



# Determinants of pesticide use in Swiss crop production

Niklas Möhring, Robert Finger  
[nmoehring@ethz.ch](mailto:nmoehring@ethz.ch)

Agricultural Economics and Policy Group ETHZ  
[www.aecp.ethz.ch](http://www.aecp.ethz.ch)

# Overview

- 1) Introduction
- 2) Methods & Data
- 3) Results & Conclusion

# Introduction

# Background

- On the top of European agricultural policy agenda: NAP's
- Non welfare maximizing pesticide use:
  - due to external effects (on human health and the environment)
- Non profit maximizing pesticide use:
  - maximize physical output instead of yield (Pedersen et al. (2012))
  - Economic risk (Horowitz and Lichtenberg, 1994)
  - Individual farm effect explains big share of observed variability (Bürger et al. (2012))

→ Which are the determinants of this variability between farms?

# Motivation: literature review determinants of pesticide use

- **Socio-economic determinants:** age, education, farm size, wealth  
(Dasgupta et al. (2001), Rahman (2003), Galt (2008))
- **Agronomic determinants:** crop management, climate, soil  
(Bürger et al. (2012), Andert et al., 2015)
- **Limitations:** cross-sections, single pesticide indicator, no crop differentiation

Improve understanding by:

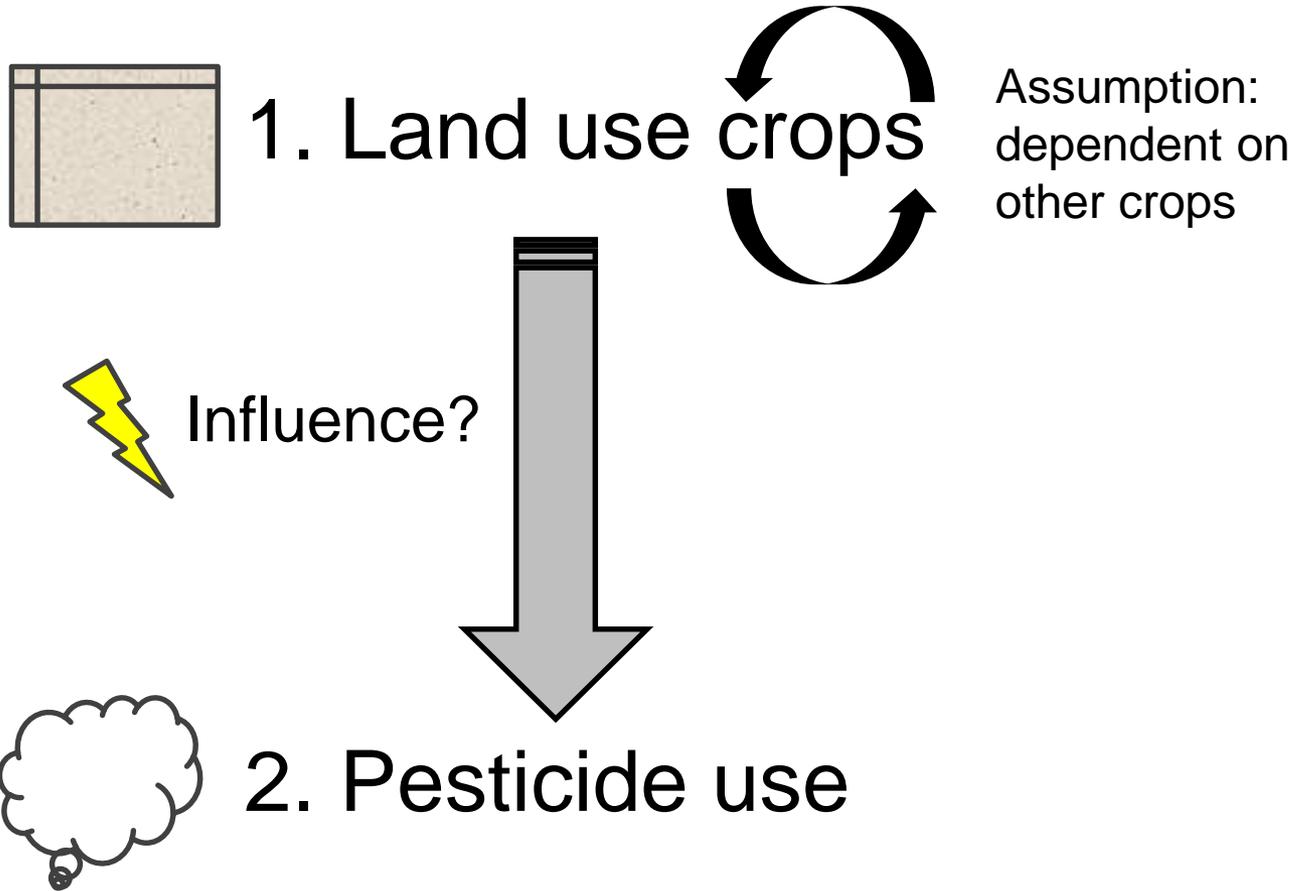
- Integrating agronomic and socio-economic perspective
- Crop choice: different determinants per crop
- Indicator choice: amounts, concentration, toxicity, type of product
- Use of highly detailed and high frequency panel data

# Research Questions

- Which are socio-economic/agronomic determinants of Swiss pesticide use?
- Do determinants differ with respect to crops and/or indicators of pesticide use?

# Methods & Data

# Proposed decision making process



# Overview data / Choice of variables I

## ZA-AUI/BH Data 2009-2013

- Detailed field journal (real observations!) + Bookkeeping data
- Considered crops here: Winter wheat (Extenso), Maize, Potatoes
- Aggregation level: crop per farm
- Balanced panel: 108 farmers, representative for Swiss crop farm

Dependent variables	Indication	Calculation
Active ingredient /ha	Amount (in kg/l) used	
Load Index /ha	Potential environmental and health risk and intensity used	
Average dosage used	Intensity of pesticide use	$Mean \left( \frac{AI \text{ per ha}}{\text{Standard dosage}} \right)$

**Load Index:**

$$\sum_{\text{Anwendungen Schlag}} \frac{\text{Load} * \text{SprA kg}}{\text{Standard Dosis}}$$

(Median Landwirt und Kultur)

**Zusammensetzung Load:**  
 Load = Health Load + Fate Load + Tox Load

SprA: «Sprayed Amount» denotes the amount of one product used in a single operation.

# Overview data / Choice of variables II

Explanatory variables (determinants)  
and their expected relation to pesticide indicators

## Farm characteristics

- Zone\* (valley to mountaneous) [+ -]
- Altitude\* [+]
- Work force [+ -]
- Farm type: share animals [+]
- Farm type: share off-farm work [+]

## Farmers characteristics

- Age [+]
- Education [-]

## Others

- Pesticide Price Indicator [-]

+/- denote expected pos./neg. relation  
\*cannot be determined simultaneously

# Methodology

## 1. Test: influence of land use on pesticide use decision

- two simple indicators for selection bias (Verbeek and Nijman, 1992) as well as adjusted Hausman test
- reject influence land use → pesticide use (example age...)
- except for intensive winterwheat (ambiguous result: requires different methodology)

## 2. Regress $Pesticide\ use_{crop,i,t} \sim Determinants_{i,t}$

- Aggregation level: farm and crop
- Random effects panel estimator: exploit heterogeneity over time and between individuals
- FGLS estimator: account for heteroscedasticity and clustering in data

# Results & Conclusion

## Results Winter wheat (extensive)

	AI/ha	Load Index	Dosage
Zone		++	
Altitude	++	++	
Work force			
Share animals			
Share off-farm work	++		
Age			
Education	-	-	
PP Indicator			--

- Clear influence of geographical location (weather?)
- Share off-farm work has a strong influence on AI used
- Education and Pesticide Price seem to influence intensity of use

+/- indicate pos./neg. relations

+/++/+++ indicate significance at levels of 10% / 5% / 1%

## Results Potatoes

	AI/ha	Load Index	Dosage
Zone	- -		
Altitude			
Work force			
Share animals			+++
Share off-farm work			
Age			
Education			
PP Indicator			

- Few determinants: small sample or standardized treatment?
- Farmers specialized on crop farming seem to dose lower

+/- indicate pos./neg. relations

+/+ / +++/+++ indicate significance at levels of 10% / 5% / 1%

## Results Maize

	AI/ha	Load Index	Dosage
Zone	+++		
Altitude		-	
Work force			
Share animals		+	
Share off-farm work	++		+++
Age			
Education		- - -	- - -
PP Indicator			

- Ambiguous influence of location: difference weather and farming methods?
- Clear effect of specialization on crop farming
- Clear effect of education

**Different crops → different determinants**

+/- indicate pos./neg. relations

+ / ++ / +++ indicate significance at levels of 10% / 5% / 1%

## Summary results by indicator

	AI/ha	Load Index	Dosage
Zone	+ -		
Altitude	+	+	
Work force			
Share animals		+	+
Share off-farm work	+	+	+
Age			
Education	-	-	-
PP Indicator			-

+/- indicate pos./neg. relations

### Different Indicators → different determinants

- Direction of relations are as expected
- Education key determinant of pesticide use
- Dosage and potential risk influenced by specialization on crops and diversification (off-farm)

## Conclusion/Outlook

- Determinants differ for crops / Indicators of pesticide use
- Pesticide policies should account for this heterogeneity: crop specific education programs, tailored taxes, geographically explicit subsidies
- Identified determinants for pesticide use in Swiss crops: Zone, Altitude, Education, Diversification (off-farm), Farm type, (Pesticide prices)
- A further detailed analysis (on plot level) is needed
  - Integration of agronomic variables, economic risk, weather and selection bias in further research
  - Extending considered cultures to fruits: highly relevant

Thank you for your  
attention!

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<http://agrarpolitik-blog.com>



# Literature

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