

1 **Natural insurance as condition for market insurance: Climate** 2 **change adaptation in agriculture**

3 4 **Abstract**

5 This paper focuses on the potential use of insurance as a climate change adaptation mechanism
6 in agriculture. We analyse the attractiveness of a climate risk insurance scheme and the choices
7 farmers face between adaptation via farm management practices and purchase of crop
8 insurance in the market. A choice experiment is used to reveal Danish farmers' preferences
9 regarding an insurance contract where adoption of land management practices to improve soil
10 sustainability is conditional for obtaining insurance cover in the market. Results indicate that
11 in general arable farmers and farmers with low soil quality who have experienced crop damages
12 in the past are more likely to purchase such conditional insurance. Farmers with good quality
13 soils, who perceive that they have already adapted their practices to climatic risks and who
14 have not experienced losses due to adverse climatic events in the past are less willing to
15 purchase insurance. The paper contributes to the limited knowledge on preferences for climate
16 risk-related insurance in agricultural systems in general, and in Europe in particular.

17
18 Key words: natural insurance, market insurance, yield insurance, index insurance, choice
19 experiments, latent class, risk mitigation, sustainable soil management
20

1 **1. Introduction**

2 The more extreme weather events being experienced in recent years and potential increases in
3 the frequency and intensity of future weather extremes pose a significant risks to farmers'
4 agricultural production and incomes (Bielza et al., 2008; Ciscar et al 2018; Vogel et al 2018;
5 Brower, 2019). Heavy rain or drought can cause large production losses if they occur when
6 crops are vulnerable to such weather extremes. To avoid such losses, farmers may adapt to
7 changes in climate by introducing less sensitive crops, investing in more robust agro-ecological
8 management or taking land out of production (Wood et al, 2017).

9 Farmers can choose to mitigate climate-related risk by investing in insurance and thus
10 redistributing income to secure a given level of income in hazardous states (Baumgärtner &
11 Quaas, 2010; Baumgärtner & Strunz, 2014; Strunz & Baumgärtner, 2010; Strunz, 2011;
12 Pascual et al 2015). Agricultural insurance markets have a long tradition in developed
13 countries, such as in the US by offering yield insurance to farmers, although this is not as
14 widespread in Europe (Santeramo and Ramsey, 2017). In the US famrers can generally insure
15 against yield (or revenue) losses from natural disasters (drought, hail, insects, frost, etc.) and
16 against falling prices (Miranda and Vedenov 2001; ARMS 2010). In Europe, Spain and France
17 have attempted at establishing weather-indexed insurance but with not much success
18 (Santeramo and Ramsey, 2017). There has also been an attempt to introduce insurance against
19 adverse weather events into the Danish market (Jørgensen, 2015).

20 But the effects of standard agricultural insurance products can have unintended effects. The
21 literature points towards the fact that agricultural insurance tends to negatively affect the
22 environment given the reduction in self protection behaviour through a decrease of the effort
23 towards sustainable land management. This is a form of moral hazard. Baumgärtner and Quaas
24 (2007) and Quaas and Baumgärtner (2008) show this theoretically, while Horowitz and
25 Lichtenberg (1993) and Wu (1999) test the hypothesis empirically and find that farmers tend
26 to undertake riskier and adopt more intensive agricultural practices (e.g. they use more
27 fertilisers, pesticides, etc.) when they purchase agricultural insurance. The link between
28 insurance and environmental impact in agrarian systems requires understanding how insurance
29 mitigates the influence of uncertainty on a farmer's well-being (Baumgärtner & Strunz, 2014).
30 For a farmer this can be achieved in ways other than through purchasing conventional
31 insurance. Natural insurance (NI) works as the market insurance: the land manager redistributes
32 income, by managing natural capital, towards securing income flows in hazardous states
33 (Becker, Isaac, & Ehrlich, 1972). NI can be seen as an investment to enhance ecosystem

1 resilience and reduce the risk of undesirable outcomes, i.e. it will keep the ecosystem in a
2 desired and productive domain (Baumgärtner & Strunz, 2014). In other words, a well-
3 functioning agroecosystem will act as NI by reducing farmers' risk (Crocker, Kask, & Shogren,
4 1998). This is also sometimes called self-insurance (Becker et al, 1972; Pascual et al., 2015).
5 The cost of NI is the economic loss resulting from employing land management restrictions
6 and foregoing economic opportunities. An examples of NI is the construction of wetlands
7 which reduces the risk of production loss on the neighbouring fields by channelling water away
8 from agricultural fields. The current special issue also offers examples of the potential use of
9 natural insurance in sectors other than agriculture (Paavola and Primmer, this issue).

10 According to Quaas and Baumgärtner (2008) and Baumgärtner and Quaas (2010) NI and
11 market insurance (MI) are likely to be substitutes in certain cases; if, for example, yield
12 insurance is being offered by a commercial insurer, the farmer may buy that insurance instead
13 of practising NI. Therefore, availability of MI can reduce demand of NI through competition,
14 and thereby may negatively agroecosystem resilience attributes, especially under short-term
15 low-cost MI (Becker et al., 1972). The problem arises when choosing to invest in MI the farmer
16 foregoes the option to invest in natural capital, thereby creating a typical problem of moral
17 hazard. Further, it is plausible that the degradation of natural capital which may act as NI,
18 implies incurring in a higher cost of undertaking NI in the longer term if the marginal cost of
19 restoration of natural capital increases over time, thereby making investments in NI becoming
20 less attractive as farmers further rely on MI.

21 This paper studies the potential insurance choices confronted by commercial farmers as a
22 climate change adaptation mechanism. We analyse the attractiveness for farmers in voluntarily
23 entering into climate risk insurance schemes in cases where such schemes are conditional on
24 investing in NI (as a way to minimize moral haard) through adoption of soil management
25 actions. Using a case study from Denmark, a choice experiment is conducted to reveal how
26 farmers perceive the risk of crop damage from climate change and the extent to which they
27 perceive adoption of conditional insurance schemes to be beneficial. The choice experiment is
28 based on a representative sample of 593 Danish farmers and focuses on their choice between
29 purchasing different market insurance products with varying insurance coverage, costs
30 (insurance premiums) and conditionality measures (in the form of undertaking different
31 sustainable soils practices). To the best of our knowledge, we conduct the first study to analyse
32 the preferences of farmers of entering into an insurance scheme to adapt to climate change
33 under conditional natural insurance investments.

1 The next section gives an overview of some of the challenges related to the introduction of
2 market insurance in the agricultural sector. Section 3 presents the Danish case study including
3 the hypothetical insurance scheme used in the choice experiment and the modelling approach.
4 The results of the survey are presented in section 4, and section 5 discusses the results and
5 concludes.

6 **2. Market insurance of agricultural production**

7 Several well-known obstacles exist to achieve an efficient insurance market. The main
8 challenges are the problems related to asymmetrical information such as adverse selection and
9 moral hazard. These arise because farmers have an incentive to strategically withhold
10 information from the insurer. Firstly, farmers facing high risk of loss are more likely to seek
11 insurance (adverse selection). Secondly, farmers might be tempted to behave in more risky
12 ways when insured (moral hazard). The challenges can be addressed in several ways, for
13 example through type-specific insurance, area yield insurance and weather insurance (Glauber
14 2004; Rasmussen 2008).

15 For type-specific insurance, the insurer identifies different types of farmers and then designs
16 individual contracts for each of those types. Each type of farmer will then be offered a contract
17 designed for the risk characterising their type of farming. This type of contract leads to
18 relatively high administrative costs as it requires detailed information about the farmer and
19 farm operation in order to design an optimal contract. To overcome this, compensation under
20 an “area yield insurance” has been proposed (Miranda 1991), as this would not depend on the
21 individual land manager’s yield, but on the average yield in a given land area. Thereby, the
22 farmer will only be compensated if there is a general loss in the area. Since there is nothing to
23 gain from undertaking more risky behaviour, the problem of moral hazard is no longer a key
24 issue for the insurer. Additionally, the farmer would not have a motivation to withhold
25 information, since the insurance contract attributes and compensation holds for all the farms in
26 the area. Adverse selection is also minimised since information on average yield in an area is
27 generally more reliable than information on individual farm yield (Linnerooth-Bayer and
28 Mechler 2015). Another form of insurance is related to weather-indexed insurance. It works in
29 a similar way: the farmer will only be compensated if a bad weather event is documented. This
30 implies that the incentive to behave in a more risky manner is reduced, since compensation is
31 not based on the farmer’s yield but on exogenous weather events; hence the farmer still has an
32 incentive to maintain soil productivity. Nevertheless, irrespective of the type of insurance

1 farmers may still reduce adoption of sustainable practices (decline in Natural Insurance) in order
2 to maximize short term yields at the cost of long run productivity and system resilience.

3 Both area yield and weather insurance are index-based schemes and rely on a simple insurance
4 mechanisms: everybody pays the same premium, there is no need for the farmer to prove the
5 loss, and everybody gets the same compensation. The effectiveness of index-based insurance
6 in reducing risk depends on how well the actual yield correlates with the index (Glauber 2004).
7 For weather insurance to be effective, a high density of weather stations is required. Otherwise,
8 the variations in the weather-index will not reflect the variation in risks between farms.
9 Organisations such as the World Bank promotes weather insurance in many developing
10 countries (Tadesse et al., 2017) although there are still scant rigorous evaluations of such
11 insurance schemes due to lack of data (Jansen and Barrett, 2017).

12 There are indications that while index-based insurance can help reduce moral hazard, adverse
13 selection and administrative costs, it also creates new problems. One is the displacement of risk
14 unevenly between groups of farmers when we understand as risk being unevenly “produced”
15 and “displaced” through socio-ecological processes, thereby providing benefits and security to
16 some by transferring risks to others (Taylor 2016). Another related problem, arises since
17 compensation is made independently of individual realised damages and thus can cause
18 significant livelihood challenges and not give farmers the income stability they seek to obtain
19 through insurance. On the one hand, if risks are low, the farmer will be further encouraged to
20 maintain a sustainable and healthy farmland: the farmer will be compensated if bad weather
21 occurs, and if the soil is well managed and no loss occurs, an “extra income” is earned. On the
22 other hand, if the compensation payments do not cover the effort and costs of managing
23 farmland sustainably, the farmer has no incentive to invest in natural insurance. This means
24 that the capacity of index-based insurance to encourage natural insurance for instance by
25 initiating sustainable agricultural management depends on the relative size and spatial and
26 temporal distribution of the gains and losses. It can be noted that farmers who do not invest in
27 the adoption of appropriate land management practices may be shifting the negative
28 consequences of such behaviour to other farmers (e.g, via hydrological connectivity, soil
29 erosion, etc.) now and into the future, thus making this a longer term sustainability issue.

30 Private insurers, farmers and regulators face different needs and challenges. While moral
31 hazard and adverse selection tend to be seen as the problems faced by the private insurer, from
32 a societal perspective (that is, from the regulator’s perspective) such problems are also relevant

1 as private insurance markets may involves a risk of increased degradation of agricultural land
2 or disinvestment in natural insurance which can be seen as a “public bad”. From the farmers’
3 perspective the choice between purchasing insurance or not purchasing it depends on
4 perceived risks associated with extreme climate events, the level of insurance premium, and
5 farm productivity, among others.

6 There is a scant literature that analyzes farmers’ preferences for insurance using stated
7 preference methods. Sherrick et al. (2003) analysed US farmers’ preferences with a conjoint
8 analyse. They found that contract flexibility is the most important attribute to farmers,
9 indicating that farmers would like greater freedom in selecting which areas to insure. With
10 flexible contracts the farmers seems to prefer revenue insurance over yield insurance, while
11 they put more weight on low coverage/cost/frequency if they are presented with an inflexible
12 contract. Nganje et al. (2004) also looked at farmers’ preferences for insurance in terms of
13 crop insurance and found that coverage level, insurance type, and premium size affect choice
14 of crop insurance. More recently, Tadesse et al (2017) applied a choice experiment in Ethiopia
15 to test the advantage of combining cash premiums and labour application (e.g., for tree planting
16 to retain soil) as a work-for-insurance scheme targeted at poor farmers who cannot afford to
17 pay full insurance premiums in cash.

18
19 This paper is an empirical analysis to shed light on the preferences farmers have to invest in
20 market insurance, and how such schemes might be designed to promote environmentally
21 appropriate land management, i.e., to not compromise natural insurance investments. We
22 present a new kind of insurance scheme for crop yield based on an index insurance which is
23 contingent on farmers investing in sustainable soil management. That is, in order to receive
24 compensation by the insurer the farmer must fulfil certain soil management requirements (akin
25 to investment in natural insurance), for example by ensuring green fields in winter, growing
26 catch crops, practicing no-tillage or undertaking other measures that enhance the sustainability
27 of the soil. By exposing farmers to different insurance contracts by the regulator, with varying
28 combinations of price premiums, compensation terms (yield or weather index schemes, level
29 of excess) and soil management requirements.

30 We test this insurance scheme in a hypothetical setting building on the attempts to introduce
31 weather insurance into the Danish market by CelsiusPro insurance company in collaboration
32 with SEGES (Danish Knowledge Centre for Agriculture) around 2012. CelsiusPro sells

1 weather certificates for weather-dependent industries, such as the construction and agricultural
2 sector, worldwide. Their business is therefore based on risk pooling.¹

3 **3. Methods – developing a conditional insurance scheme for Danish** 4 **farmers**

5 In order to analyse the uptake of a climate risk insurance scheme in practice, a questionnaire
6 was designed and responses collected about the characteristics of individual farmers who
7 expect to be affected by adverse climatic events. The questionnaire was an input to a choice
8 experiment to analyse farmers' preferences for a hypothetical insurance scheme with
9 requirements for also investing in natural insurance by improving soil management.
10 (Questionnaire can be found in the supplementary material).

11

12 **3.1 Data collection**

13 A national representative survey among Danish farmers was conducted in 2013. The survey
14 was administered by ASPECTO, a market research agency, with access to a panel of farmers.
15 This data collection format was chosen to reduce costs and has been demonstrated to be as
16 reliable as mail surveys in a Danish context (Olsen, 2009). ASPECTO's farmers' panel
17 contained approximately 5.000 members. Danish farmers are familiar with reporting of farm
18 management data on internet portals. Therefore, an internet-based study was not expected to
19 reduce the representativeness of the sampled farmers. This is also supported by previous
20 studies (Pedersen and Christensen, 2011), and enabled us to reach a large number and a broad
21 range of Danish farmers. To increase the response rate, an iPad was offered as a prize to five
22 randomly selected respondents.

23 The questionnaire was developed in dialog with advisors from SEGES (the Danish
24 Knowledge Centre for Agriculture) and four individual farmers that acted as key informants.
25 The draft questionnaire was then discussed in three farmer focus groups, and finally tested in
26 a small pilot study. This process aimed to ensure that the final questionnaire was
27 understandable, credible and relevant from the farmers' perspective. Respondents were asked
28 a series of questions regarding their perception on climate change, expectation of the impacts
29 they would incur, mitigation possibilities and their responsibilities towards adaptation and

¹ The authors have been in contact with SEGES; however they had no data or information regarding the sales of the certificates. It was not possible for the authors to obtain information from CelsiusPro.

1 mitigation. Furthermore, socio-economic and farm information, such as type and number of
 2 livestock, crop types, etc. were available from the farmer panel database. The list of socio
 3 economic and farm variables used in the final analysis are described in Table 1.

4 **Table 1: Variables used in the choice experiment on farmers' insurance**
 5 **adoption and their definition.**

Variable name	Definition
<i>No Effect</i>	Expecting no effect of extreme events (Yes = 1; No = 0)
<i>Inc. risk of loss</i>	Expecting increase in crop loss (Yes = 1; No = 0)
<i>Adaption actions</i>	The farmer is taking adaptive measures (Yes = 1; No = 0)
<i>Soil type</i>	Soil type on the farm is predominantly clay (Yes = 1; No = 0)
<i>Region Zealand</i>	Farm located in the Zealand region (Yes = 1; No = 0)
<i>Owner</i>	The farmer owns the farm (Yes = 1; No = 0)
<i>Experience</i>	Farmer has experienced loss due to extreme events (Yes = 1; No = 0)
<i>SoilQual</i>	Soil quality (scale 1-5), where 1 is the best quality
<i>Arable</i>	Farmer is an arable farmer ((Yes = 1; No = 0)
<i>Pigs</i>	Farm produces pigs (Yes = 1; No = 0)

6
 7 With a respond rate of 51% the survey resulted in 593 valid responses. A descriptive analysis
 8 shows that the sample is slightly skewed compared to the total population of farmers in
 9 Denmark. We find a typical bias: middle aged farmers are overrepresented, while young and
 10 older farmers are underrepresented. However, the geographical representation is fairly close
 11 to that of the total population of Danish farmers.

12 We use the variables listed in Table 1 to test the relationship between adoption of market
 13 insurance and propensity to invest in natural insurance (Table 2).

14
 15 **Table 2: Variables used to test alternative hypothesis about the link between climate**
 16 **change, agricultural adaptation behavior and adoption of insurance.**

Variable name	Hypothesized influence on insurance adoption
No Effect	We hypothesise that farmers who do not expect that the future climate will lead to significant impacts will be less likely to purchase insurance.
Inc. risk of loss	We hypothesise that farmers who are expecting and increase in crop loss will be more likely to purchase insurance, everything else being equal.
Adaption actions	Apriori, we do not know whether to expect that farmers who have already undertaken adaptive measures are likely not to be interested in insurance as they perceive that they have already taken adequate measures. An alternative hypothesis could be that farmers who undertake adaptive measures tend to be more concerned about future impacts and therefore would be more likely to seek market insurance.
Soil type	We hypothesise that farmers with predominantly clay soil would be more at risk of increasing precipitation. Therefore it would be

	expected that they would be more likely to insure, everything else being equal.
Region Zealand	The Zealand Region has a high Dexter ratio, which is the ration of clay to soil organic carbon (Dexter et al. , 2008). Soils with a high Dexter ration are more likely to benefit from the prescribed management practices than soils with a low index (Schjønning et al., 2009).
Owner	It is anticipated that farmers who own their land will be more likely to invest in sustainable soils as the effects of improved soil management will only be realised in the longer term.
Experience	We hypothesise that farmers who have experienced loss due to extreme events will be more likely to be interested in insurance.
SoilQual	We expect that soil quality could influence susceptibility of the crops to adverse climate events and therefore potentially also influence the likelihood of insurance uptake.
Arable	The farm type largely determine crops rotations and are therefore also determining the sensitivity of the farm to climate events. The main two categories of farm types are arable farms and livestock farms.
Pigs	See above. Furthermore, pig farming is associated with cereal production for feed, whereas dairy farming to larger extent rely on grass for fodder.

1

2 **3.2 An insurance scheme for Danish farmers**

3 In the survey, farmers who indicated that they could be interested in insuring crops against
4 adverse climatic events were given more information about the hypothetical insurance scheme.
5 They were presented with different versions of the insurance scheme via a choice experiment
6 (CE) design. Choice experiments belong to the family of stated preferences methods and use a
7 hypothetical setting (Hensher, Rose, & Greene, 2005). In this study, the respondents were
8 asked to choose the preferred of three alternatives in a choice set, one of the alternatives being
9 the status quo (see Alpizar (2001) and Hensher (2004) among others for more information
10 regarding choice experiment design). The other alternatives, i.e. “Insurance A” and “Insurance
11 B” were a mixture of different levels of key insurance attributes. Setting up different versions
12 of an insurance scheme enables analysis of farmers’ preferences for insurances and of the
13 potential trade-offs or synergies between the market insurance characteristics and the
14 conditions to adopt appropriate soil management practices, which we here interpret as a long-
15 term investment in natural insurance as a public good.
16 The insurance contracts were described based on the different attributes regarding forms of
17 cover they offer, as well as on the extent, or level, of cover offered. Respondents were informed
18 that the insurance scheme would be designed to prevent farmers from potential production loss
19 due to heavy rainfall events. They were also informed that the compensation from the insurance

1 scheme would be conditional on compliance with the soil sustainability standards set out in the
2 contract involving reduced tillage and/or mulching of straw or plant residues. These measures
3 were chosen based based on advice by the farm advisory services because they are believed to
4 be effective and feasible in the context of Danish agriculture. Mulching is widespread, and
5 broadly acknowledged as a method to increase soil organic carbon. However, it bears the
6 opportunity cost of selling the mulch for example for bioenergy or livestock production.
7 Reduced tillage is sometimes used to increase soil organic carbon although the effectiveness
8 has not been widely proven (Zandersen et al. 2016). If the farmer already practiced reduced
9 tillage or mulching prior to the introduciotn of the insurance scheme, those areas would also
10 eligible for the insurance. Based on a review of crop insurance in Europe (see: Bielza et al.,
11 2008), the insurance scheme could carry an annual premium between 3% and 9% of expected
12 crop production in the insured area. In the event of a loss in production due to a heavy rain
13 event, the insured would receive compensation for the full loss of agricultural production.
14 Two kinds of insurance schemes were offered to farmers as part of the CE: a yield insurance,
15 in which loss and compensation is based on actual yield loss; and a weather/rainfall insurance,
16 in which loss and compensation is based on local rainfall and with no excess, i.e. no deductions
17 of the compensation payment. Both types of insurance would be governed by the Danish state,
18 and implementation of specific soil sustainability measures would become conditional for
19 being eligible for contracting insurance and being able to receive compensation payment in the
20 event of the hazardous state occurring. The respondents were duly informed that the
21 compliance with the contract would be monitored and enforced via a random selection of farms.
22 Thus, the level of insurance premium, type of insurance, whether or not the farmer is requested
23 to mulch, and/or applying reduced tilling are the four attributes used in the CE (see Table 2).

24 **Table 3. Attributes and levels in the choice experiment model of farm insurance**

Attribute	Level
Reduction of tilled area	10%, 25%, 50% or 75% –for every 10 ha tilled today the farmer will manage 1, 2.5, 5 or 7.5 ha with reduced tilling under the contract.
Mulching of plant residue	Mulching of plant residues are (are not) required to insure the farm.
Insurance type	Yield insurance (with a 10% excess) versus rainfall insurance (with no excess).
Premium (% of the insured value)	3%, 5%, 7% or 9 % of the expected yield of crops on the insured area.

25

1 Given the features of the insurance schemes, farmers could select one of the two insurance
 2 contracts or no contract at all. An efficient CE design, with conditions that avoid undesirable
 3 outcomes, was generated in NGENE (Choice Metrics, 2012). An efficient design does not only
 4 minimise the correlation in the data, but also aims to generate estimates with small standard
 5 errors (Choice Metrics, 2018). We used the parameter estimates from a small pilot with 30
 6 farmers as prior information for generation of the design. We ended up with a design with eight
 7 choice cards per respondent. Each respondent was presented with eight different choice cards
 8 (see example in Table 4).

9

10 **Table 4 Example of an insurance choice card**

	Insurance A	Insurance B	No insurance
Reduction in tilled area	75%	10%	I do not wish any of the proposed insurance schemes
Mulching required	No	Yes	
Insurance type	Yield insurance	Rainfall insurance	
Premium (% of insured value)	3%	9%	
Choice (place an X in the relevant box)			

11

12 **3.3 Model estimation**

13 We used a conditional logit model as a starting point for the analysis. Percent reduction of tilled
 14 area (*rt*) and premium as a percentage of the insured value (*prem*) enter the model as linear
 15 variables. Mulching requirement (*m*) and type of insurance scheme (*t*) enter the model as effect-
 16 coded dummy variables. A respondent (*i*) receives utility U_j when choosing one of the proposed
 17 alternatives. The probability that respondent *i* will choose alternative *j* (*j* = A, B or no contract)
 18 is equal to the probability that utility gained from choosing alternative *j* is larger than or equal
 19 to the utility gained from choosing any of the other alternatives.

20 The utility model in a conditional logit model with an alternative specific constant specified
 21 as:

$$22 \quad U_{A,B} = \beta_p rt + \beta_m m + \beta_t t + \beta_{prem} prem + u_{A,B} \quad (1)$$

$$23 \quad U_{sq} = \beta_{sq} + u_{sq} \quad (2)$$

24 where u_i are error terms that are independently and identically distributed extreme values
 25 (Gumbel-distributed) with variance $\pi^2/6$ and a mean different from zero (Train, 2009). A

1 potential status quo effect is captured by specifying an individual alternative specific constant
 2 (β_{sq}) for the status quo utility.

3 Unobserved segmentation can be accounted for in a latent class model (Greene & Hensher,
 4 2003; Swait, 1994). This specification takes heterogeneity between individuals into account by
 5 specifying underlying segmentation in the data set.

6 The utility function of the model with farmers belonging to latent class $s = (1, 2, \dots, S)$ is:

$$7 \quad U_{A,B|s} = \beta_{p_s}rt + \beta_{m_s}m + \beta_{t_s}t + \beta_{prem_s}prem + u_{A,B|s} \quad (3)$$

$$9 \quad U_{sq|s} = \beta_{sq_s} + u_{sq|s} \quad (4)$$

10 The subscript s indicates individual preference coefficients in each class. The error term
 11 ($u_{j|s}$) is Gumbel distributed with variance $\pi^2/6$ for each class. The number of classes that exist
 12 in the data is decided using standard statistical measures (AIC, BIC and ρ^2) as guidelines, and
 13 then the model results are taken into account before deciding on the final number of segments
 14 (Boxall & Adamowicz, 2002; Swait, 1994). Other specifications of heterogeneity could have
 15 been considered, such as e.g. mixed logit. Studies comparing the two (mixed logit and latent
 16 class) specifications have not come to a clear conclusion on which is the most preferred (Greene
 17 and Hensher 2003; Scarpa et al. 2005, Shen 2009, Greene and Hensher 2013). Each of the
 18 specifications have their own advantages. The LC model is semi parametric, avoiding ad-hoc
 19 assumption about the distribution of parameters across respondents. The MXL allows for
 20 individual unobserved heterogeneity. Both specifications take the heterogeneity in the data into
 21 account. The LC model defines segments in the data to handle the heterogeneity, while the
 22 MXL is specified with random parameters. The advantage of the LC model is that it is possible
 23 to investigate the cause of the heterogeneity, and to explain the differences in the segments,
 24 which potentially have policy relevance.

25 The results from the conditional logit and the latent class models are used to estimate the
 26 farmers' expected willingness to pay (WTP) for the attributes in the insurance scheme. The
 27 WTP is defined by the marginal rate of substitution between the attribute and a payment – in
 28 this case the premium.

$$29 \quad WTP = \beta_i / \beta_{prem} \quad (5)$$

30

1 4 Results

2

3 A standard conditional logit regression, with an alternative specific constant to account for
 4 possible status quo effect (Hensher et al., 2005) and the attributes given in Table 2 as
 5 explanatory variables, reveals that the respondents are indifferent to the mulching and
 6 insurance type (yield or rainfall) attributes of the insurance. We proceed with the modelling
 7 based on the statistical significant variables from the initial model specification. The utility
 8 model for insurance therefore looks like:

$$9 \quad U_{A,B} = \beta_p rt + \beta_{prem} Prem + u_{A,B} \quad (6)$$

$$10 \quad U_{sq} = \beta_{sq} + u_{sq} \quad (7)$$

11 From the model it also appears that farmers prefer as few restrictions as possible as the tilling
 12 requirement reduces the attractiveness of the insurance contract, and farmers would prefer as
 13 low a premium as possible, as would be expected. However, the status quo is negative,
 14 indicating that they would become better off from having the insurance over and above what
 15 is captured in the scheme variables (Table 5).

16 **Table 5. Insurance adoption parameters from the choice experiment**

Attributes	Parameter estimates
<i>Reduction in tilled area</i>	-0.427*** (0.034)
<i>Level of premium</i>	-0.155*** (0.017)
<i>Mulching</i>	-0.021 (0.035)
<i>Insurance type</i>	-0.047 (0.036)
<i>Status quo</i>	-0.696*** (0.143)
AIC	4154.4
Log likelihood	-2072.21

17 Note: ***, ** and * are significant at 1%, 5% and 10% levels, respectively. Numbers in
 18 parenthesis, under the parameter estimates are the standard errors. Reduction in tilled area and
 19 premium are linear parameters. Mulching and insurance type are effect-coded parameters.
 20 Mulching = 1 if the contract includes demand of mulching, if not mulching = -1. Rainfall
 21 insurance (index) = 1; yield insurance = -1.

22

23 Other factors, such as socio-economic characteristics could also influence the respondents'
 24 choices. Therefore, the model is expanded to:

$$25 \quad U_{A,B} = \beta_p rt + \beta_{prem} Prem + \beta_{pigs} Pigs * rt + \beta_{soil} Soilqual * rt + \beta_{arable} Arable * rt +$$

$$26 \quad u_{A,B} \quad (8)$$

$$27 \quad U_{sq} = \beta_{sq} + u_{sq} \quad (9)$$

1 Table 6 (second column) shows the results of the conditional logit model including only the
2 statistically significant variables. Table 6 (third column) also shows results of the basic
3 conditional logit model expanded by including the socio-economic variables interacted with
4 the reduced-tilling variable. Scaling implies that care should be taken in analysing the
5 estimation results directly. However, it is possible to focus on the interpretation of the sign of
6 the coefficients, and their statistical significance. As expected, the coefficient for *reduction in*
7 *tilled area* is negative, meaning that the larger an area the respondent needs to practice reduced
8 tillage, the lower the utility derived from the insurance scheme. As expected too, the coefficient
9 for the level of *insurance premium* is negative. The coefficient on *pigs* is negative, implying
10 pig farmers are less willing to accept an insurance contract than other farmers. The reverse is
11 the case for arable farmers. That was also expected, as pig farmers are less vulnerable to heavy
12 rain than arable farmers. Interestingly, the coefficient for soil quality is positive, indicating that
13 the lower the soil quality of the land in which the farmers operate, the higher the utility the
14 farmers get from an insurance contract. The negative coefficient on the *status quo* indicator is
15 statistically significant, relatively large and negative, indicating that on average farmers are
16 interested in purchasing the insurance.

17 **Table 6: Insurance adoption parameters for the conditional logit model (CLM), the CLM**
18 **with interaction effects and the Latent Class model with two segments (1 and 2).**

Attributes	Base model (CLM)	Expanded model (interaction)	Latent class	
			1	2
<i>Reduction in tilled area</i>	-0.432*** (0.033)	-0.731*** (0.092)	-0.940*** (0.306)	-0.833*** (0.171)
<i>Premium</i>	-0.156*** (0.017)	-0.156*** (0.017)	-0.366*** (0.052)	-0.123*** (0.020)
<i>Pigs</i>		-0.167*** (0.041)	-0.168 (0.126)	-0.133* (0.075)
<i>SoilQual</i>		0.060*** (0.018)	0.096** (0.049)	0.058* (0.034)
<i>Arable</i>		0.084** (0.033)	-0.068 (0.117)	0.147** (0.066)
<i>Status quo</i>	-0.716*** (0.143)	-0.738*** (0.143)	-1.152*** (0.369)	-2.636*** (0.197)
Membership Probability in the Latent Classes			0.640*** (0.029)	0.360*** (0.029)
AIC	4152.5	4121.5	3066.6	
Log likelihood	-2073.26	-2054.73	-1520.29	

1 Note: ***, ** and * are significant at 1%, 5% and 10% levels, respectively. Numbers in
 2 parenthesis, under the parameter estimates are the standard errors.
 3 Reduction in tilled area and insurance premium are linear parameters. Mulching and insurance
 4 type are effect-coded parameters. Mulching = 1 if the contract includes demand of mulching,
 5 if not mulching = -1. Rainfall insurance (index) = 1, yield insurance = -1. *Pig* and *arable* are
 6 dummies that = 1 if the farmer has pigs or grows crops. Soil quality is on a scale from 1 to 5,
 7 1 being the best quality and 5 being the worst quality.

8
 9 In order to analyse if there is any relationship between farmers' preference' towards the
 10 insurance scheme and expectations about the effect of future extreme weather events, a dummy
 11 variable was included, however this variable was non-significant, implying that those who
 12 believe they would be affected by future weather events would not have different preferences
 13 towards a hypothetical insurance scheme when compared to the rest of the respondents. This
 14 variable was thus not included in the reported results.

15 Besides the CLM, a latent class model (LCM) was estimated, where underlying segmentation
 16 of the sample is used. Following Swait (1994) and Boxall and Adamowicz (2002) the number
 17 of classes was determined by AIC, BIC and ρ^2 parameters as guidelines. Even though these
 18 information criteria indicated that more classes would generate a statistical improvement of the
 19 model, a two-class model was chosen, as models with more classes produced classes with only
 20 one significant parameter.

21 Since the LCM is a further specification of the CLM, the log likelihood values and AIC can be
 22 directly compared. The results suggest that the latent class specification is preferred. 64% of
 23 the respondents belong to segment 1 and 36% to segment 2 (see Table 6 for determinants
 24 segment membership). Both models have significant parameter estimates for reduction in tilled
 25 area, insurance premium, soil quality and status quo – and there is no shift in signs between the
 26 two segments. Segment 1 farmers place relatively large importance on the extent of the
 27 insurance premium, and their decision on whether they would purchase the insurance scheme
 28 depends more on soil quality than in the case of segment 2 farmers. In other words, the
 29 preference for insurance purchase depends mostly on a relatively low premium and the
 30 perception of working in farmland with a poor soil quality. Segment 2 is characterised by a
 31 large negative status quo estimate, indicating that farmers are interested in purchasing the
 32 insurance, and a significant effect for the type of farmer (pig or arable).

33

34 **Table 7: Determinants of segment membership of the sample of farmers (for Segment 1)**

Variable	Parameters
<i>No effect</i>	-0.552*** (0.095)

<i>Inc. risk of loss</i>	-0.645*** (0.081)
<i>Adaptation actions</i>	0.001*** (0.000)
<i>Soil type</i>	-0.238*** (0.042)
<i>Region Zealand</i>	0.291*** (0.103)
Owner	2.635*** (0.195)
<i>Experience</i>	-1.055*** (0.202)
<i>SoilQual</i>	-0.129*** (0.028)
Log likelihood	-4571.52

1 Note: ***, ** and * are significant at 1%, 5% and 10% levels, respectively. Numbers in
2 parenthesis, under the parameter estimates are the standard errors.

3 Soil type; Sandy = 1, low and high activity clay (LAC and HAC) = 2 and hummus =3, Zealand
4 = 1 (includes the region Capital and Zealand), rest of Denmark = 0. Soil quality is on a scale
5 from 1 to 5, 1 being the best quality and 5 being the worst.

6

7 Table 7 shows the results of an explanatory model that attempts to analyse what characterises
8 farmers in segment 1. Farmers associated mostly with segment 1 tend to believe that more
9 extreme weather will have an effect on their farming practices; however, they do not think the
10 risk of productivity loss will increase as a result. Nor have they experienced productivity loss
11 due to heavy rainfall in the past. They have taken action to prevent future losses and tend to
12 own their farms; live in the Zealand region; have sandy soils and assess their soils as being of
13 good quality. This would suggest that farmers with high quality soils, who believe that they
14 have adapted their practices to the increasing risk and have not experienced productivity are
15 less likely to invest in market insurance.

16

17 This finding is further confirmed by interpreting the WTP estimates for the different models
18 and the individual segments (Table 8). The WTP represent the marginal rate of substitution
19 between changing tilling practices and the insurance premium. The premium is a percentage of
20 the expected yield of the insured area. The WTP is therefore also a percentage of the expected
21 value of the insured area (Table 8). For the CLM model the results suggest that farmers are
22 willing to increase their insurance payment (premium) by one 1% if they can reduce their
23 adoption of reduced tillage by 2.77 %. Taking socio-economic variables into account seems to
24 increase the MRS to 4.69%. The results from the latent class model confirms the finding that
25 segment two is more interested in adopting market insurance as they are willing to increase the
26 area where they implement sustainable soil practices by 6.77 % for a change in the insurance
27 premium by 1%, i.e. they are willing to pay more for insurance. In comparison, segment 1 is
28 only willing to implement sustainable soil management on 2.57% their land.

1 **Table 8: Marginal rate of substitution between more sustainable soil management and**
 2 **insurance.**

	Base model (CLM)	Expanded model	Latent class 1	Latent Class 2
<i>MRS</i>	2.77	4.69	2.57	6.77

3

4 **5 Discussion**

5 It is clear from our analysis of Danish farmers’ stated preferences that they are interested in
 6 agricultural insurance to adapt to future extreme weather events. Farmers appear to be aware
 7 of the future challenges and many are already adapting their practices to reduce their
 8 vulnerability of their production system to expected adverse events. Implementing market
 9 insurance to mitigate income uncertainties could however create incentives to disinvestment in
 10 longer term sustainable land management. We have tested the preferences towards an
 11 insurance model that offers an opportunity for the government to mitigate the uncertainty
 12 related to moral hazard and social benefits from investing in natural insurance by making
 13 market insurance be conditional on sustainable soil management (via reduced tillage and
 14 mulching). Both practices have been proposed to improve soil structure and long term
 15 productivity and may also help manage soil organic carbon with clear societal benefits. The
 16 regulator therefore has a clear interest in the design of such schemes to utilise the opportunity
 17 to ensure provision of soil ecosystem services of a mixed private (for the individual farmers)
 18 and public goods. The two studied practices for providing natural insurance appears to generate
 19 different responses from the farmers. Most farmers (75%) already perform mulching and this
 20 practice does not appear to be costly to the farmers. The cost of mulching is the loss of the
 21 alternative income from selling the mulch for energy production, minus the benefit of adding
 22 nutrients to the soil. Reduced tilling however, appear to be less favoured by farmers. The cost
 23 of having restrictions on tilling has, for most farmers, more unknown effects; they may have to
 24 learn how to manage the soil without ploughing and invest in new machinery to adapt their
 25 farming practice. Furthermore, the cost of weed control will probably go up, at least in the
 26 short-term.

27

28 The survey revealed that a majority of the farmers are already adapting to extreme weather
 29 events in order to minimise risks of production loss. Only 5% of those who experienced loss
 30 due to extreme weather did nothing to prevent future losses. This indicates that an insurance

1 scheme could compliment how farmers choose to mitigate or adapt to climate change. In the
2 interpretation of the results it is important to remember that the study reports on potential
3 uptake of a hypothetical scheme. At the time of the data collection no real insurance scheme to
4 cover against climate events were available to farmers. However, in August 2019, the Danish
5 insurance company, TopDanmark, started to offer a yield insurance to Danish farmers. The
6 insurance is available for cereal and oil seed rape and has an excess of 20%. The premium is
7 19.4 euro/ha for cereal and 38.8 euro/ha for oil seed rape. The insurance pay-out is based on
8 the loss relative to average years. The assessment of damage does not depend on a single event,
9 but the sum of events over a year. The type of damage is not restricted to specific climatic
10 events but could be damages caused by heavy rain, drought, insects, wild animals etc. The
11 farmer is responsible for documenting the events that have caused the yield loss.

12 The insurance scheme differ in important ways from the scheme tested in the survey. Firstly,
13 the premiums appear to be lower than the premiums in the hypothetical scenario and cover a
14 wider range of damages. However, the cost of impact monitoring is the responsibility of the
15 farmer and at this stage it is not clear what documentation will be required. Secondly, the new
16 scheme does not appear to have any conditionality requirements and it is too early to analyse
17 whether the implementation of the scheme will encourage less self-protection. However, as the
18 payment is based on farm specific losses reported by farmers problems related to moral hazard
19 would be expected. Thirdly, an excess was not included in the hypothetical scheme but is
20 clearly a relevant scheme attribute in real insurance products. In future, it will be interesting to
21 evaluate the attractiveness of the particular scheme using revealed data on insurance behavior
22 and compensation levels.

23

24 The EU Common Agricultural Policy framework includes a compulsory risk mitigation
25 component where member states are required to offer programmes for farmers to mitigate the
26 risk to their business. This appears to offer an opportunity for Governments in the member
27 states to align the need to mitigate risks to agricultural incomes while incentivising investment
28 in neutral insurance for the longer term sustainability of agricultural production.

29

30 The main lesson from looking at Danish farmers' preferences towards insurance is that it
31 appears plausible that farmers may be willing to accept a policy mix whereby governments
32 may offer incentives to farmers to purchase market insurance (e.g, via subsidies to lower the
33 price premium) while at the same time governments allowing (via regulation) access to
34 subsidized insurance conditional on investing in soil management practices ("sticks"). In this

1 way governments could mitigate the moral hazard of farmers disinvesting in natural insurance
2 while helping them to insure against increased risks of crop failure due to climate change
3 related extreme weather events, such as heavy rainfall. Farmers' preferences appear to support
4 such carrot-stick approach. Of course, this result is based on a demand side analysis. We have
5 not analysed the viability of such combined insurance scheme from the private insurance
6 supplier's perspective. It is likely that companies may play strategically and governments
7 would thus also need to regulate the way companies design weather-related insurance products
8 and the way they charge price premiums to different types of farmers so that governments'
9 subsidies create additionality across different types of farmers in terms of their sustained
10 investments in natural insurance.

11 **6 Conclusion**

12 The analysis of the insurance scheme reveals that market-based insurance has a demand in
13 Danish agriculture. The analysis also indicates a large heterogeneity between farmers and that
14 the farmers most interested in insurance appear to be farmers with low quality soils, who have
15 experience crop damages in the past. Furthermore, the analysis reveals that interest in insurance
16 is dependent on the farming system as arable farmers tend to be more interested in buying
17 insurance farmers than pig farmers. This was as expected, a priori, since arable farmers are
18 more vulnerable to heavy rains than pig farmers, and farmers with poor soil quality run a greater
19 risk of losing production because of adverse weather events.

20

21 The proposed scheme where natural insurance is a condition for participation in the marketed
22 insurance schemes offers an opportunity for the regulator to reduce the risk that market
23 insurance has unintended consequences for long term sustainability. The risk mitigation
24 options under the CAP appears to offer an opportunity to implement the scheme in practice.

25

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31

32 .

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1 Supplementary material: QUESTIONNAIRE
2
3 Welcome to the survey.
4 The survey is about soil management and we would like to know more about your thoughts
5 on soil management. We will ask you about your experience and attitude towards different
6 cultivation methods. The study is funded by the University of Aarhus and will be used for a
7 research project on sustainable soil management. Companies or organizations with financial,
8 or political, interests in the results of the study have not contributed to the project. The aim is
9 to investigate whether certain cultivation methods are attractive to farmers and under what
10 conditions.
11
12 Please mark your gender:
13
14 Male:
15 Female:
16
17 Please note your birth year
18 Year:
19
20 What is your relation to the farm?
21 (please specify)
22
23 Owner/tenant with daily management
24 Owner/tenant without daily management
25 Employed with daily management
26 Employed without daily management
27 Other, please note:
28
29 How many hectares are cultivated (incl. leased area)
30 Number of hectares:
31
32 In the following, please give your answers with reference to this area
33
34 Are the agricultural land of the farm actively cultivated?
35 (please specify)
36
37 No, everything is permanent grass
38 Yes, the whole area is actively cultivated
39 Yes, part of the acreage is cultivated: ____ hectares
40
41 If No, the whole area is permanent grass: STOP – “Thank you for your answers...”
42
43 Which of the descriptions below best describe you?
44 (please specify)
45
46 I am a full time farmer
47 I am a part-time farmer with other paid employment
48 I am a hobby farmer
49 Other, note:
50

- 1 Who primarily decides on the management of the fields?
2 (please specify)
3
4 I decide everything myself (possibly with consultancy assistance)
5 I decide in consultation with others (eg employees, partners)
6 I do not even participate in the decision
7
- 8 What agricultural education do you have? (more answers possible)
9 (please specify)
10
11 Agricultural economist
12 Agronomist
13 Agriculture Technician
14 Farmer (The Green Proof)
15 Other, please note:
16 Does not have an agricultural education
17 Don't know / won't answer
18
- 19 In the following, we will ask if your production has been affected by major rainfalls in recent
20 years.
21
- 22 To what extent have you observed areas that are water-logged?
23 (please specify)
24
25 In larger areas
26 To a limited extent
27 Not at all
28 Do not know
29
- 30 To what extent have you observed areas where the rainwater is not percolating through the
31 top-soil?
32 (please specify)
33
34 In larger areas
35 To a limited extent
36 Not at all
37 Do not know
38
- 39 To what extent have you observed that the soil erosion during rainfall?
40 (please specify)
41
42
43 In larger areas
44 To a limited extent
45 Not at all
46 Do not know
47
- 48 To what extent have you, in your own estimation, suffered a loss (of production) in
49 connection with the heavy rains in recent summers?
50 (please specify)

1
2 Yes, significant loss
3 Yes, a minor loss
4 No, was not affected
5 Do not know
6
7 Filter 1:
8
9 If yes:
10 Are you actively doing something to secure your crops in order to avoid similar losses in the
11 future?
12 (It is OK to put more x's)
13
14 Yes, I have converted (parts of) the agricultural area to grass
15 Yes, I have changed the crop rotation
16 Yes, I have increased the supply of organic matter
17 Yes, I grow catch crops or the like. I.e. I have green fields in the winter.
18 Yes, I manage reduced tillage on all or part of the agricultural land
19 Yes, I repair / maintenance of drain
20 Yes, I have expanded the drainage area
21 Yes, I have invested in machinery
22 Yes Other _____
23
24 If no:
25
26 Is it because you are doing something active to protect your crops / fields from loss? (It is OK
27 to put more x's)
28
29 No
30 Yes, I have converted (parts of) the agricultural area to grass
31 Yes, I have changed the crop rotation
32 Yes, I have increased the supply of organic matter
33 Yes, I grow catch crops or the like. I.e. I have green fields in the winter.
34 Yes, I manage reduced tillage on all or part of the agricultural land
35 Yes, I repair / maintenance of drain
36 Yes, I have expanded the drainage area
37 Yes, I have invested in the machinery
38 Yes Other _____
39
40 END Filter 1
41
42 Have you experienced any other impacts on production due to weather incidents - in addition
43 to erosion and problems with rainwater?
44 (It is OK to put more x's)
45
46 No
47 Yes - which _____
48
49 Forecasts predict more extreme weather. How do you predict this will affect you?
50

1 I don't think it's going to affect me
2 I will have to change crop
3 I have to take larger areas out of management
4 Increased risk of / frequency of harvest loss
5 Other things _____
6
7 In e.g. in the US and several European countries, it is possible to insure against losses caused
8 by e.g. greater rainfall or drought with so-called crop insurance. Just as you have insurance in
9 Denmark for hail damage.
10 Would you be interested in insurance against crop loss associated with e.g. precipitation?
11 Yes
12 No
13 Maybe if I knew more
14
15 The CE part is only asked if the answer the above question was Yes / Maybe
16
17 In the following, we would like to hear about your experience with certain cultivation
18 methods
19
20 On how much of the arable land do you use organic fertilizer (ie slurry, manure ...)? On
21 _____ ha
22
23 On how much of the arable land do you mulch down straw or other plant residues? On _____
24 ha
25
26 On how much of the arable land do you use sludge as fertilizer? On _____ ha
27
28 On how much of the arable land do you grow catch crops? On _____ ha
29
30 Reduced tillage means that the soil cannot be ploughed. In the transition to reduced tillage
31 cultivation, the soil can become more compacted and increase the need for soil remediation.
32 Over time this effect diminished as the soil structure is improved with root and earthworm
33 channels. Mulching of straw and plant residues can also help the transition. Furthermore, by
34 having a good crop rotation diseases and weeds can be minimized. The direct effect of
35 reduced tillage can e.g. be seen on the number of earthworms, especially in the subsoil. In
36 addition to the increased biological diversity in the soil, it has been shown that the soil
37 structure will also be improved. This reduces the risk of both drought and water-logging. At
38 the same time, the management will potentially sequester more carbon in the soil, thus
39 reducing the atmospheric content of the greenhouse gas CO₂.
40
41 Do you have experience with reduced tillage?
42 (please specify)
43
44 Yes - good
45 Yes - bad
46 Yes - both good and bad
47 No
48
49 Filter 2
50

- 1 If yes
- 2 Do you manage with reduced tillage now?
- 3 Yes - all areas manage with reduced tillage
- 4 Yes - some areas are manage with reduced tillage
- 5 No - no areas are manage with reduced tillage
- 6
- 7 If some - on how many acres? ____
- 8
- 9 If no
- 10 Are you considering manage with no-till on all or part of the agricultural land?
- 11 Yes, I am considering it
- 12 No, not immediately
- 13 Do not know
- 14
- 15 Filter 2 is over
- 16
- 17 What could make you consider to try reduced tillage?
- 18 (please specify)
- 19
- 20 Economic compensation
- 21 Warranty for compensation in case of damage e.g. yield loss
- 22 More knowledge / information about reduced tillage
- 23 I don't want to practice reduced tillage
- 24 Other things: _____
- 25
- 26 In your opinion, what are the disadvantages of plow cultivation (It is OK to put more x's)
- 27
- 28 Soil compaction
- 29 Plant diseases overwinter
- 30 Necessary with crop rotation
- 31 Increased use of pesticides
- 32 Yield loss
- 33 It takes time before you can see a positive effect
- 34 Requires large financial investments in new machines, etc.
- 35 None
- 36
- 37 What in your opinion is the advantages of reduced tillage (It is OK to put more x)
- 38
- 39
- 40 It creates a good soil structure
- 41 Financial savings (fewer man hours, less fuel)
- 42 It increases biodiversity in the soil
- 43 Increased yield
- 44 Good for heavy clay soil - saves engine power
- 45 Reduces the risk of flooding
- 46 None
- 47
- 48 Filter 3: If "reduced tillage" amounts to more than 75% or you have previously answered that
- 49 you are not interested in insurance go to the questions after the choice experiment
- 50

1 Reduced tillage and mulching of straw or plant residues are examples of cultivation methods
 2 that can, among other things, contribute to improvements in soil structure and thus counteract
 3 erosion and water-logging. This is in the interests of both the farmer and the community - not
 4 least in light of the increasing problems with heavy rainfall in recent years.

5
 6 Therefore, it is relevant to explore different options for offering cultivation methods that
 7 benefit the soil structure and soil quality in general. One possibility could be to offer
 8 insurance against crop losses - on the condition that the farmer could do something to reduce
 9 the losses, eg, reduced tillage. The principle is the same as when you lock the door - both for
 10 your own sake and because insurance requires it before you can get compensation.

11
 12 In the following, you will be offered different versions of insurance. The insurances will
 13 insure you against any losses if, for example, greater rainfall. They will work as follows:

- 14 • You are obliged to cultivate the insured soil sustainably, in this case reduce tillage and / or
 15 mulching of straw or plant residues. Soil that is managed with reduced tillage in advance will
 16 also be covered.
- 17 • You pay an annual premium
- 18 • In case of "damage", you will receive compensation
- 19 • Payment of compensation is conditional on the cultivation of the land as stated in the
 20 contract. This will be controlled by random sampling.
- 21 • There are two types of insurance Dividend Insurance and Precipitation Insurance
 - 22 • Yield Insurance; Losses and damages are calculated based on your actual
 23 dividend. With dividend insurance, there is a deductible of 10%.
 - 24 • Rainfall Insurance; losses and damages are calculated on the basis of local
 25 precipitation data. There is no deductible.
- 26 • A government insurer is responsible for the offering.

27
 28
 29 In the table you can see the details of the insurance. On the next pages you can develop the
 30 box by clicking on the small button "click for more info."
 31

Attribute	Level
Reduction of tilled area	10%, 25%, 50% or 75% – that is for every 10 ha tilled today the farmer will manage 1, 2.5, 5 or 7.5 ha with reduced tilling under the contract.
Mulching of plant residue	Mulching of plant residues are/ are not required to insure the farm.
Insurance type	Yield insurance (with a 10% excess) or rainfall insurance (with no excess).
Premium (% of the insured value)	3%, 5%, 7% or 9 % of the expected yield of crops on the insured area.

32
 33 You will be presented with a choice between insurance A and B. If you do not find any of the
 34 insurance attractive, you also have the option to indicate that you do not want any of the
 35 insurance.
 36

1 You will be presented with this choice 8 times. Each time, the options will vary slightly. The
 2 purpose is to find out which combinations of options might be attractive to you. The purpose
 3 is not to test whether you respond according to your previous answers.
 4 It is important that you consider each choice for yourself and that you try to take into account
 5 all the conditions of the insurance.
 6
 7 Try to be as realistic as possible. Studies have shown that many people choose differently in
 8 questionnaires than in reality. Therefore, think carefully about your choices.
 9

10 _____
 11 _____

12 Example of one of the 8 choice card

	Insurance A	Insurance B	No insurance
Reduction in tilled area	75%	10%	I do not wish any of the proposed insurance schemes
Mulching required	No	Yes	
Insurance type	Yield insurance	Rainfall insurance	
Premium (% of insured value)	3%	9%	
Choice (place an X in the relevant box)			

13
 14
 15 Filter 4: If status quo in all 8 choice experiments
 16
 17 Why did you choose to continue without insurance in all the election situations? (tick 1)
 18
 19 I don't want to tie my production up on insurance
 20 The deductible was too high
 21 The premium was too high
 22 It was unrealistic
 23 There are already too many restrictions on how to grow one's land.
 24 It was too difficult to choose
 25 I do not want this kind of insurance
 26 Other things

27
 28 End filter 4

29
 30 On a scale 1-5 how would you characterize your overall soil quality?
 31 1 Healthy – good structure, very organic material and high biodiversity
 32 2
 33 3
 34 4
 35 5 Poor - poor structure, little organic matter and low biodiversity
 36 Do not know

37
 38 Which description best fits the way your land is part of the farm?
 39 *(please specify)*
 40 Production factor - an asset in my production
 41 Investment factor - an investment in the future
 42 Production and investment factor

- 1 Do not know
2
3 If investment factor / production and investment factor:
4 What do you do to nurture this investment: _____
5 Do not know
6
7 How do you see your role as a farmer in mitigating climate change?
8 *Choose the statement that best suits you*
9 I don't think I can make a difference
10 I feel that I am making an active effort to reduce the climate impact from agriculture
11 I wanted to make a bigger effort, but the cost of production is too high
12 I do not see it as my responsibility to reduce the climate impact
13 I do not believe in man-made effects on climate
14
15 Do you think that carbon (C in CO₂) is stored in the soil if you have a good soil structure and
16 high content of organic material?
17 *Choose the statement that best suits you*
18
19 Yes - but I'm not thinking about it
20 Yes - and I have that in mind when planning
21 Yes - I've heard of it, but I think the real effect is small
22 Yes - but I can't do anything different
23 No - I have never heard of it, but I will look into it more closely
24 No - I don't really believe that
25
26 May we contact you again if we have more questions?
27 Yes
28 No
29
30 If you have further comments, you can write them here:
31