



# Yield potentials and yield gaps of soybean production in Austria - a biophysical and economic assessment

**TradeM Workshop  
10-12 October 2016 Norway**

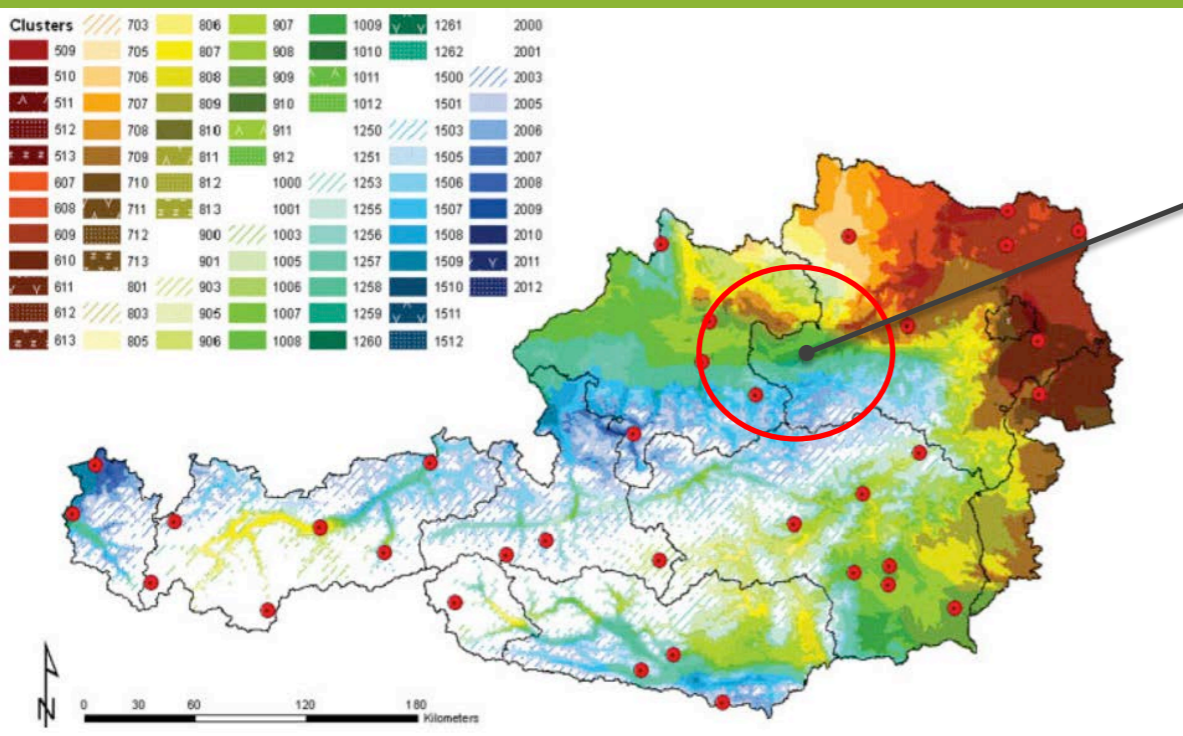
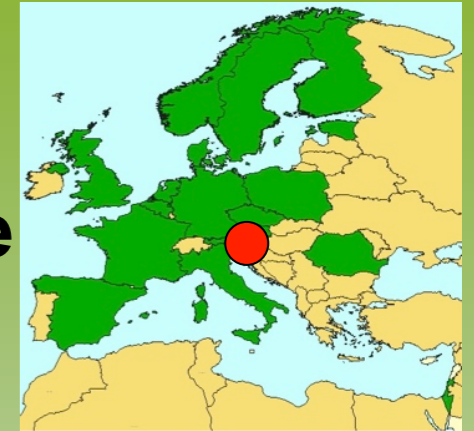
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# outline

- **context of analysis:**
  - **stakeholders.** policy relevance: CC and protein crops
- **research problem:**
  - how large is the yield gap and what can be done
- **data**
- **approaches**
- **findings**
- **discussion and outlook**

# Mostviertel. Austria

Between plains of Danube valley and Alpine region  
Higher temperatures. e.g. +1.6 C on both winter and summer



**Regional capacities for adaptation/mitig. to CC:**

**Cover crops - A-E program**

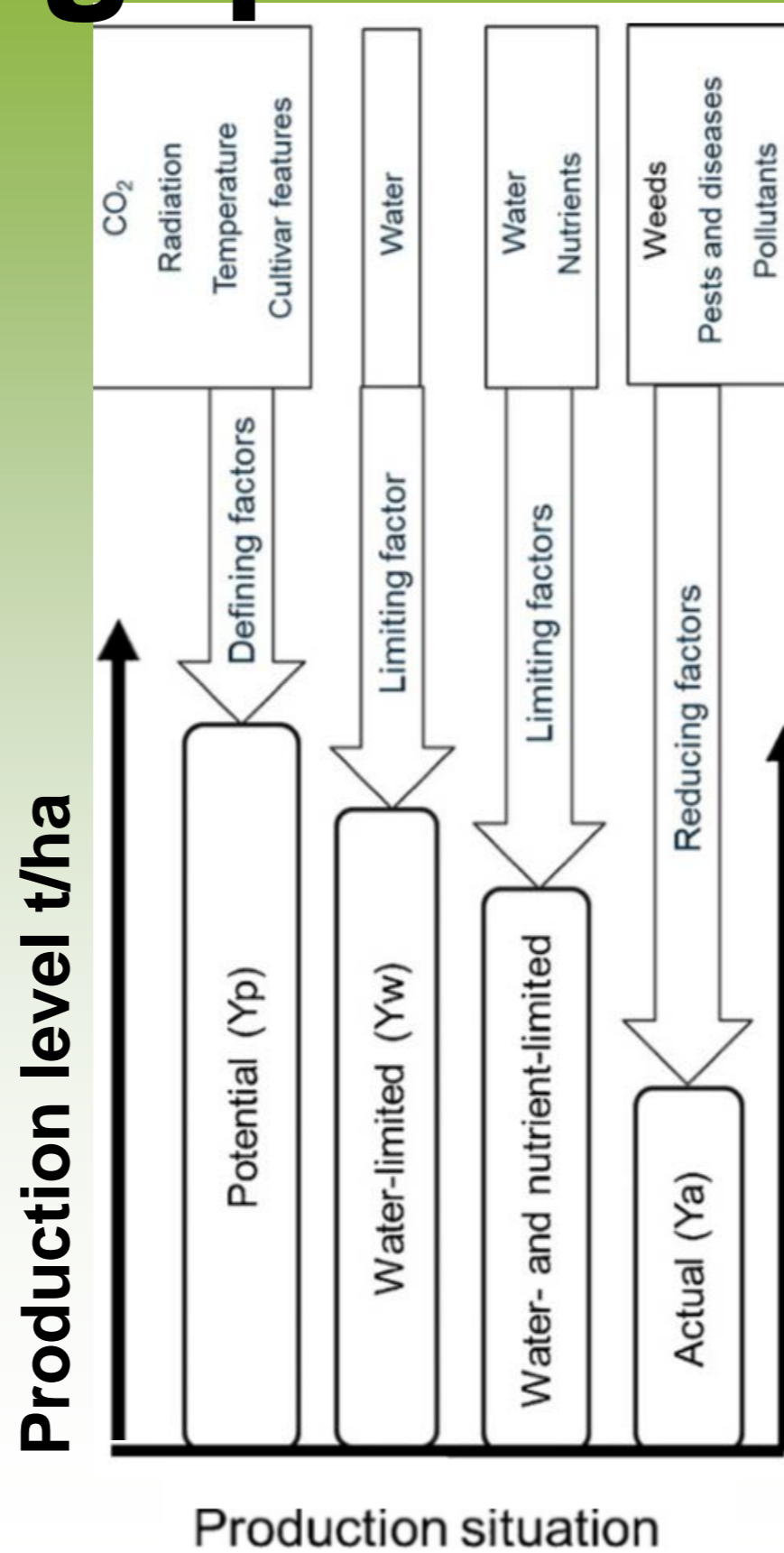
**Reduced tillage and direct seed**

**Awareness of soil organic carbon**

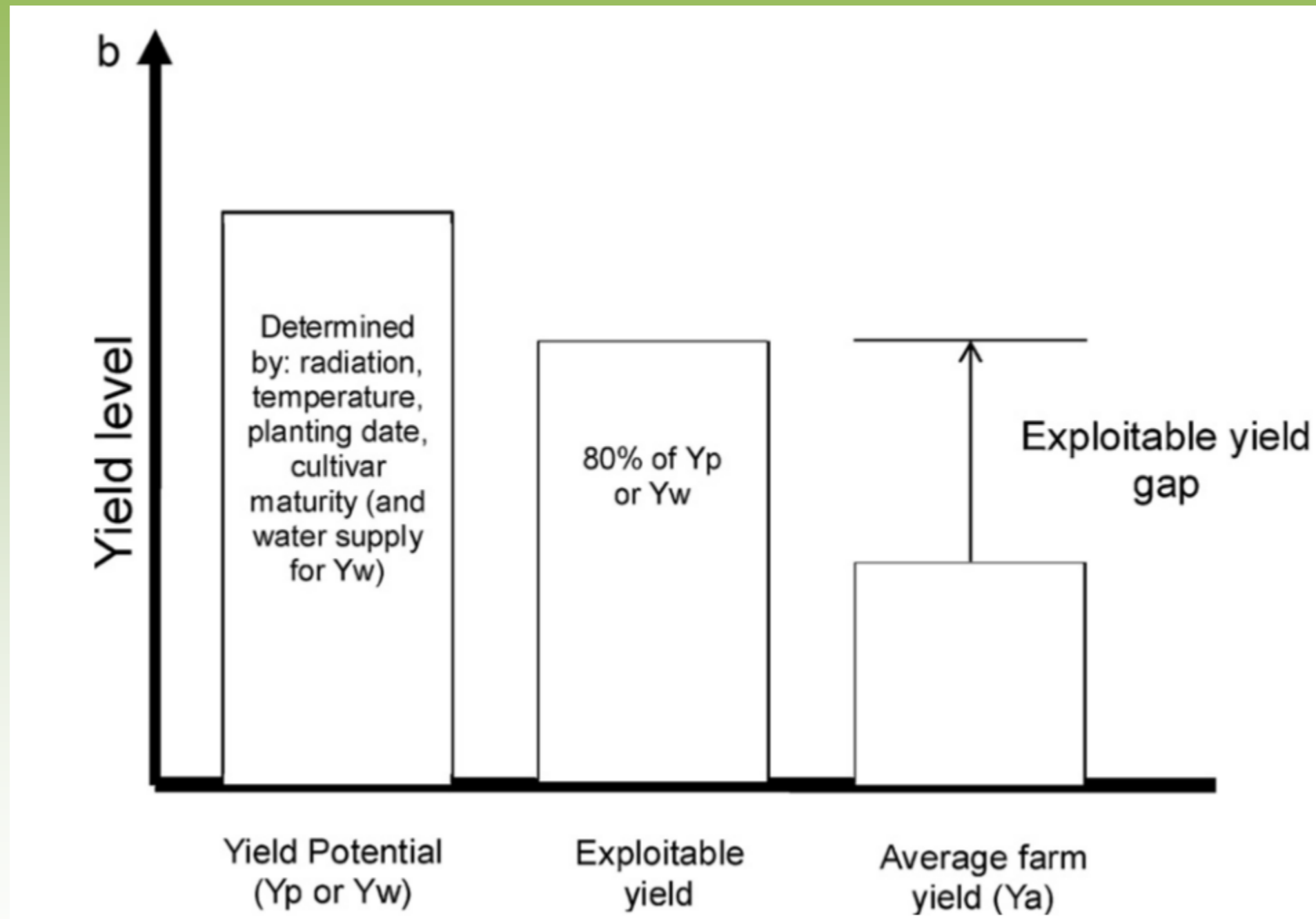
**Alternative crops emerge: soy. sorghum. wine**

**Irrigation. limited to valuable crops**

# yield gap – the concept



# yield gap – the concept



# explanations for yield gap

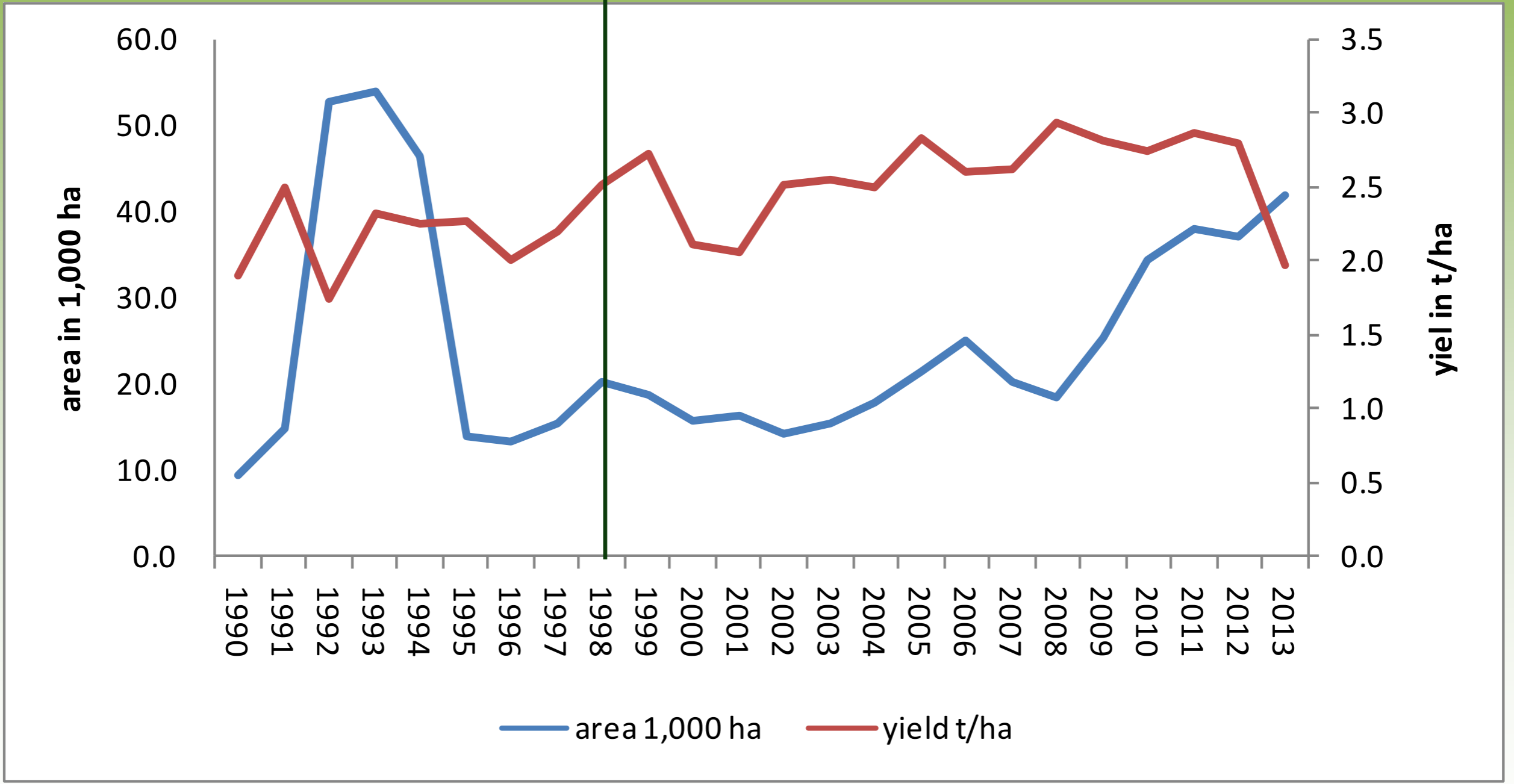
- **field experiments:**
  - better management. soils. equipment. information
  - objective: **maximum yield** of specific crop
- **farmers:**
  - less than optimal management; crop-rotation not single crop
  - objective: **farm income**. if risk averse: non-volatile farm income
- **our objective – exploration of yield gap of soy**
  - levels. distribution. time variance
  - reasons and causes

# **MACSUR / TradeM**

**soy bean production in Austria**



# soy bean production in AT

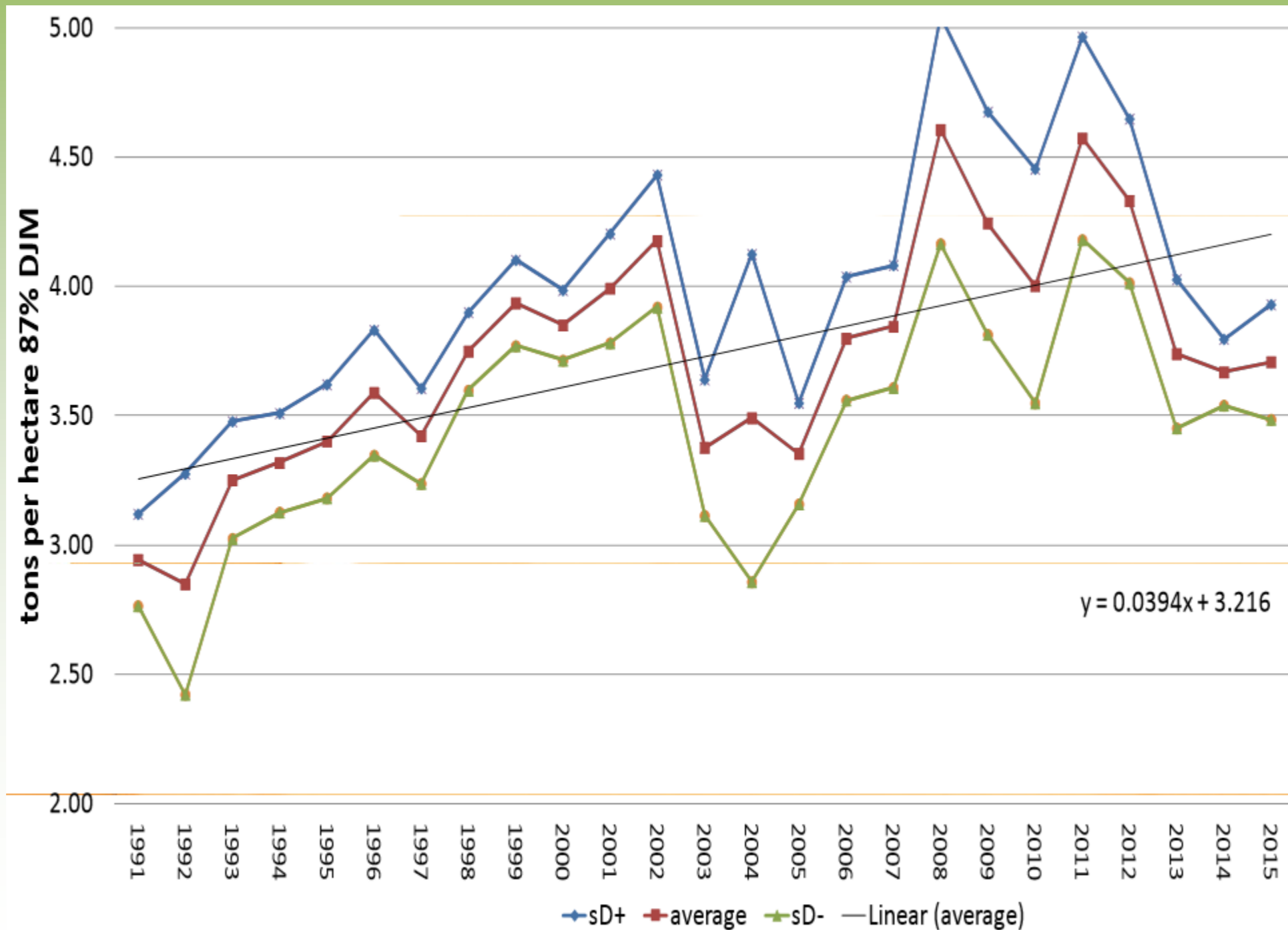




**yield gap soy bean in Austria**

**observations at  
experimental stations**

# observations at experimental stations

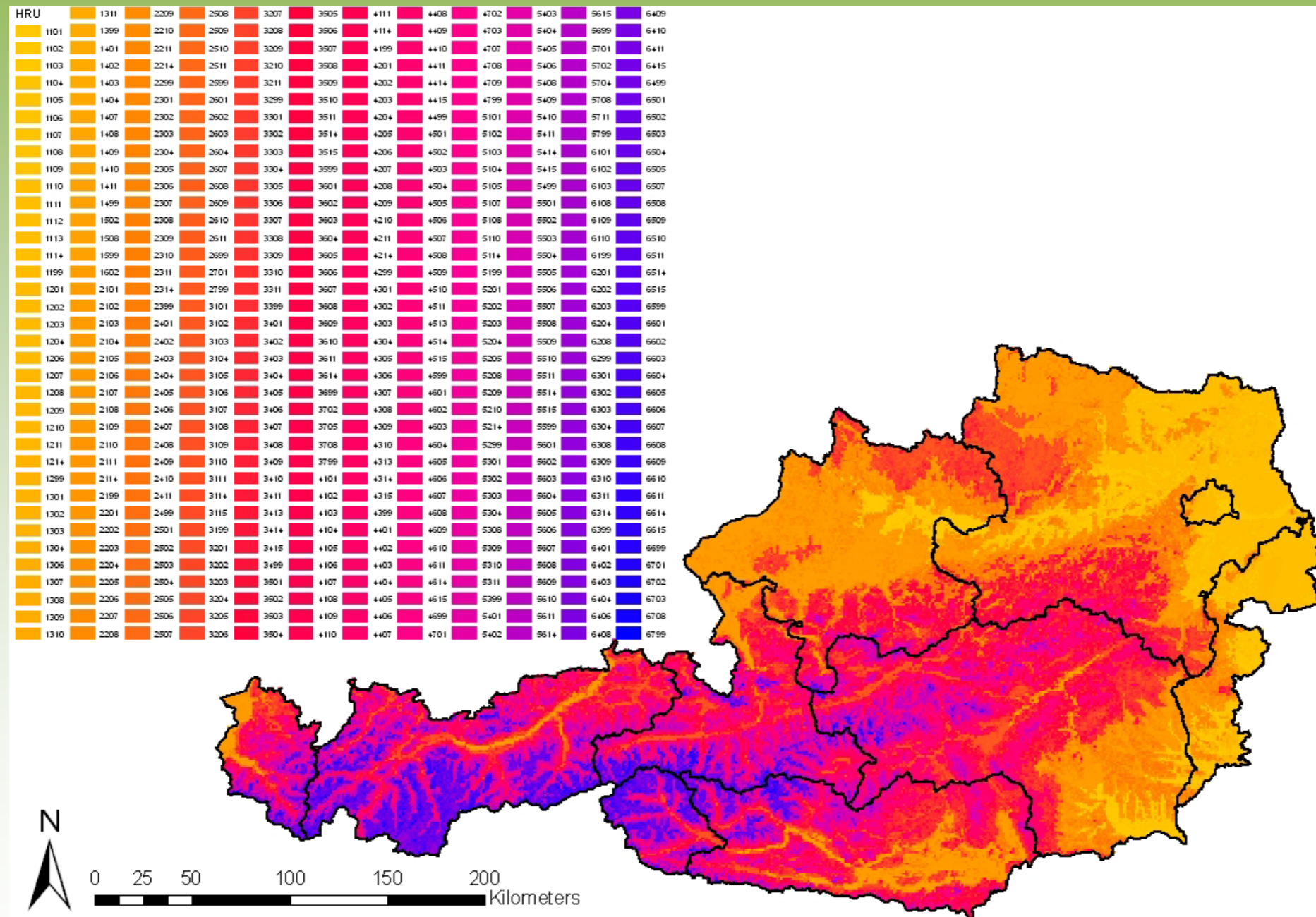


# **yield gap soy bean in Austria**

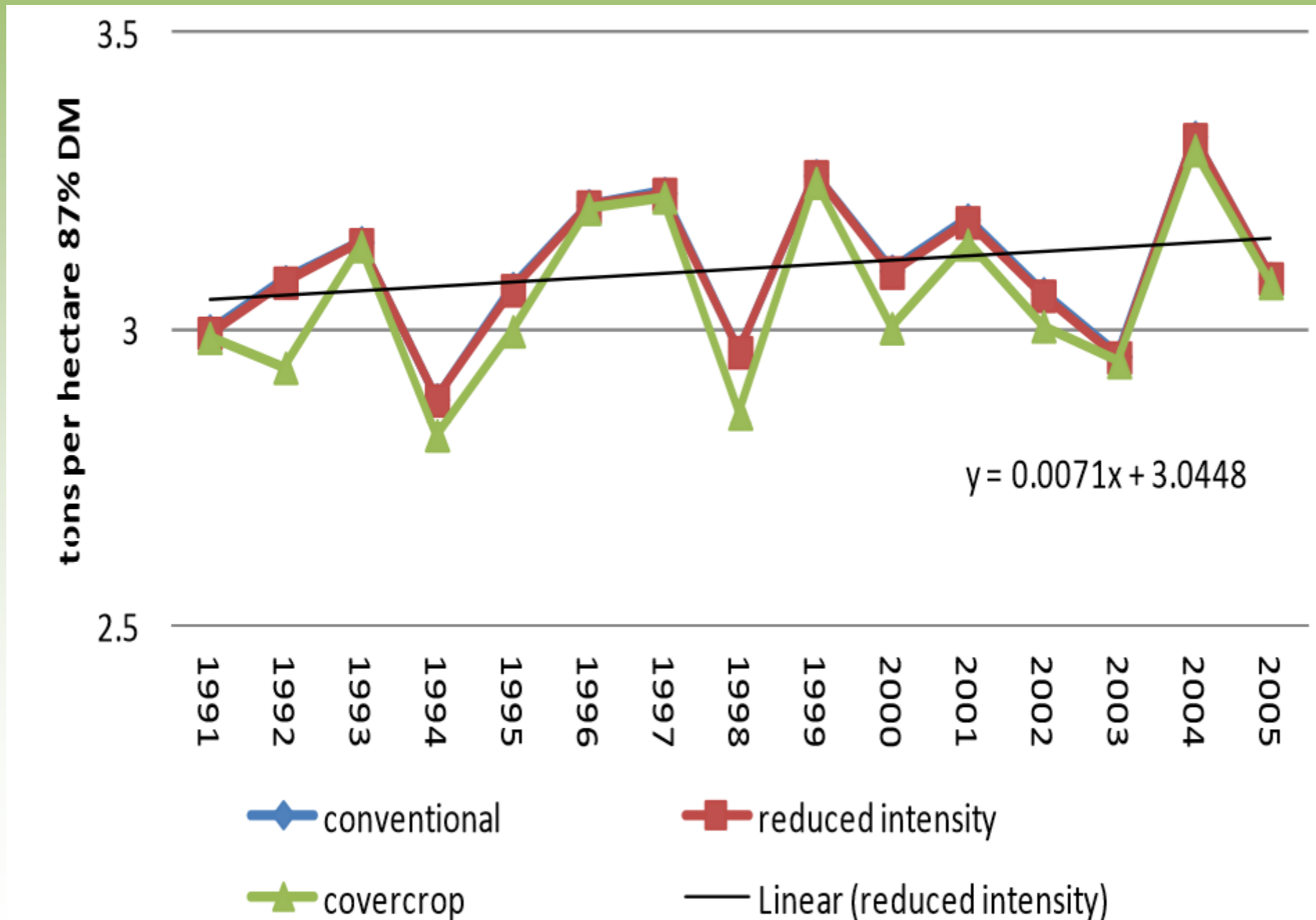
**results from  
crop model (EPIC)**

# spatial heterogeneity

## HRU Homogenous Response Units



# results from a crop model on farm land

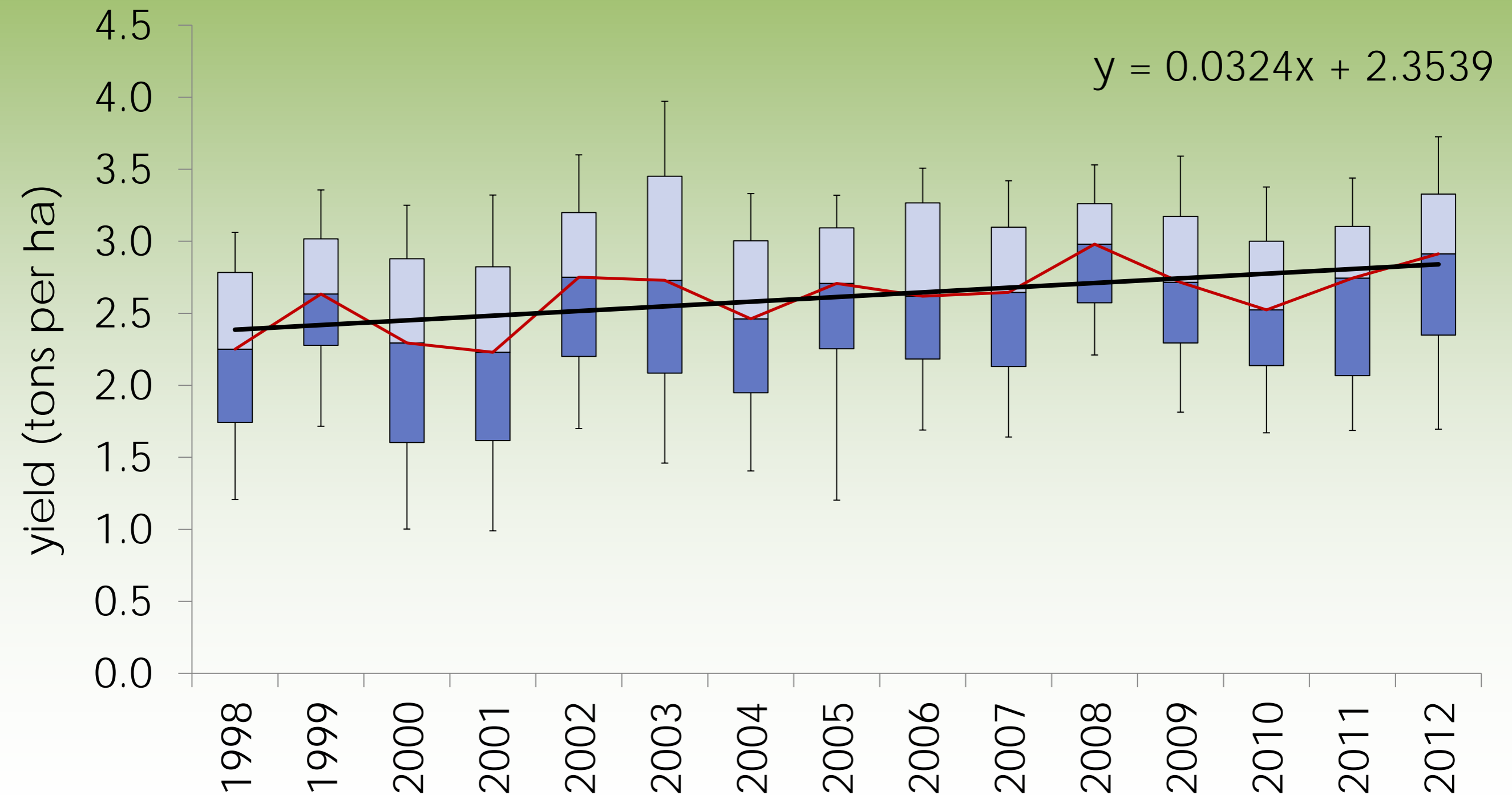


**yield gap soy bean in Austria**

**observations at farm level**

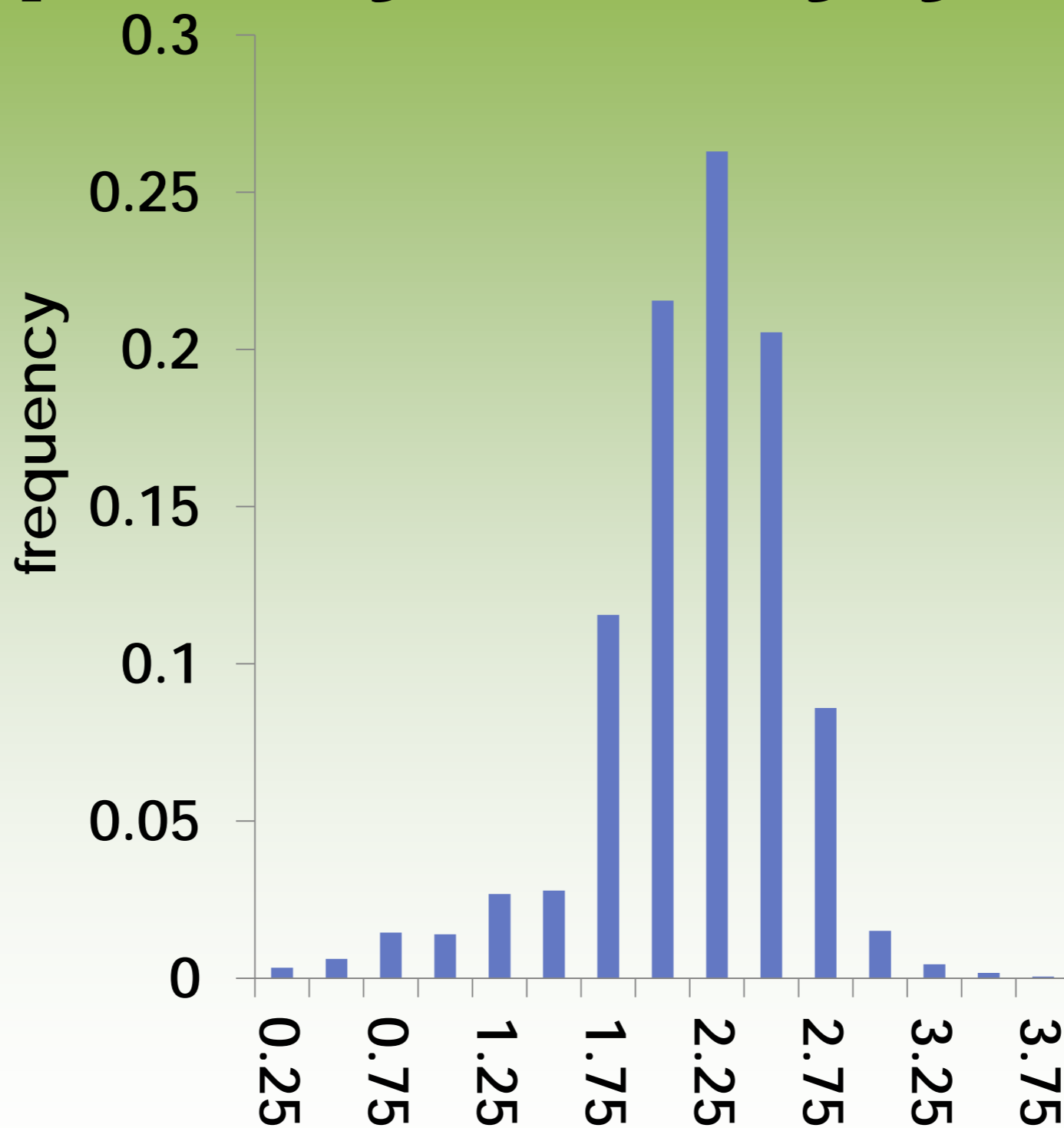
**FADN**

# FADN yield in t per ha





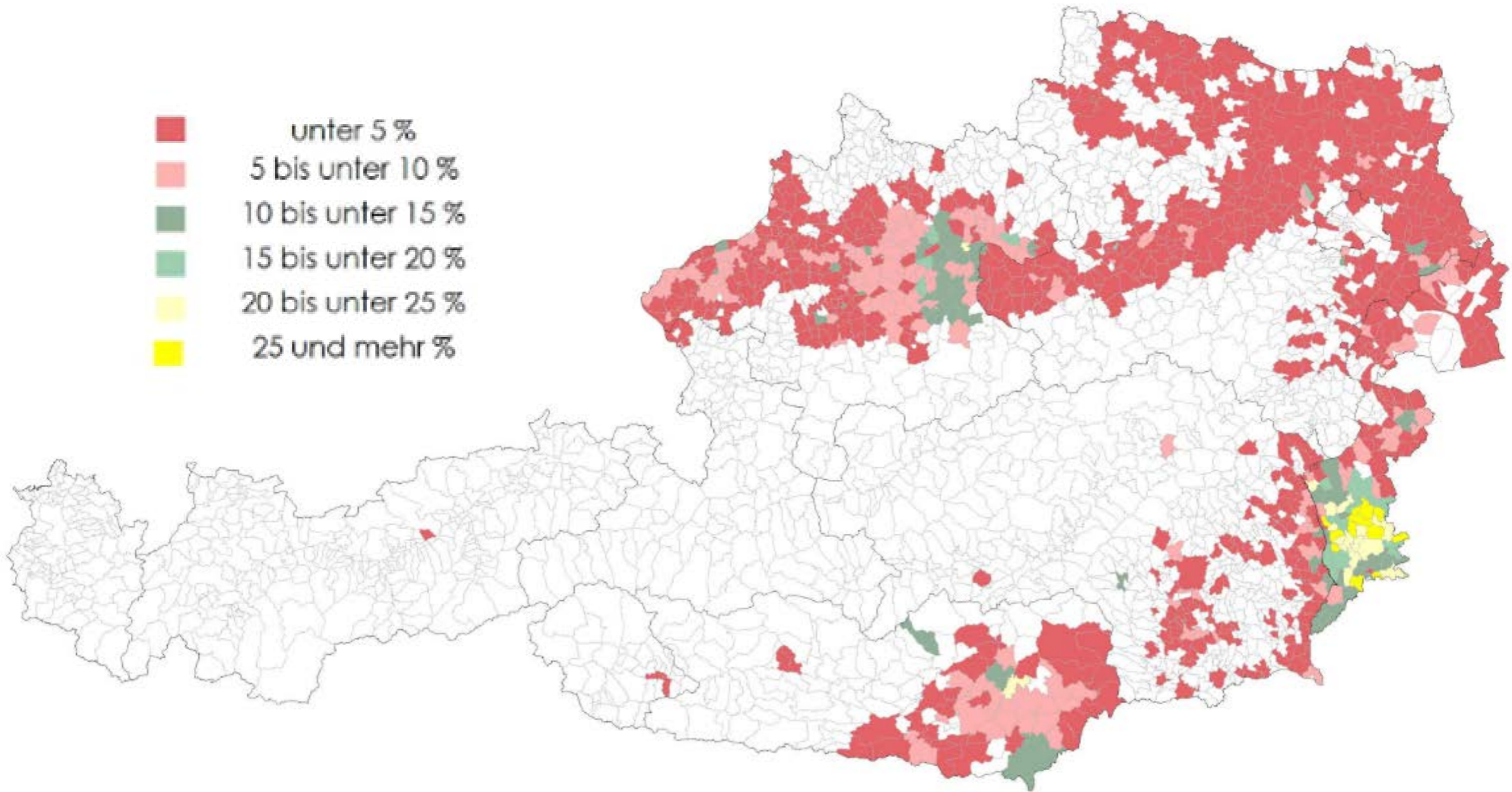
# observations at farm level frequency of soy yields



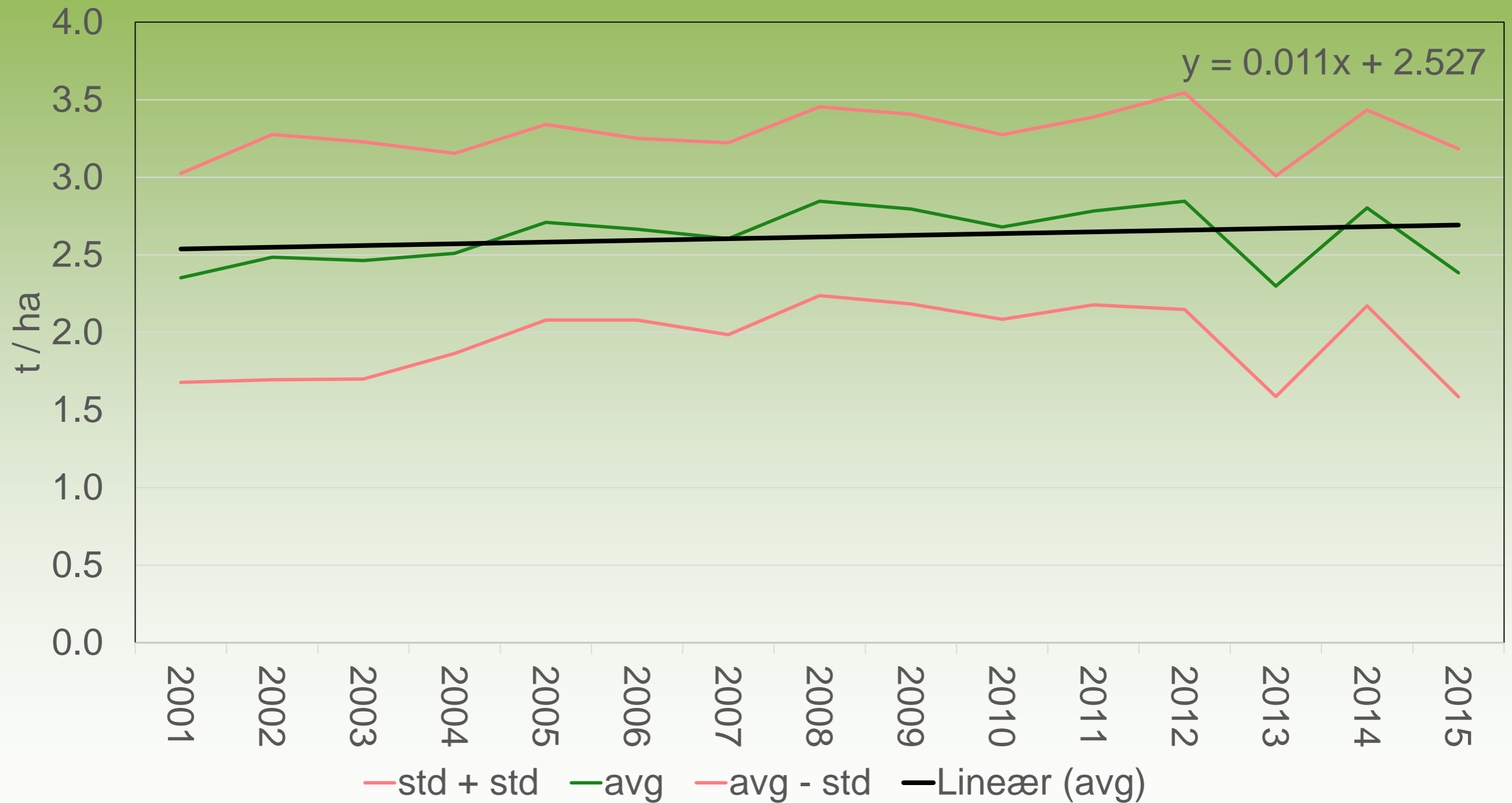
# **yield gap soy bean in Austria**

**observations at  
municipality level**

# regional production of soy 2012



# yield at municipality level



# summary of findings

- **crop model results**

- trend: yield + 7kg/ha partly due to higher temperatures
- yield trend depressed by land expansion
- based on simulations on 1x1 km grids
- soy is part of an observed crop rotation

- **experimental data**

- trend: yield + 40 kg/ha due to genetics and CC
- variance between cultivars is increasing
- at least 5 years until best varieties are adopted on farms

# summary of findings

- **municipality crop statistics**
  - trend: yield + 11 kg/ha likely due to CC and others
  - much lower average yields than model and experiments
  - volatility over time lower than in experiments and model
  - yield trend increase is depressed by land expansion
- **FADN crop yield results**
  - trend: yield + 32 kg/ha
  - yields of best farms match lower bound of experiments
- **yield gap is stochastic**

**yield gap soy bean in Austria**

**what explains the  
yield levels  
in municipalities**



# methodology

- **meteorological effects**
  - unbalanced panel 2001 to 2014, 4891 obs
  - fixed effects: for non-time-varying characteristics
  - linear and non-linear terms with and wo interaction
  - 1x1 km grid: weather (5 variables daily)
- **price effects**
  - country: prices of soy beans and other crops
- **land use shares**
  - municipality: yields. prices. acreage soy and maize

# model results

	Ertrag1		Ertrag2		Ertrag3		Ertrag4	
endogene Variable	Ertrag Soja		Ertrag Soja (in logs)		Ertrag Soja		Ertrag Soja (in logs)	
Variable								
Anteil Fläche_Sojabohnen an gesamter Ackerfläche in Gemeinde (in %)	-0,09534 **		-0,00421 ***		-0,09233 **		-0,00406 ***	
	(0,0377)		(0,0016)		(0,0377)		(0,0016)	
Anteil Fläche_Mais an gesamter Ackerfläche in Gemeinde (in %)	-0,02861		-0,00163 *		-0,02974		-0,00169 **	
	(0,0206)		(0,0009)		(0,0206)		(0,0009)	
Fläche (in ha) Ackerland in Gemeinde	-0,00139		-0,00007		-0,00144		-0,00007	
	(0,0012)		(0,0001)		(0,0012)		(0,0001)	
Zahl der Tage zwischen 10. und 30. Juni mit weniger als 12 Grad Tiefsttemperatur	0,02949		0,00201		0,06439		0,0037 **	
	(0,0410)		(0,0017)		(0,0442)		(0,0019)	
Summe Regen zwischen 1. Juli und 31.08. (Gewichtung: gew_CORINE21)	0,00123 ***		0,00005 ***		0,00119 ***		0,00005 ***	
	(0,0002)		(0,0000)		(0,0002)		(0,0000)	
Summe Regen zwischen 15.09. und 10.10. (Gewichtung: gew_CORINE21)	-0,00224 ***		-0,00009 ***		-0,00196 ***		-0,00008 ***	
	(0,0003)		(0,0000)		(0,0003)		(0,0000)	
Durch_Tx_Juli_gew_CORINE_kl24	-0,76056 **		-0,03288 **		-0,74168 *		-0,03197 **	
	(0,3793)		(0,0159)		(0,3792)		(0,0159)	
Durch_Tx_Juli_gew_CORINE_gr28	-1,15358 ***		-0,05084 ***		-1,30932 ***		-0,05837 ***	
	(0,2665)		(0,0112)		(0,2763)		(0,0116)	
Durch_Tx_August_gew_CORINE_kl24	-0,40802		-0,01951		-0,32917		-0,0157	
	(0,2867)		(0,0120)		(0,2889)		(0,0121)	
Durch_Tx_August_gew_CORINE_gr28	-1,06835 ***		-0,05605 ***		-0,86898 ***		-0,04641 ***	
	(0,2964)		(0,0124)		(0,3107)		(0,0130)	
lnPreise_Sojabohnen_t_1	-7,45078 ***		-0,34025 ***		-6,34294 ***		-0,28665 ***	
	(0,9128)		(0,0382)		(1,0503)		(0,0439)	
lnPreise_Soja_Weltmarkt_Juni	-0,0496		-0,00571		-1,12862		-0,05792	
	(1,5593)		(0,0652)		(1,6389)		(0,0686)	
lnPreise_Soja_Weltmarkt_Juli	2,4417 **		0,09245 **		2,93078 ***		0,11611 ***	
	(1,0197)		(0,0427)		(1,0448)		(0,0437)	
Zeit	0,67612 ***		0,03121 ***		1,31959 ***		0,06234 ***	
	(0,0779)		(0,0033)		(0,3120)		(0,0131)	
Zeit^2					-0,01811 **		-0,00088 **	
					(0,0085)		(0,0004)	
Konstante	43,70832 ***		4,15716 ***		35,23753 ***		3,74734 ***	
	(4,7180)		(0,1974)		(6,1694)		(0,2581)	
N	4891		4891		4891		4891	
r2_o	0,0345		0,03398		0,03533		0,03488	

# summary of findings

- **meteorological effects**

- rain matters: good in June and July bad in late September/October
- soy is sensitive to high temperatures in July and August

- **price effects**

- slight negative effect of soy price t-1
- slight positive effect of soy price in July
- slight negative effect of durum wheat price t-1

- **land use shares**

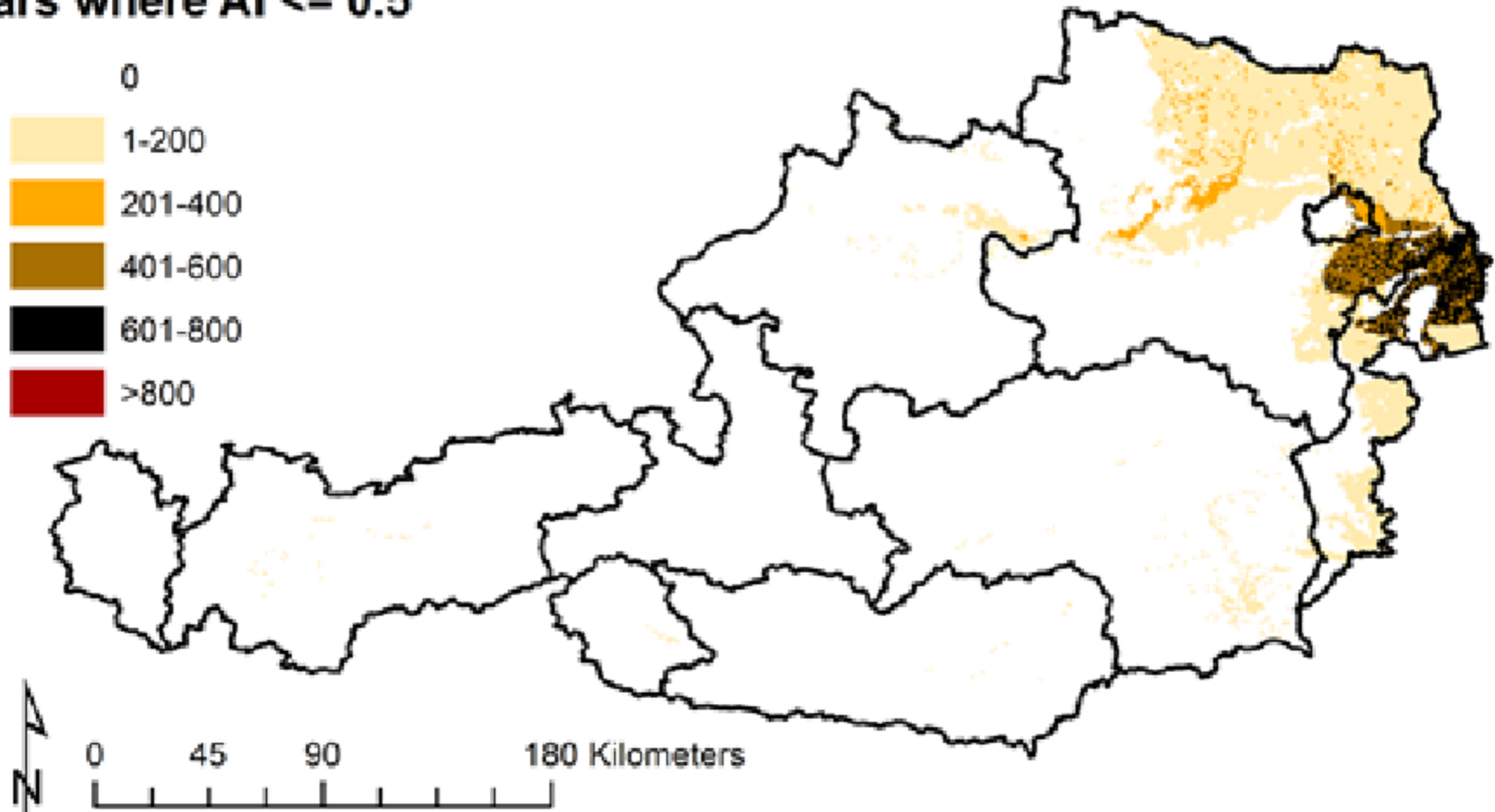
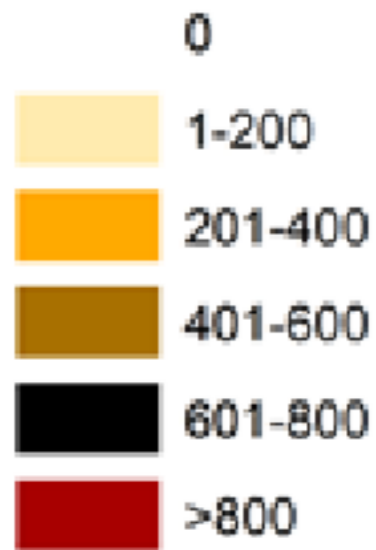
- higher share of land → lower yields

- **time trend positive and strong**

- depending on model: 60 kg / year and more

# drought risk in Austria

# of years where AI  $\leq$  0.5



S0

**yield gap soy bean in Austria**

**efficiency analysis**

**the scope of farm management**

# methodology

- **stochastic frontier analysis**
  - 104 FADN-data with 1082 observations
  - period 1995 to 2011
  - yields on average from 2.0 to 2.5 and up to 4.5 t/ha

# SFA results for soy

	Estimate	Std. Error	z value	Pr(> z )	
(Intercept)	-27.91	5.76	-4.85	0.00	***
log(Mean_Prec_mpss)	0.39	0.13	3.07	0.00	**
log(Mean_Rad_mpss)	1.54	0.36	4.33	0.00	***
log(Mean_Temp_so)	0.51	0.08	6.72	0.00	***
Z_ESU	-0.02	0.00	-3.85	0.00	***
Z_PROTEC	-0.01	0.00	-3.43	0.00	***
sigmaSq	1.00	0.15	6.89	0.00	***
gamma	0.99	0.00	406.32	< 2.22e-16	***



# summary of findings

- **mean efficiency: 0.69**
  - low compared to wheat: 0.80 → scope for management
- **meteorological effects**
  - rain matters
  - temperature matters
  - global radiance matters
- **farm specific effects**
  - farm size matters
  - model without fertilizer because accumulated by plant
  - expenditures for crop protection substances

# discussion

- **yield gap analysis is a daunting task**
- **what can be learned**
  - economics matters: prices of crop and other crops
  - land expansion: more land becoming more marginal
  - management matters a lot but – not **directly** observable in data
  - significant knowledge gaps still there
- **way forward:**
  - look at other crops
  - explore options to improve management

# acknowledgements



This poster has been supported by the research project Climate change in agriculture and forestry: an integrated assessment of mitigation and adaptation measures in Austria (CAFEE) funded by the Austrian Climate Research Programme (ACRP), by FACE MACSUR – Modelling European Agriculture with Climate Change for Food Security, a FACCE JPI knowledge hub and the Federal Ministry of Agriculture, Forestry, Environment and Water Management of Austria