



## A choice experiment to assess dairy farmers' preferences for pesticide reduction : does work matter?

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# Plan

## Introduction

1- Litterature review

2- Method

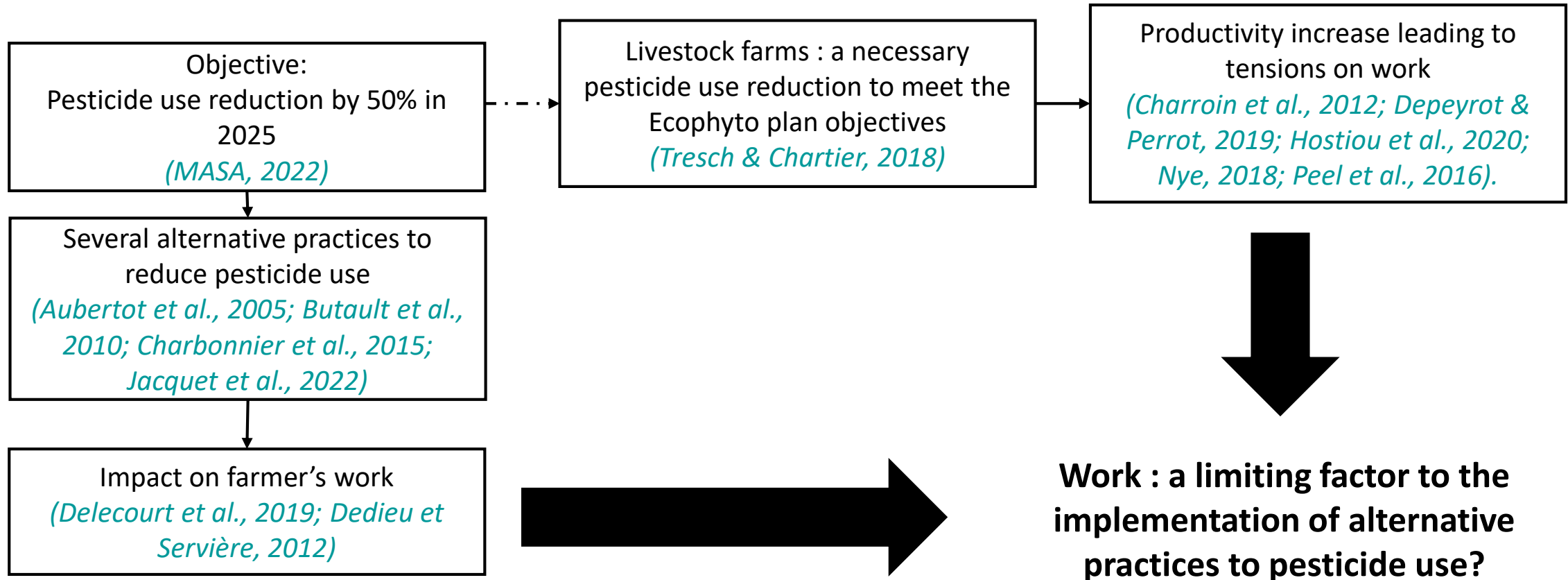
3- Data

4- Results

## Conclusion

# Introduction

# Introduction



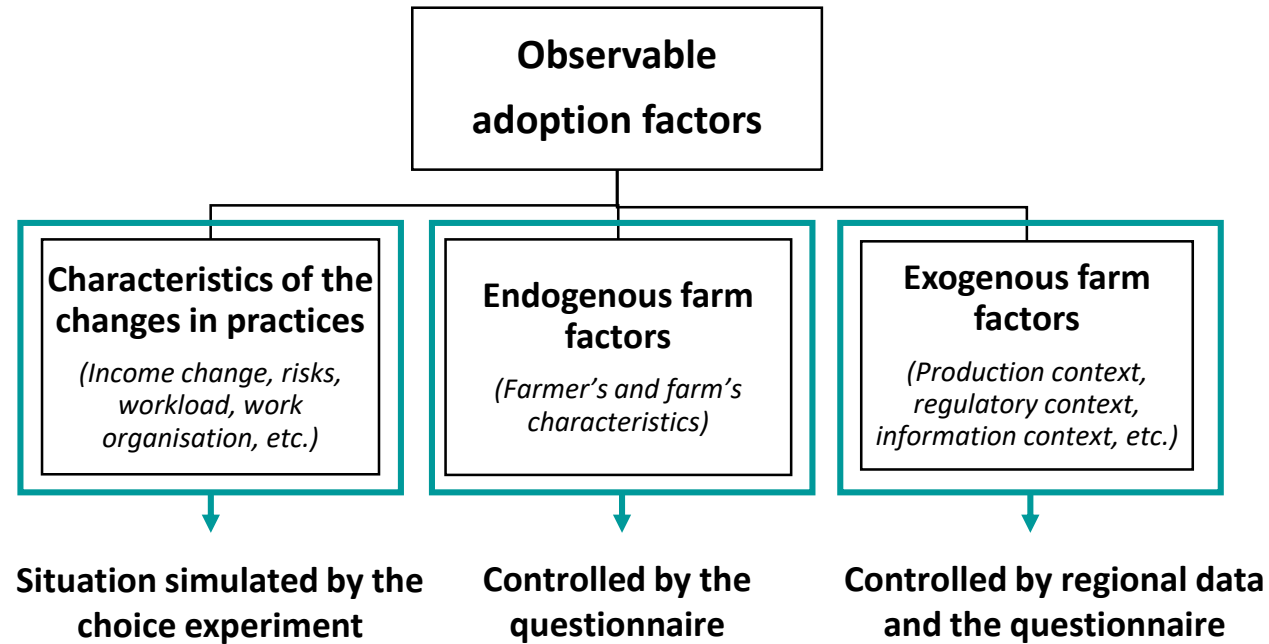
# Introduction

## Work dimensions

- ➔ Work organization
- ➔ Skills and knowledge
- ➔ Mental workload

# Introduction

- To assess farmer's preferences towards pesticide reduction
- Role(s) played by « classical » determinants (profit, risks) ?
    - Role(s) played by work dimensions ?



# 1- Literature review

# 1 – Littérature review

## □ 15 papers selected and analysed

Studied attributes	Developed in literature	Implemented in our case
<b>Reduction in pesticide use</b>	<ul style="list-style-type: none"> <li>• Percentage reduction in pesticide use (3/15)</li> <li>• Number of treatments (2/15)</li> <li>• Authorisation/authorisation under certain conditions/ban (4/15)</li> <li>• Specific alternative practices to pesticides (2/15)</li> <li>• Impact of pesticides on health (3/15)</li> </ul>	<b>Percentage reduction in pesticide use</b>
<b>Monetary attribute</b>	<ul style="list-style-type: none"> <li>• Subsidy or tax proposal (6/15)</li> <li>• Variation in the output or input price (6/15)</li> <li>• Change in income/profit/gross margin (3/15)</li> </ul>	<b>Change in Gross Operating Surplus</b>
<b>Work dimensions</b>	<ul style="list-style-type: none"> <li>• Skills and knowledge (6/15)</li> <li>• Work organisation (3/15)</li> <li>• Mental workload (0/15)</li> </ul>	<b>One attribute for each of the three work dimensions</b>

(Bjørnåvold et al., 2022; Blazy et al., 2011; Chèze et al., 2020; Christensen et al., 2011; Danne et al., 2019; Enthoven & Van den Broeck, 2021; Jaeck & Lifran, 2014; Kuhfuss et al., 2016; Lapierre et al., 2023; Praneetvatakul et al., 2022; Ridier et al., 2021; Sanou et al., 2019; Van den Broeck et al., 2017; Vidogbéna et al., 2015; Zhu et al., 2022)





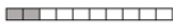
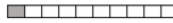








## 2- Method

## 2 – Method

Attributes	Levels	Expected effect on farmer's utility
<b>1.Reduction in pesticide use on the farm</b>	10% 30% 50% 70%	?
<b>2.Change in Gross Operating Surplus on the farm</b>	0€/1000l -30€/1000l +30€/1000l +60€/1000l	+
<b>3.Risk of yield loss</b>	0 year out of 10 1 year out of 10 2 years out of 10	—
<b>4.Number of work peaks in the year</b>	No change	Ref.
	Decrease in the number of work peaks	+
	Increase in the number of peaks with delegation or salaried employment	—
	Increase in the number of peaks without delegation or salaried employment	—
<b>5.Knowledge/skills</b>	Self-training	Ref.
	Individual specialized advice	?
	Collective learning in groups of farmers	?
<b>6.Mental workload</b>	No change	Ref.
	Less mental workload	+
	More mental workload	—

## 2 – Method

Characteristics	Situation 1	Situation 2	Situation 3
1.Reduction in pesticide use on the farm	50% 	30% 	Neither of these two situations
2.Change in Gross Operating Surplus on the farm	+0 €/1000l 	+60 €/1000l 	
3.Risk of yield loss	2 years out of 10 	1 year out of 10 	
4.Number of work peaks in the year	No change 	Increase in the number of peaks without delegation or salaried employment 	
5.Knowledge/skills	Group coaching 	Self-training 	
6.Mental workload	No change 	Less mental workload 	

## 2 – Method

Questionnaire testing phase (N=10) - *December 2022*

Investigation phase – *January 2023 / August 2023*

### A 5-part questionnaire

1. General characteristics of the farm
2. Crop protection practices
3. Work on the farm
4. Discrete Choice Experiment
5. The respondent's projections, perceptions and attitudes



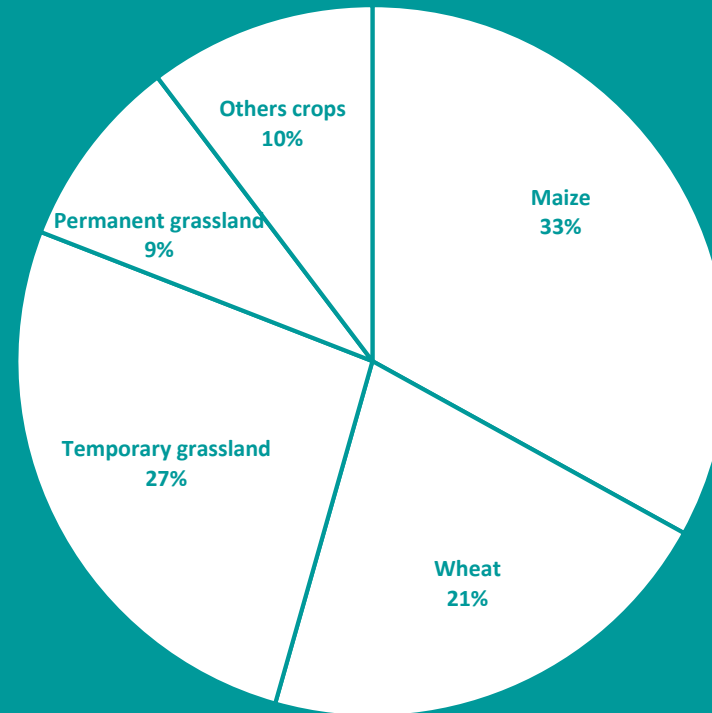
## 3- Data

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On average for our sample (N=94) :

- 125 ha of UAA
- 97 dairy cows
- 9 016 L per dairy cows per year

SHARE OF EACH CULTIVATED CROPS  
(AVERAGE PERCENTAGE OF TOTAL UAA)



## 4- Results

## 4 – Results

$$U_{ijt} = CSA_{sq} + \alpha_i \cdot PP_{jt} + \beta \cdot \Delta GOS_{jt} + \gamma_i \cdot Risk_{jt} + \delta_{1i} \cdot Peaks1_{jt} + \delta_{2i} \cdot Peaks2_{jt} + \delta_{3i} \cdot Peaks3_{jt} + \eta_{1i} \cdot KS1_{jt} + \eta_{2i} \cdot KS2_{jt} + \mu_{1i} \cdot M1_{jt} + \mu_{2i} \cdot M2_{jt} + \varepsilon_{ijt}$$

$t$  : Set  
 $j$  : Alternative  
 $i$  : Farmer

$CSA_{sq}$  : Status quo alternative

$PP$  : **1.Reduction in pesticide use on the farm**

$\Delta GOS$  : **2.Change in Gross Operating Surplus on the farm**

$Risk$  : **3.Risk of yield loss**

### 4.Number of work peaks in the year

$Peaks1$  : Decrease in the number of work peaks

$Peaks2$  : Increase in the number of peaks with delegation or salaried employment

$Peaks3$  : Increase in the number of peaks without delegation or salaried employment

### 5.Knowledge/skills

$KS1$  : Individual specialized advice

$KS2$  : Collective learning in groups of farmers

### 6.Mental workload

$M1$  : Less mental workload

$M2$  : More mental workload



## 4 – Results

Variables	Mixed logit model	
	Mean	SD
CSA statu quo	<b>-2,772 ***</b> (0,649)	-
Reduction in pesticide use on the farm	-0,004 (0.008)	<b>0,0445 **</b> (0 .014)
Change in Gross Operating Surplus on the farm	<b>0,051 ***</b> (0,013)	-
Risk of yield loss	<b>-0,519 **</b> (0,197)	<b>0,925 **</b> (0,355)
Decrease in the number of work peaks	0,061 (0,425)	<b>-1,639 **</b> (0,591)
No change	Ref.	Ref.
Increase in the number of peaks with delegation or salaried employment	-0,612 (0,408)	<b>1,997 ***</b> (0,59)
Increase in the number of peaks without delegation or salaried employment	<b>-2,208 **</b> (0,718)	<b>-1,497 *</b> (0,641)
Self-training	Ref.	Ref.
Individual specialized advice	<b>0,784 +</b> (0,458)	1,113 (0,742)
Collective learning in groups of farmers	<b>0,689 +</b> (0,371)	<b>-1,287 **</b> (0,426)
Less mental workload	0,286 (0,312)	-0,751 (0.565)
No change	Ref.	Ref.
More mental workload	<b>-2,197 **</b> (0,690)	<b>-1,624 **</b> (0,585)
Log-Likelihood		-409,17
Ajusted R <sup>2</sup>		0,22
AIC		858,35
Nb. Of observations		1692

Significance levels: \*\*\* robust p-value <0,001, \*\* robust p-value <0,01, \* robust p-value <0,05, + robust p-value<0,1

Robust standard errors in parentheses

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## 4 – Results

Variables	Latent class model		
	Class 1	Class 2	Class 3
N	21	53	20
CSA statu quo	-1,456 + (0,746)	-2,778 *** (0,539)	-7,239 (4,468)
Reduction in pesticide use on the farm	-0,014 (0,009)	<b>0,012 + (0,006)</b>	<b>-0,131 * (0,061)</b>
Change in Gross Operating Surplus on the farm	<b>0,042 *** (0,007)</b>	<b>0,029 *** (0,005)</b>	<b>0,181 * (0,080)</b>
Risk of yield loss	<b>-1,050 *** (0,291)</b>	<b>-0,378 * (0,158)</b>	0,466 (0,808)
Decrease in the number of work peaks	0,138 (0,619)	-0,473 (0,384)	<b>4,260 + (2,250)</b>
No change	Ref	Ref	Ref
Increase in the number of peaks with delegation or salaried employment	-0,179 (0,790)	<b>-0,619 + (0,353)</b>	<b>-3,826 ** (1,457)</b>
Increase in the number of peaks without delegation or salaried employment	<b>-2,047 * (0,841)</b>	<b>-1,155 ** (0,375)</b>	<b>-7,147 * (3,481)</b>
Self-training	Ref.	Ref.	Ref.
Individual specialized advice	<b>-1,281 ** (0,497)</b>	0,272 (0,273)	<b>10,403 ** (3,738)</b>
Collective learning in groups of farmers	-0,624 (0,459)	0,074 (0,218)	<b>9,505 * (4,300)</b>
Less mental workload	0,498 (0,406)	-0,185 (0,230)	<b>4,317 *** (1,091)</b>
No change	Ref.	Ref.	Ref.
More mental workload	<b>-1,757 * (0,689)</b>	<b>-0,738 ** (0,246)</b>	<b>-14,197 + (7,426)</b>
Delta	0,125 (0,390)	<b>0,935 * (0,393)</b>	0 NA (NA)
Log-Likelihood		-392,76	
Ajusted R <sup>2</sup>		0,22	
AIC		855,51	
Nb. Of observations		1692	

Significance levels: \*\*\* robust p-value <0.001, \*\* robust p-value <0.01, \* robust p-value <0.05, + robust p-value <0,1

Robust standard errors in parentheses.

## 4 – Results

Variables	Latent class model	
	Class 1	
N	21	
CSA statu quo	<b>-1,456 +</b> (0,746)	
Reduction in pesticide use on the farm	-0,014 (0,009)	
Change in Gross Operating Surplus on the farm	<b>0,042 ***</b> (0,007)	
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Robust standard errors in parentheses.

Class 1	
<ul style="list-style-type: none"> <li>• More dairy cows per hectare</li> <li>• More maize in the crop rotation</li> <li>• More people declare to use insecticide on maize</li> <li>• Less sensitive to environmental issues</li> </ul>	Than class 2 and class 3



More intensive farms per hectare, with no preference for reducing pesticide use

## 4 – Results

Variables	Latent class model	
	Class 2	
N	53	
CSA statu quo	<b>-2,778 ***</b> (0,539)	
Reduction in pesticide use on the farm	<b>0,012 +</b> (0,006)	
Change in Gross Operating Surplus on the farm	<b>0,029 ***</b> (0,005)	
Risk of yield loss	<b>-0,378 *</b> (0,158)	
Decrease in the number of work peaks	-0,473 (0,384)	
No change	Ref	
Increase in the number of peaks with delegation or salaried employment	<b>-0,619 +</b> (0,353)	
Increase in the number of peaks without delegation or salaried employment	<b>-1,155 **</b> (0,375)	
Self-training	Ref.	
Individual specialized advice	0,272 (0,273)	
Collective learning in groups of farmers	0,074 (0,218)	
Less mental workload	-0,185 (0,230)	
No change	Ref.	
More mental workload	<b>-0,738 **</b> (0,246)	
Delta	<b>0,935 *</b> (0,393)	

Significance levels: \*\*\* robust p-value <0.001, \*\* robust p-value <0.01, \* robust p-value <0.05, + robust p-value <0,1

Robust standard errors in parentheses.

Class 2	
<ul style="list-style-type: none"> <li>Larger UAA</li> <li>More people declare to use herbicide on temporary grassland</li> </ul>	Than class 3
<ul style="list-style-type: none"> <li>55% of farmers take part in groups "30,000".</li> </ul>	
<ul style="list-style-type: none"> <li>Perceive a reduction of more than 30% in pesticides as less risky</li> </ul>	Than class 1



Farms volunteering to reduce their pesticide use

## 4 – Results

Variables	Latent class model
	Class 3
N	20
CSA statu quo	-7,239 (4,468)
Reduction in pesticide use on the farm	<b>-0,131 * (0,061)</b>
Change in Gross Operating Surplus on the farm	<b>0,181 * (0,080)</b>
Risk of yield loss	0,466 (0,808)
Decrease in the number of work peaks	<b>4,260 + (2,250)</b>
No change	Ref
Increase in the number of peaks with delegation or salaried employment	<b>-3,826 ** (1,457)</b>
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Less mental workload	<b>4,317 *** (1,091)</b>
No change	Ref.
More mental workload	<b>-14,197 + (7,426)</b>
Delta	0 NA (NA)

Significance levels: \*\*\* robust p-value <0.001, \*\* robust p-value <0.01, \* robust p-value <0.05, + robust p-value <0,1

Robust standard errors in parentheses.

Class 3	
<ul style="list-style-type: none"> <li>• Less labelling</li> <li>• Lower wheat yields</li> </ul>	Than class 1 and class 2
<ul style="list-style-type: none"> <li>• Calls for more delegation if pesticides need to be reduced further</li> <li>• More alternative practices implemented</li> <li>• Difference in type of structure: more EARLs for class 3 and more GAECs for class 1</li> </ul>	Than class 1



Farms that have already reduced their pesticide use and are finding it difficult to continue

# Conclusion

# Conclusion

- ❑ **The three work dimensions have an effect on the preferences of the farmers surveyed, but differently depending of their characteristics.**
- ❑ **2 levels to highlight :**
  - ✓ « Increase in the number of peaks without delegation or salaried employment »
  - ✓ « More mental workload »

**A need for public policies to take action**

- ❑ **Limits of our work**
- ❑ **Further work**



# Thank you !

Any questions ?

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