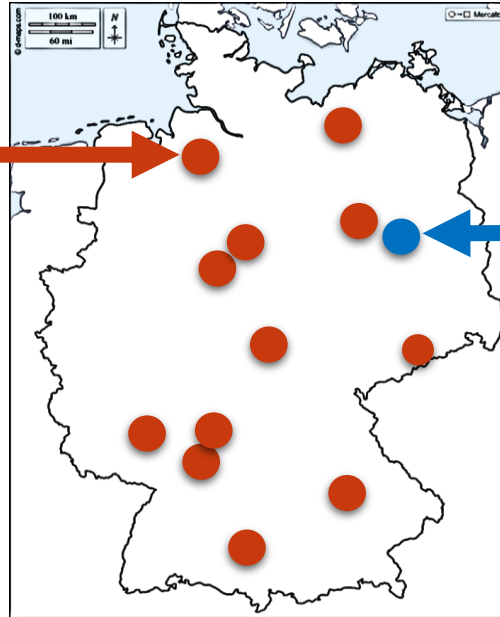


Aim: Find that out

Aim

Federal plant
variety office:

Variety
release trials



Farmer:
No yield trial

➡ Which variety to plant
next year?



➡ Aim: Find that out **how**
to achieve this

How

“Stellschrauben”:

↪ Models

$$\text{Yield} = G + \text{Design} + \beta_{g1} x_{ly1} + \beta_{g2} x_{ly2} + \dots + \beta_{gP} x_{lyP} + \varepsilon$$

↪ Environmental covariates



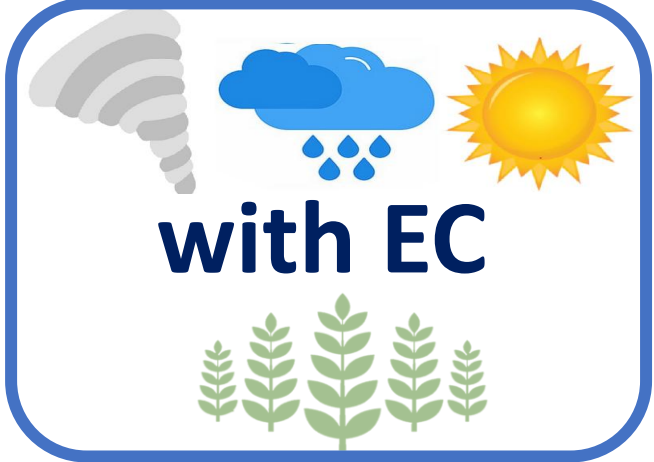
↪ Cross validation

	Y1	Y2	Y3
L1			
L2			
L3			

← Predict

1) Models



Model		EC
a.	Baseline model	without EC  with EC 
b.	Kinship model	
c.	Extended Finley Wilkinson	
d.	Reduced rank regression	
e.	Factorial regression	

EC = Environmental covariates

2) EC = Environmental Covariates

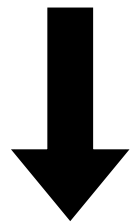


Wind	Rain	Temperature
mean or sum		
stress condition		

2) EC Aggregation



Daily values



average over

a) Month

J	F	M	A	M	J	J	A	S	O	N	D
---	---	---	---	---	---	---	---	---	---	---	---

b) Phenological season

M	A	M	J	J	A	S	O	N	D	J	F
---	---	---	---	---	---	---	---	---	---	---	---

c) Growing season

O	N	J	F	M	A	M	J	J	A	S
---	---	---	---	---	---	---	---	---	---	---

3) Cross validation



	Y1	Y2	Y3
L1			
L2			
L3			

1) LOEO

	Y1	Y2	Y3
L1			
L2			
L3			

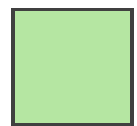
2) LOLY

	Y1	Y2	Y3
L1			
L2			
L3			

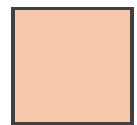
3) LOLY



yield & EC values in



yield values out, EC values in



yield & EC values out

Model evaluation



Indicator variables

- *MSPE*

 - prediction accuracy**

- *MSEPD*

 - genotype differentiation**

Results: 1) Model



<i>Model</i>	MSEPD rank	MSEPD
Kinship	1	47.91
Baseline	2	48.14
Reduced rank regression	3	48.67
Factorial regression	7	52.41

MSPE : prediction accuracy

MSEPD : genotype differentiation

Results: 2) CV



	Y1	Y2	Y3
L1			
L2			
L3			

	Y1	Y2	Y3
L1			
L2			
L3			

	Y1	Y2	Y3
L1			
L2			
L3			

<i>CV</i>	MSEPD rank	MSEPD	MSPE rank	MSPE
LOEO ECin	1	43.74	1	123.20
<i>LOLY ECout</i>	2	49.68	2	221.57
LOLY ECin	3	52.28	3	227.71

MSPE : prediction accuracy

MSEPD : genotype differentiation

Results: 3) EC



<i>EC</i> aggregation	MSEPD rank	MSEPD	MSPE rank	MSPE
Season	1	49.71	1	218.84
Year	2	50.05	2	225.65
Month	3	108.51	3	271.98

M A M J J A S O N D J F

O N J F M A M J J A S

J F M A M J J A S O N D

MSPE : prediction accuracy
MSEPD : genotype differentiation

Time for Questions

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in untested environments
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