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Index-based insurance for climate risk management and rural development in Syria

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Abstract

Improving the adaptive capacity of rural producers to climate and weather risks may become an urgent issue in the early stages of political stabilization in the future. Therefore, this study analyses agro-ecological, economic and social benefits and institutional challenges for establishing index-based insurance markets to catalyse rural development in Syria. The paper examines the risk minimization potential of three index-insurance schemes: (1) a statistical index, (2) an agro-meteorologically based index and (3) a remote-sensing based index. It also discussed the contribution of index-based insurance markets to rural development in scenarios of increasing climate risks.

The study identifies a very high potential of all three insurance schemes to cope with increasing climate risk. Insurance schemes designed according to these indexes performed very well in terms of covering revenue losses in most of the extreme drought years observed in the country. Farmers purchasing an insurance contract may have better access to credits and have more comfort investing in agricultural production and improve the productivity. Low operation costs of such alternative index-based insurance programs make the financial tool more affordable to poor farmers and thus provide an excellent potential contribution to economic growth of rural areas.

Keywords: climate change, rainfall deficit, NDVI, income stabilization, food security

1 **1. Introduction**

2 The population of Syria surpassed 20 million in 2011 (World Bank, 2013). Agriculture
3 employs 30 % of the population and contributes approximately 26 % to the country's GDP
4 (UN, 2008). Syria has a land area of 185.518 km² of which 32 % is arable land, and 45 % is
5 rangeland. Less than 25 % of the arable land is irrigated, while the remaining land, around
6 3258 thousand ha, is under rainfed agricultural production (Wattenbach, 2006).

7 The economy of Syria was in transition from a centrally planned to a market economy (Huff,
8 2004) before the political conflict started in 2011. Agricultural production is mainly carried
9 out by small private farms. The role of the state is considered to be very high. It indirectly
10 controls¹, for instance, the agricultural production through input- output subsidies and
11 procurement policies (De Corte *et al.*, 2007; Ahmed *et al.*, 2010). The guaranteed output
12 prices of the state prioritized crops were often higher than the world market prices (Huff,
13 2004). The state gives quotas for fixed maximum production according to national planning,
14 and purchases these crops from smallholder farms with attractive output prices. The state
15 subsidy packages differed from crop to crop. Cereal production is notably the most important
16 activity in Syria which is stimulated by the state and occupies almost 65 % of the arable land
17 (NAPC, 2005; Yigezu *et al.*, 2013). Cotton is another crop with a very attractive subsidy
18 package and therefore widely spread in terms of area and total production (Ahmed *et al.*,
19 2010).

20 A price guarantee obviously reduces the market risk for wheat production to some extent.
21 However, an increased production risk associated with climate change – higher temperatures
22 and increasing frequency of below-average rainfall– is becoming the heaviest burden of
23 Syrian farmers. Government price subsidies can no longer solely provide for complete
24 securitization under increasing production volatility. In contrast, a fixed price policy reduces
25 the natural hedging effect associated with price yield correlations (i.e. price and yield risk
26 tends to cancel each other out). There is a very high uncertainty about the developments in
27 agricultural policies in Syria due to the current conflict and the fact that vulnerability to
28 climate change could be further aggravated in post conflict years as observed in the
29 neighbouring regions (Mason *et al.*, 2011). Therefore, investigating the options of increasing
30 the risk-coping potential of Syrian farmers is urgently needed in order to improve the
31 livelihoods of farmers and food security in the country in the post conflict years. A crop

¹ The present tense is used for simplification reasons according latest available information, information about the state role in 2011/2012 vegetation season cannot be verified

32 insurance program could be a potential market-based financial instrument to increase the risk-
33 coping capacity of farmers and agricultural lenders in Syria. The establishment of a crop
34 insurance program was considered more than 20 years ago, but was not implemented due to
35 high costs (Huff, 2004). Recent developments in insurance show index-based insurances
36 suitable for developing countries and could allow implementing insurance programs with
37 lower costs, and therefore need to be considered in Syria.

38 Although many studies discuss the large benefits of insurances in the development domain,
39 the index-based insurance is a relatively new product in most markets. India has had a large
40 area-yield index-based insurance scheme for around 20 million farmers for around 15 years,
41 and Mexico has successfully implemented a weather index-based disaster assistance scheme
42 for around 1 million farmers in 2007 (Mahul and Stutley, 2010). Alberta and Ontario, Canada
43 have had successful area-yield and weather-index and even NDVI index-based forage
44 insurance schemes (World Bank, 2005). Since 2005, African countries have started building
45 weather index-based insurance schemes as well, notably Malawi, Kenya, Ethiopia, Tanzania
46 and Rwanda.

47 Despite this growing importance, adaptation of index-based insurances is limited to about 36
48 cases only (IFAD and WFP, 2010). Empirical benefits and costs of index-based insurance
49 may largely depend on farmers understanding and the agro-ecological and socio-economic
50 condition of the concerned country (Barnett and Mahul, 2007; Patt *et al.*, 2010; Miranda and
51 Farrin, 2012). The potential gains from insurance markets and constraints for developing such
52 services for the conditions of Syria so far have not been investigated. Therefore, the objective
53 of this study is to examine the bio-physical suitability, economic potential and institutional
54 trade-offs of an index-based insurance in the rainfed farming systems of Syria.

55 **2. Climate risk in Syria**

56 The climate of Syria is Mediterranean, semiarid (west and north of the country) to arid (east
57 and south of the country), with rainfall during winter and a 5-7 month dry season during
58 summer. The rainfed cropping season usually begins in November and extends to May-June.
59 Terminal droughts are frequent. In accordance with the different rainfall levels, Syria has been
60 divided into five farming systems, so called stability zones (Szönyi *et al.* 2005; Figure 1). The
61 main agricultural production areas are located in the Zones 1, 2 and 3.

62 <location of Figure 1>

63 **FIGURE 1** Agricultural stability zones in Syria; *source: Szőnyi et al. (2005)*

64 Zone 1 is the most favourable for rainfed farming with annual rainfall of more than 600 mm
65 in Zone 1a and 350-600 mm in Zone 1b. Rainfall in Zone 2 and Zone 3 is between 250-350
66 mm. Zone 4 is suitable for barley, which is mainly used as animal feed (Breisinger *et al.*,
67 2011). Zone 5 is not suitable for rainfed cropping and used only for grazing. This area is very
68 sparsely vegetated (Figure 2) due to low amount of rainfall and marginally used for
69 agricultural production (Ahmed *et al.*, 2010).

70 <location of Figure 2>

71 **FIGURE 2** Main agricultural zones in Syria; *source: Celis et al. (2007)*

72 85% of the rainfed area belongs to Zone 1 and 2 (Yigezu *et al.*, 2013). Figure 3 demonstrates
73 the importance of these two zones in terms of contribution to total national wheat production.

74 <location of Figure 3>

75 **FIGURE 3** Rainfed wheat production (Mg/yr) in different zones of Syria; *source: NAPC*
76 *(2010)*

77 High inter-annual variation of rainfall is the main risk source for agricultural producers in
78 Syria. Droughts in the years 1999, 2007 and 2008 were reported to be the worst in recent
79 history. The average country level yields of wheat, barley, lentil and chickpea reduced by 78.9
80 % in the rainfed areas due to drought in the 2007/08 season (UN, 2008 compare Figure 3).
81 The eastern parts of Syria were most severely impacted and grain yields were almost zero
82 (UN, 2008). In total, more than 150,000 households in Syria (around 750,000 people) faced a
83 complete harvest loss. Small-scale farmers are often the people worst effected and droughts
84 have spill-over effects in the subsequent cropping season when these farmers lack the
85 financial means to buy seeds and other inputs (Wattenbach, 2006). The share of agricultural
86 income in the total household income is reported to be as high as 52% in some regions of
87 Syria (Rovere *et al.*, 2006). More than 50% of the household income is spent on food
88 expenses which makes the access to food very difficult during drought years when
89 agricultural income drops (Breisinger *et al.*, 2011). Traditional risk management options such
90 as crop diversification and community based loans often fail due to severity of the drought.
91 The government provided disaster relief measures in a form of loans and food rations but the
92 need for assistance was beyond the capacity and resources of the government (UN, 2008).
93 Improved irrigation options (e.g. sprinkler) have been shown as the best technical solution to

94 cope with increasing sequence of droughts and depleting stock of groundwater in Syria
95 (Oweis *et al.*, 2011; Yigezu *et al.*, 2013). However, implementation of such novel
96 technologies remains limited due to a lack of credit for such new initiatives (De Corte *et al.*,
97 2007).

98 The studies conducted in the region project an increase in temperature (see Figure 4) and
99 higher rainfall variability in the future (e.g. Oweis *et al.*, 2011). The same study simulates
100 wheat yields under projected climate change scenarios and predicts higher inter-annual
101 variability of yields in the future than currently observed.

102 <location of Figure 4>

103 **FIGURE 4** Linear trends of ‘present’ (black) and future (grey) average annual temperature²
104 estimated by the bias-corrected ENEA model output for Aleppo region (36.04 °N 37.10 °E);
105 *Source: adapted from Oweis et al. (2011)*

106 Thus, available studies already indicate even higher yield volatilities in the future which may
107 increase the vulnerability of rural populations further. Therefore, new policies for improving
108 the risk coping potential are needed and several studies discuss the need for insurance
109 programs to protect capital losses of poor populations and improve productivity in a
110 sustainable way in Syria (Huff, 2004; Wattenbach, 2006; Breisinger *et al.*, 2011).

111 **3. The role of index-based insurance to foster rural development**

112 Traditional insurances have been shown to be very ineffective in developing countries, while
113 on the other hand index-based insurances were recommended as a suitable risk management
114 instrument (Hess *et al.*, 2002; Glauber, 2004). Farmers receive indemnity when the specified
115 index falls below (or above) a certain value. Most index insurances are based on weather
116 indexes, which are highly correlated to local yields. Index insurances³ address factors beyond
117 farmers’ control. This helps to eliminate the problems of moral hazard and adverse selection.
118 It also decreases the costs for insurance companies by reducing the need for field visits (Bryla
119 and Syroka, 2007).

120 Studies from developing countries with similar conditions to Syria discuss several positive
121 contributions of index-based insurances on the development of the rural areas (Roberts, 2005;
122 Barnett and Mahul, 2007; Chantarat *et al.*, 2008; Skees, 2008; Hazell and Hess, 2010; Mahul

² Average temperature in the graph is estimated as $T_{avg} = (T_{max} + T_{min})/2$

³ Index-based insurance and index insurance terminologies are used interchangeably with the same meaning

123 and Stutley, 2010; Nieto *et al.*, 2010; Miranda and Farrin, 2012). There is a lack of sufficient
124 financial resources to invest in technological improvement at the farm level as well as at the
125 agricultural sector level in many developing countries such as Syria. Risk-averse farmers in
126 general prefer to spend less on agro-inputs, such as fertilizers or improved seed varieties when
127 confidence about the returns of such investments is low (Barnett *et al.*, 2007). Agricultural
128 insurances against yield loss allow risk to be transferred to agricultural insurance markets and
129 thus increase the confidence of farmers and facilitate their investment in agricultural
130 production in general (Bryla and Syroka, 2007). Enabling the access of poor households to
131 credits is another potential contribution of insurance of rural development (Roberts, 2005).
132 Poor farmers prone to climate risks often have lower chances of lending since banks are
133 concerned about the inability to repay loans (Hazell and Hess, 2010). Credit institutes are
134 more willing to provide agricultural credits to rural households and farmers that have index
135 insurance since producers could use indemnity payments as credit collateral (Skees, 2008).
136 Therefore, index-based insurance offer not only benefits of farmers but also supports the state
137 objective of maintaining grain self-sufficiency in Syria.

138 Chantararat *et al.* (2008) and Hellmuth *et al.* (2009) revealed that insurance programs
139 established according to rainfall based drought indexes have a very high correlation with food
140 assistance in developing countries. Therefore, proper design of agricultural insurance
141 programs could improve food security under conditions of systemic droughts (Chantararat *et*
142 *al.*, 2008). In this respect, index insurances can be considered as one of the social protection
143 systems to cope with climate risks (Siddiqi, 2011). Therefore, agricultural insurance in
144 developing countries may have a positive influence on agricultural production beyond merely
145 securing farmers' profits (Hazell and Hess, 2010). This type of policy is very necessary in
146 Syria where high volatility of agricultural income is causing serious challenges for
147 development in rural areas.

148 **4. Methodology**

149 ***4.1. Estimation of risk premiums and indemnity payments***

150 Finding the most influential hydro-metrological indexes is a prerequisite for developing
151 weather derivatives for a region or a country. The hedging (risk minimization) potential of the
152 index-insurance is higher when stochastic dependency between the weather index and farm
153 income is high. Usually these indexes are rainfall and temperature based, and therefore often

154 referred to as weather derivatives. They often take the form of option contracts (Berg and
155 Schmitz, 2008), where payoff in case of long put option are expressed as:

$$156 \quad A = V \text{Max}[0, (K - x)] \quad (1)$$

157 where the farmer receives payment equal to the difference (K-x) multiplied by the tick size
158 (V) if the index (x) falls below the strike level (K). The fair premium (P_f) can be estimated by
159 multiplying the expected value of the payoff (E(A)) by the discount factor (e^{-rd}) and can be
160 written as:

$$161 \quad P_f = e^{-rd} E(A) = e^{-rd} V E(\text{Max}[0, (K - x)]) \quad (2)$$

162 where r is the interest rate over the duration d.

163 Equation 2 can be estimated according to the burn analysis (Odening *et al.*, 2007) as:

$$164 \quad P_f = e^{-rd} \left[\frac{1}{n} \sum_{t=1}^n A_t \right] \quad (3)$$

165 Establishment of index insurance product and identification of the fair premium demands
166 three main steps: collecting long term yield and weather data; identifying the index value and
167 payoffs for each year; and calculating an average payoff and discounting with the risk free
168 interest rate (Odening *et al.*, 2007).

169 Total net revenue per hectare under conditions of purchasing the index-based insurance
170 contract can be estimated as:

$$171 \quad W_p = yp_y + V \text{Max}[0, (K - x)] - P_f \quad (4)$$

172 Identifying the index highly correlated with yields is the most important step in designing the
173 index-based insurances and following chapter presents Syria as case the study for selecting
174 suitable indexes.

175 **4.2. Insurance index design**

176 We examine the risk minimization potential of index-based insurance in the case of winter
177 wheat production in northern Syria due to its importance in food security. Winter wheat, as
178 well as all other major winter crops in northern Syria, is mainly cropped under rainfed

179 conditions. Winter wheat is usually planted in November-December at the onset of the
180 (winter) rainy season and harvested by the end of May, beginning of June. Data for the main
181 wheat producing zones at the regional level according to stability zones was obtained from
182 National Agricultural Policy Center (NAPC) of Syria for the years of 1985-2007 (NAPC,
183 2010).

184 Farm yield data was also was obtained for the research station of the International Center for
185 Agricultural Research in the Dry Areas (ICARDA) located 30 km south of the city of Aleppo
186 in northern Syria. Daily climate data was also available from the ICARDA weather station
187 (*lat* 36°01'N, *long* 36°56'E; elevation: 284 m, Figure 5).

188 We considered the suitability of three different index design approaches to the conditions of
189 northern Syria: (1) statistical approach, (2) agro-metrological and (3) remote sensing based
190 indexes.

191 In the statistical approach, single weather station data from the ICARDA climate station is
192 used together with the district level yield data for Aleppo region Zone 2. Several functional
193 forms used by Vedenov and Barnett (2004) are tested after de-trending the yield data by
194 fitting a log-linear trend model. The dependency of wheat yields from cumulative rainfall,
195 monthly temperature and rainfall were tested. The following statistical function yielded the
196 best fit to de-trended yield data (Y_{det}) for the given district:

$$197 \quad Y_{det} = \beta_0 + \beta_1 R_{mar} + \beta_2 R_{may} + \beta_3 T_{may} + \beta_4 R_{apr}^2 + \beta_5 R_{may}^2 + \beta_6 T_{apr}^2 + \beta_7 T_{may}^2 + \\ 198 \quad \beta_8 R_{may} T_{may} + \varepsilon \quad (5)$$

199 where, R_{mar} , R_{apr} , R_{may} are monthly rainfall for March, April and May, T_{apr} , T_{may} are
200 monthly average temperatures for April and May.

201 The latest development in the field of index insurance is to use agronomically sound
202 meteorological indexes which do not necessarily require yield records in the insurance design.
203 Yet, the risk coping potential can be tested when yield data is available. Several agro-
204 meteorological indexes have been tested in the past that range from simple rainfall indexes
205 (Odening *et al.*, 2007; Breustedt *et al.*, 2008) to very complex crop model based indexes
206 (Deng *et al.*, 2008; Bobojonov and Sommer, 2011). We considered a rainfall deficit index but
207 with some modifications to improve the joint dependency of index and yield. A simple
208 rainfall index was presented by Odening *et al.* (2007) as:

209 $I^{RD} = \sum_{\tau=1}^n \min(0, \sum_{t=(\tau-1)+s+1}^{\tau+s} R_t - R^{min})$ (6)

210 Usually, the value of R^{min} is set to maximize the correlation between index value and observed
 211 yields. However, we introduced some modification to the index to account for inter-seasonal
 212 and inter-annual variations for water demand in semiarid environments. We use weekly crop
 213 Evapotranspiration ($ET_{c\tau}$) instead of R^{min} . The above equation then reads as:

214 $I^{RD} = \sum_{\tau=1}^n \min(0, \sum_{t=(\tau-1)+s+1}^{\tau+s} R_t - ET_{c\tau})$ (7)

215 The rainfall deficit index is estimated for whole vegetation period (November-June months)
 216 where ($ET_{c\tau}$) is estimated using the CropSyst crop simulation model (Stockle *et al.*, 2003).
 217 The rainfall deficit index was then estimated from the station data and correlated with the case
 218 study farm yields.

219 With regard to the remote sensing based insurance index, we relied on the Normalized
 220 Difference Vegetation Index (NDVI). The NDVI is a measure of greenness density of the
 221 vegetation. The greenness itself is related to total biomass and thus to a large extent also to
 222 grain yield. NDVI data range between 0 and 1. Low vegetation biomass yields an NDVI close
 223 to zero, and high biomass close to one. NDVI has been used to estimate grain yields
 224 (Rasmussen, 1997), and, for instance, recently in the case of livestock-insurances (World
 225 Bank, 2005; Chantararat *et al.*, 2013). However, thus far limited empirical literature analyses
 226 the application for crop production related insurances. MODIS NDVI based index could be
 227 constructed for regional or farm levels at the absence of weather and yield data (Bobojonov
 228 and Sommer, 2011).

229 For the years 2001-2010, 250 meter spatial and 16 days temporal resolution MODIS NDVI
 230 data were obtained. Only March, April and May data were considered in the analysis since
 231 these are the critical crop growth periods of rainfed winter crops in Syria. We tested the
 232 suitability of an NDVI-based insurance to minimize volatility of revenue on farm level based
 233 on the yield data obtained from the ICARDA research farm, hereafter used as the case study
 234 farm (Figure 5).

235 <location of Figure 5>

236 **FIGURE 5** 250 meter resolution MODIS NDVI data for the case study farm for April 2006

237 Cumulative value from 127 grids (index l) covering the case study farm during March, April
238 and month (index k) were used as the insurance index (I^{NDVI}):

$$239 \quad I^{NDVI} = \sum_l^{127} \sum_k^m NDVI_{lk} \quad (8)$$

240 **5. Results and discussion**

241 **5.1. Statistical approach**

242 Estimated parameters of the Equation 5 are given in Table 1. Insurance payoff, fair premium
243 and expected revenue with index insurance option were calculated according to the equations
244 1, 3 and 4 presented above.

245 **TABLE 1** Estimated parameters of quadratic production function for wheat in Aleppo region,
246 Zone 2

247 < location of Table 1 >

248 The mean revenue estimated from 23 years of historical yield data was equal to 29,900 Syrian
249 Pounds (SP) per hectare equivalent to 636 USD ha⁻¹ yr⁻¹. The tick size was set to 31,700
250 Syrian Pounds (SP) and the fair premium estimated with burn analysis was equal to 6,400 SP
251 ha⁻¹. A correlation coefficient equal to 0.72 may seem low in the estimations, and further
252 improvement could be achieved when considering rainfall and temperature data from a
253 network of stations instead of the single station data. Nevertheless, other studies have
254 demonstrated that a considerable risk reduction could already be achieved if the correlation
255 between the index and yields was higher than 0.5 (Berg and Schmitz, 2008). This potential
256 gain can be also noted when looking at the reduction of the standard deviation of the revenue
257 from 12,700 SP to 9,200 SP when an insurance option is considered (Table 2).

258 **TABLE 2** Per hectare revenues in Syrian Pounds with and without insurance options

259 <location of Table 2>

260 <location of Figure 6>

261 **FIGURE 6** Empirical cumulative distribution function with and without insurance

262 It can be seen from the Figure 6 that farmers purchasing an index insurance (gray line) have
263 the opportunity of reducing the probability of having lower revenue compared to farmers who
264 are not insured. Purchasing an insurance would guarantee a minimum revenue of 15,00 SP/ha

265 (Table 2). This guaranteed level of revenue would be very helpful for farmers by allowing for
266 a budget to buy seeds and other inputs for the coming years. This type of securitization would
267 have been very useful in 2000 and 2008 when most of the land stayed uncultivated due to lack
268 of financial resources in response to the disastrous previous years (UN, 2008). This points to
269 the ex-ante effects of having insurance that farmers feel their livelihood is less at risk and
270 “feel” protected by weather insurance. As a consequence they may become more comfortable
271 investing the right amount of money and time to optimize yield outcomes rather than
272 minimize risk.

273 Certainly, purchasing an insurance contract comes at certain price which reduces the
274 maximum revenue presented in Table 2. Consequently, revenues with insurance will be lower
275 than revenues without insurance when climate conditions are very favourable. The additional
276 costs associated with payments to the insurance company were equal to 21 percent of the
277 mean revenue or 11 percent of the maximum revenue. This might seem high for Syrian
278 farmers, and is related to the estimation of fair premium based on the burn analysis and
279 limited number of observed years. Further investigations on index-insurance pricing with
280 alternative pricing methods involving regional diversification might be required.

281 Further, the analysis of the risk coping potential of an index insurance based on district level
282 yield data, as considered in this section, has several other shortcomings. Risk exposure at
283 farm level may differ depending on the farm type and agro-ecological diversity (e.g. soil type)
284 and distance to the weather station. However, previous studies demonstrated that index
285 insurance designed with aggregated level data still leads to notable risk reduction at the farm
286 level (Heimfarth *et al.*, 2012).

287 **5.2. Rainfall deficit index**

288 The mean and standard deviation of rainfall deficit index estimated according to the Equation
289 7 was equal to 720 and 81.8 millimetres, respectively. The minimum value of the index was
290 597.6 and the maximum 887.8 millimetres. The tick size was set to 350 SP and the estimated
291 risk premium with this tick size equals 10,900 SP, which is equal to 14.6 % of the average
292 revenue. The risk minimization potential of this index could be tested with the farm level data
293 for the years 2000-2010. The correlation between the rainfall deficit index and yield was
294 equal to -0.85, which indicates a good potential of this index for risk minimization. The
295 negative sign of the correlation coefficient indicated that a larger value of the rainfall deficit
296 reduces farm yields.

297 <location of Figure 7>

298 **FIGURE 7** Revenue losses and insurance payments according to the agronomic index

299 The black column presents revenue shortfalls from the mean revenue for the period 2001-
300 2010. The grey columns present insurance payments according to the agro-metrological
301 index. It can be noticed from Figure 7 that the insurance scheme designed according to the
302 rainfall deficit index performed very well covering revenue losses except for the year 2009.

303 **5.3. NDVI based insurance**

304 The mean and standard deviation of cumulative NDVI index for the months March, April and
305 May from 127 grids was equal to 297.6 and 33.9, respectively. The correlation between the
306 index and farm yields was equal to 0.79. This tick size was set to 850 SP which gives an
307 insurance premium of 10,400 SP; 13.9 % of the mean revenue.

308 <location of Figure 8>

309 **FIGURE 8** Revenues losses and insurance payments according to NDVI

310 Similarly to rainfall deficit index, NDVI based index showed very good potential to provide
311 insurance against observed yield losses (Figure 8). However, both, the rainfall deficit index
312 and the NDVI based index, did not trigger payments in 2009. Other factors, such as late frost
313 or hail storms (destroying crop leaves) might have occurred in the case study farm in the year
314 2009, since rainfall was favourable and the NDVI also revealed good biomass in the fields.
315 An index-based insurance does not capture such risks as well as idiosyncratic risks i.e.
316 damage caused by farmers themselves (Miranda and Farrin, 2012). Risk associated with
317 harvest delays, broken machinery or failure in management decisions is not covered by index
318 insurance products. Therefore, index-based insurance cannot be considered as solution for all
319 problems but rather an inexpensive tool to hedge weather related risk only.

320 The results provide evidence that all three indexes could contribute to risk minimization at
321 regional as well as at farm level. Selection of one or another index will depend on the
322 experience of the insurance provider and also the perception of the farmers about these
323 products, which shapes their wiliness to pay for such a product (Patt *et al.*, 2010).

324 **5.4. Systemic risk in Syria**

325 The price of the index insurance product could be reduced when risk diversification options
326 are available. The correlation of the yields in different regions of Syria was analysed in order
327 to see the feasibility of pooling systemic risk in different regions by private or state insurance
328 companies. In the analyses, only regions situated in Zone 1 and 2 were considered as these
329 regions produce more than 95% of the wheat in Syria.

330 The yield correlation between the regions located far from each other is very low and even
331 negative in some exceptional cases (see Appendix). For example, the yield correlation
332 between Al-Hassakeh regions (for both Zone 1 and 2) located in the North-East and Dara
333 regions (Zone 1 and 2) located in South-East is lower than 0.3. This is also the case for many
334 other regions located far from each other. In contrast correlation of yields between the region
335 such as Homs regions (Zone 1 and 2) and Hama regions (Zone 1 and 2), located very close to
336 each other, is higher than 0.56. The correlation is low when the agricultural districts are
337 located in different agro-ecological zones, such as Al-Ghab Zone 1 and Al-Sweida Zone 2
338 where yields do not correlate at all. These results differ from findings elsewhere (e.g.
339 Germany) where stochastic dependency between the regions are usually high (Xu *et al.*,
340 2010). The low correlation found in our study could also be due to agronomic reasons and
341 diversity of climate and soil conditions and heterogeneous farming systems in Syria (see
342 Figure 1 and 2).

343 Low correlation of yields between some regions and low yields in both regions from time to
344 time indicates that the yield failures in these regions are almost independent from each other.
345 This presents a good opportunity for insurance companies cover the indemnity claims in one
346 region through the collection of premiums in another region during the same period of time.
347 Therefore, different agro-ecological zones and soil conditions in Syria could be one of the
348 positive factors can make insurance prices more affordable. The risk pooling possibility
349 explored with correlations, could be further improved with the usage of more powerful tools
350 such as copula methods (Vedenov, 2008; Xu *et al.*, 2010).

351 **6. Opportunities for establishing an insurance market in Syria**

352 The absence of agricultural insurance companies in Syria could be one of the main challenges
353 of introducing index-based insurance. Farmers and households might be unaware of the
354 usefulness of the index-insurance products to cope with climate risks. However, there are
355 several aspects which may facilitate the introduction and implementation of insurance

356 programs in Syria. First, the Syrian government has been supporting drought affected farmers
357 through different aid programs. The Syrian Agricultural Cooperative Bank has provided
358 interest free credits during the agricultural seasons 1999/2000 and 2001/2002 due to serious
359 drought problems (NAPC, 2006). The state has also distributed seed and food aid to drought
360 affected rural families (UN, 2008). Availability of state funds for drought management and
361 existence of such service providers initiated by the state already gives a sign about the
362 possibility of materializing the recommendations of this paper on establishing index insurance
363 market in Syria. Furthermore, the government funds for *ad hoc* disaster payments could be
364 more efficiently utilized when spent on establishing insurance markets (Hazell and Hess,
365 2010). Another endorsing environment for the fast dissemination of insurance market is the
366 existence of several microfinance agencies established with the help of international and
367 public funds (CGAP, 2008). The positive attitude of rural households towards such financial
368 schemes and a good understanding of the risk sharing mechanisms constitutes a favourable
369 environment for acceptance of risk transfer instruments.

370 Identifying agents, who could sell index insurance contracts, is another challenge in the initial
371 phases of a market establishment. Patt *et al.* (2009) showed that trust of farmers in
372 organizations providing insurance services is one of the most important determinants of
373 insurance demand in developing countries. Experience from developing countries shows that
374 agricultural banks have strong motivation to take the leading role of insurance agent due to
375 their interest in safeguarding their loans (Roberts, 2005). Ministry of Agriculture and
376 Agrarian Reform officials recommended that the Agricultural Cooperative Bank introduce an
377 agricultural insurance program in the interview conducted by Huff (2004). The Agricultural
378 Cooperative Bank of Syria could take a pioneer role in establishing such markets and it
379 already has experience with adjusting its services under conditions of systemic droughts
380 (NAPC, 2005). Furthermore, the experience of international development and research
381 agencies in working with farmers and building acceptance among farmers could be effectively
382 used in insurance design and implementation process. For example, ICARDA has also
383 become one of the well-known research and development agencies in Syria. Farmers and
384 policy makers may have trust in such international agencies as identified in the analysis of
385 stakeholders opinion regarding barley fertilization programs (Ahmed *et al.*, 2010).

386 Mobile phone providers could be considered another alternative information dissemination
387 source to announce insurance products. IFAD and WFP (2010) showed several examples
388 where mobile phone providers became an important source for improving the risk

389 management capacity of farmers in many developing countries. The social enterprise
390 *MicroEnsure* is already using mobile providers to promote life insurance and reach millions
391 of people in Tanzania and Ghana (MicroEnsure, 2013). Similarly, mobile phone companies
392 could play an important role in disseminating information and collecting insurance premiums
393 in cooperation with Agricultural Cooperative Bank of Syria. However, further research in
394 identifying the trust of people in the abovementioned companies needs to be investigated as it
395 is conducted in Africa and South America by Patt *et al.* (2009).

396 The current political conflict in Syria and in the whole region creates very large constraints
397 for establishing such services. In fact, developing an agricultural support system is urgently
398 needed in order to mitigate the impact of the extremely volatile production observed for
399 instance in the neighbouring Gaza Strip (Mason *et al.*, 2011). In this respect, strong support
400 from international development organizations is required to rebuild agricultural systems in
401 Syria and make it more productive and climate resilient when security circumstances allow
402 for such establishments.

403 **7. Conclusions**

404 The study investigated the suitability of three different insurance indexes for income
405 securitization at district as well as farm levels. The analyses show that risk associated with
406 drought could be effectively reduced when purchasing index-based insurances. Especially, the
407 agro-meteorological and NDVI based alternative indexes have a very good potential to be
408 implemented under limited data conditions. These novel indexes considered for the conditions
409 of Syria could be potentially used for other countries with similar agro-ecological
410 environments.

411 The analysis of yields dependencies between different regions of Syria revealed low
412 correlation between the regions. That may provide a unique opportunity of pooling systemic
413 risk between different regions and providing insurance with affordable prices. Establishing
414 insurance markets will not only help farmers reduce income risks, but also support
415 productivity improvements. Farmers will have a guaranteed income even under drought
416 conditions, which allows them to purchase inputs in the following growing seasons and thus
417 reduce spillover effects of droughts. Adoption of risk management tools by farmers may
418 significantly contribute to maintaining food security at national as well as at household levels
419 in Syria. Existence of efficient insurance markets could help smooth consumption and attract

420 more investment in agriculture. Therefore, an index insurance has positive effects beyond
421 merely securing farmers' income.

422 Lack of insurance companies and current political uncertainty are the main challenges
423 hindering the establishment of index insurance markets in Syria. However, there are also
424 some positive signals that may create a favourable institutional environment for launching
425 index insurance projects in the country. Availability of the state funds for disaster aids and
426 the positive perceptions of rural households about the risk sharing schemes could be useful to
427 support an insurance culture and therefore insurance uptake.

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542 **Tables**

543 **TABLE 1**

544

	Coef.	T	P> t
R_{mar}	0.0061	2.41	0.030
R_{may}	0.2627	2.95	0.011
T_{may}	6.8863	2.60	0.021
R^2_{apr}	-0.0001	-2.97	0.010
R^2_{may}	-0.0006	-3.29	0.005
T^2_{apr}	-0.0043	-2.37	0.033
T^2_{may}	-0.1569	-2.53	0.024

$R_{\text{may}}T_{\text{may}}$	-0.0096	-2.50	0.026
cons	-73.7747	-2.61	0.021
R^2	0.72		
adjusted R^2	0.56		

545

546 **TABLE 2**

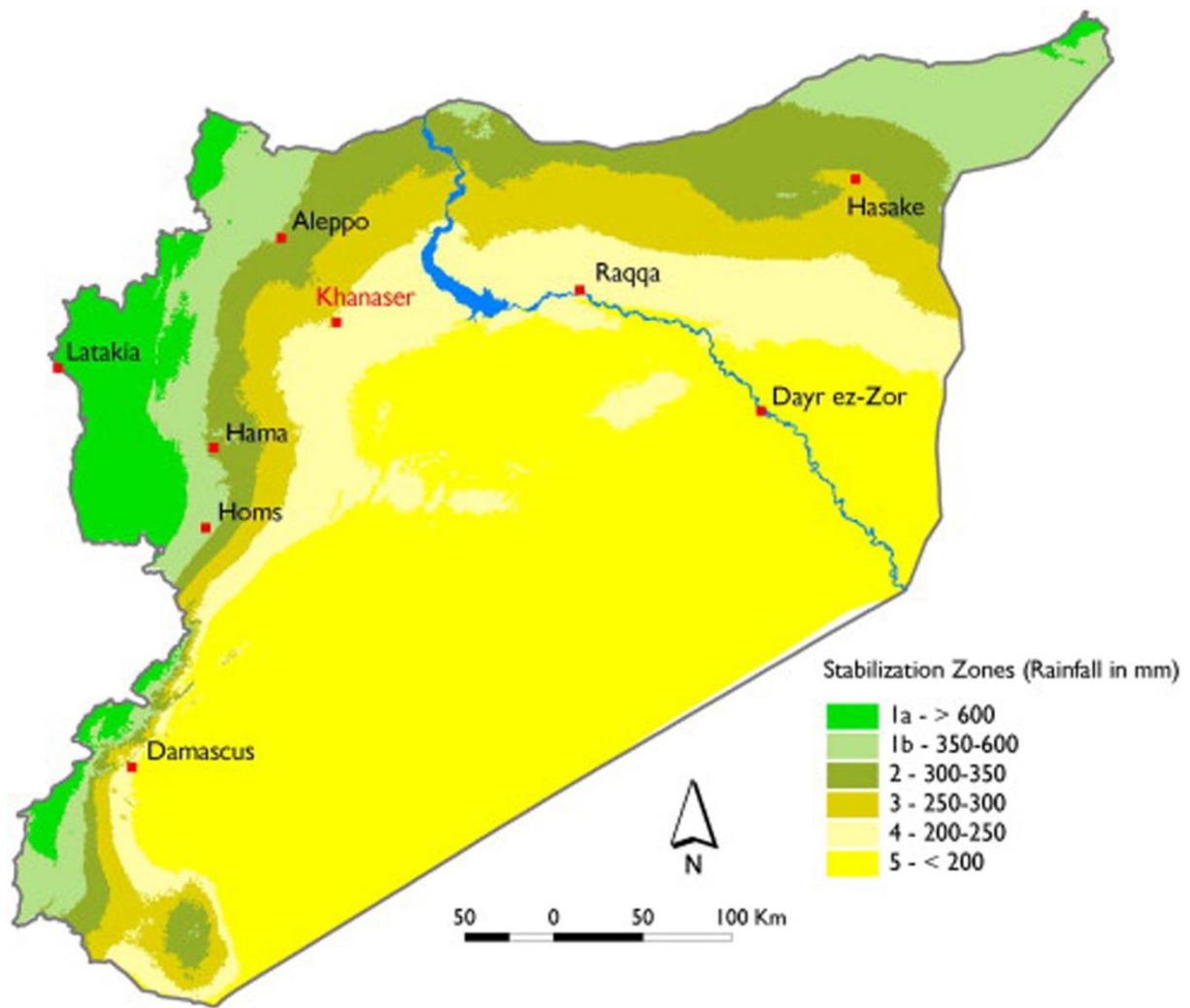
547

	without insurance	with insurance
mean	29891,3	29891,3
stdev	12665,6	9227,1
min	9000	15083,5
max	57000	50583,5

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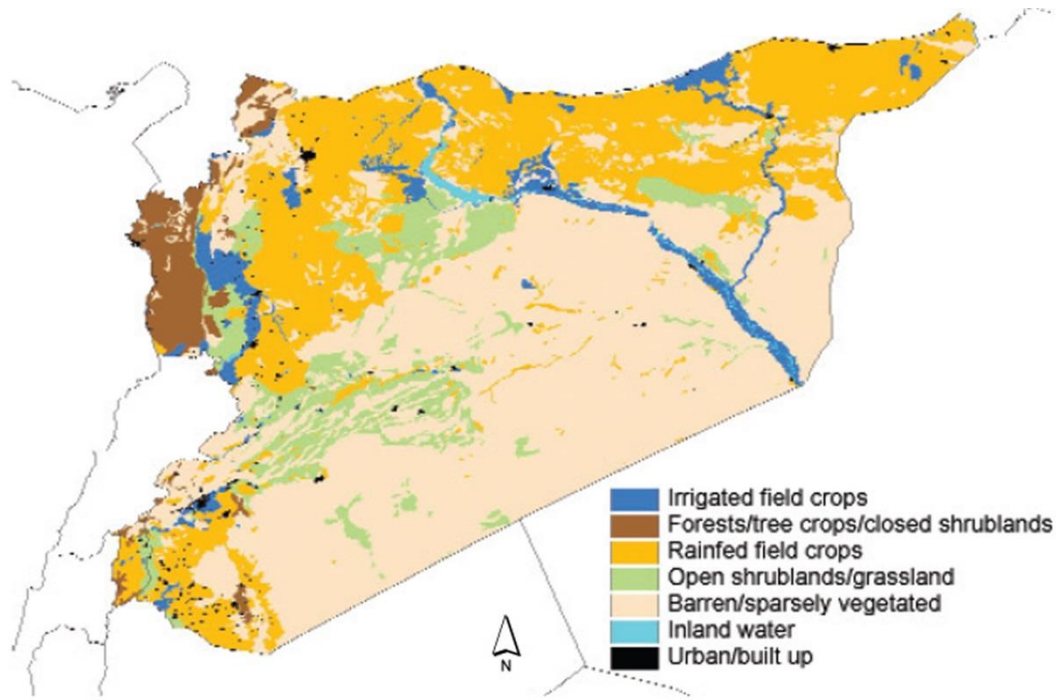
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551 **Figure 1**

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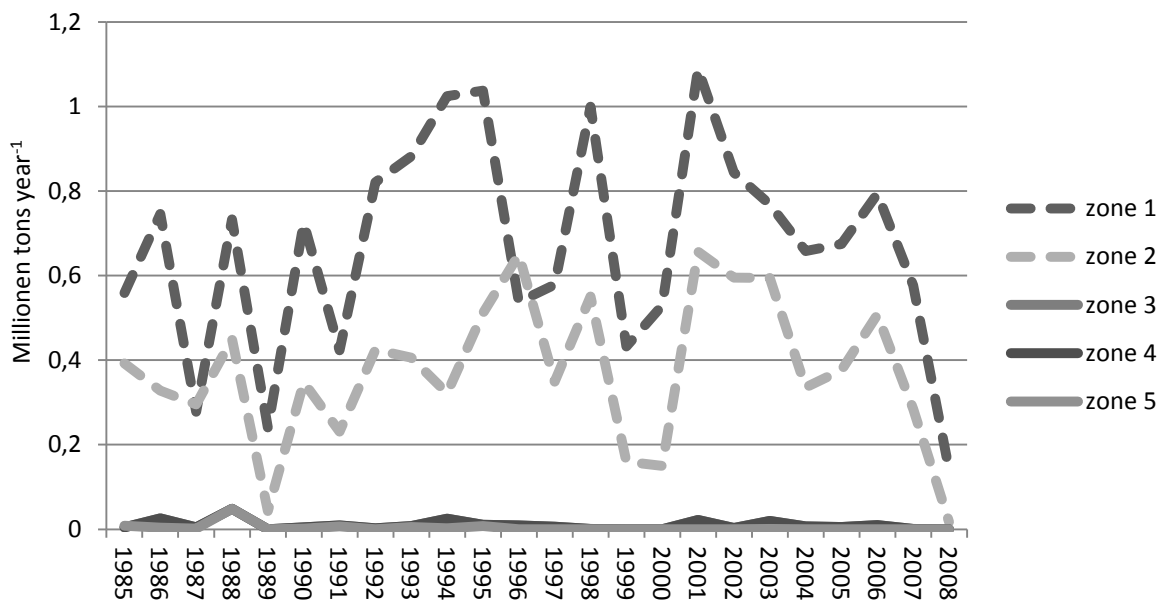


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555 **Figure 2**

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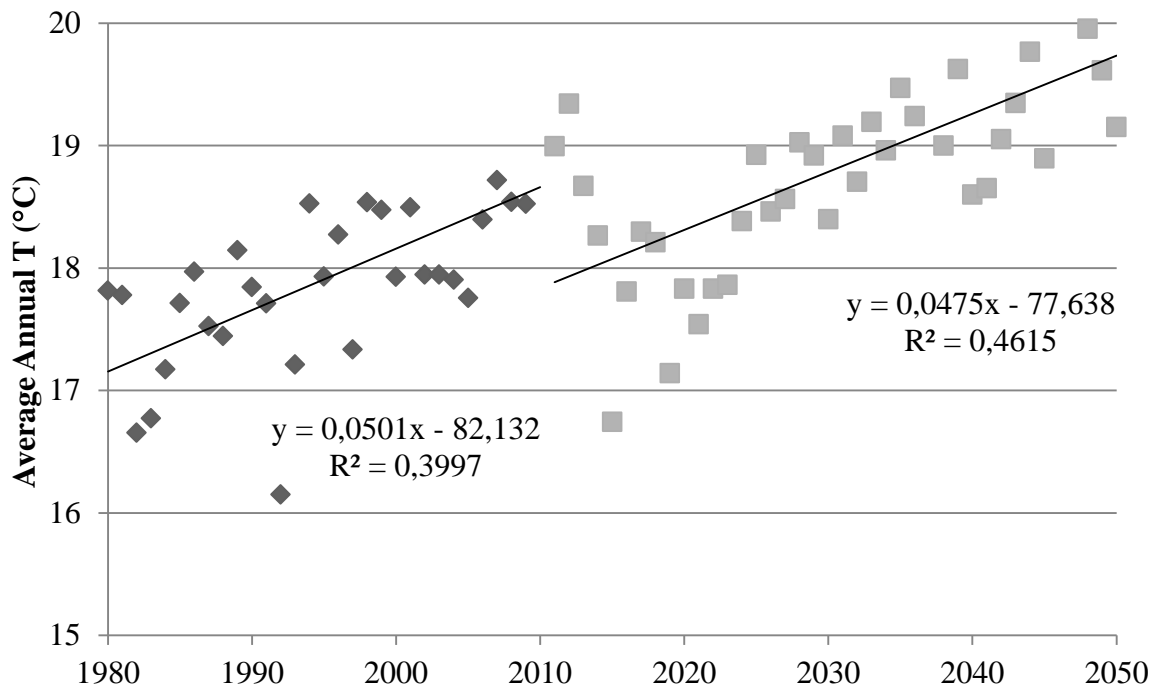
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559 **Figure 3**

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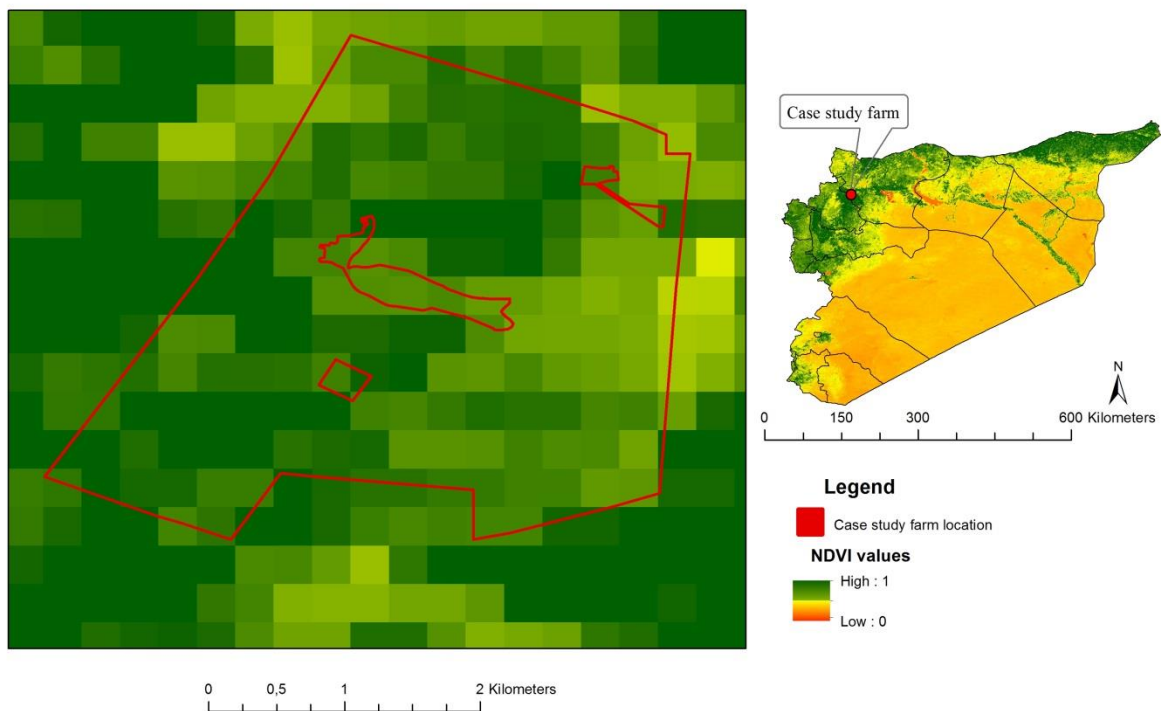
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564 **Figure 4**

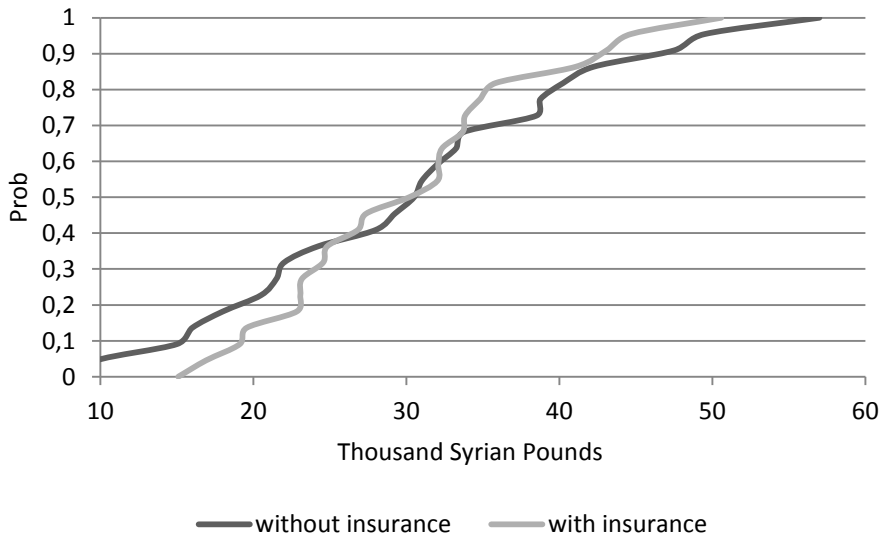
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567 **Figure 5**

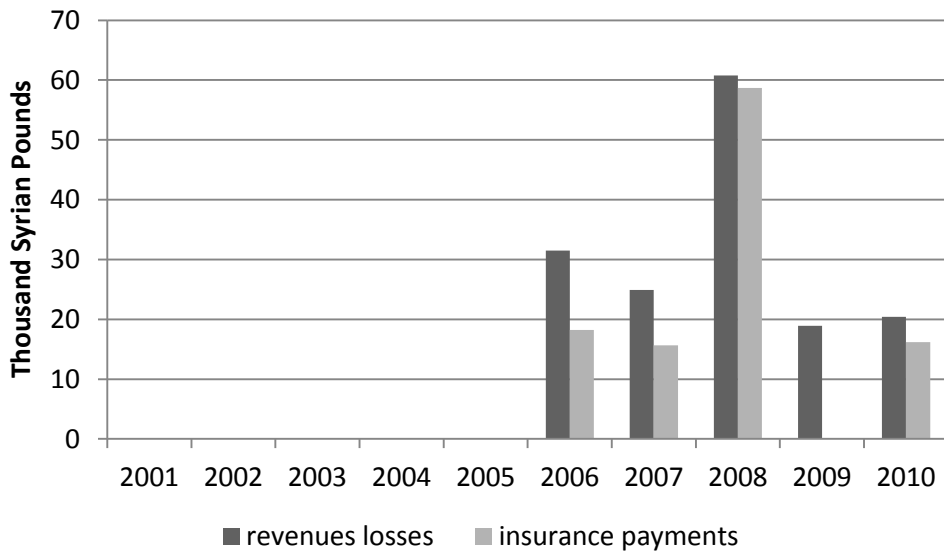
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570 **Figure 6**

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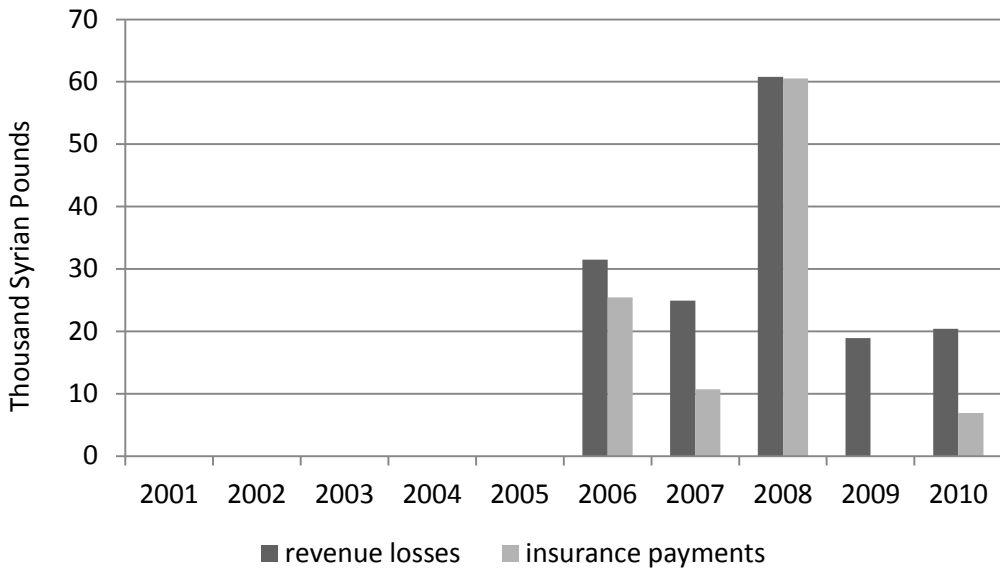


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573 **Figure 7**

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577 **Figure 8**

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APPENDIX

Correlation matrix of yields in main grain producing zones of Syria

	Al-Ghab 1	Al-Hassakeh 1	Al-Hassakeh 2	Al-Sweida 1	Al-Sweida 2	Aleppo 1	Aleppo 2	Dar'a 1	Dar'a 2	Hama 1	Hama 2	Homs 1	Homs 2	Idleb 1	Idleb 2
Al-Ghab 1	1	0,37	0,23	0,12	0,00	0,58	0,60	0,30	0,13	0,85	0,70	0,59	0,52	0,58	0,49
Al-Hassakeh 1		1	0,81	0,39	0,31	0,41	0,63	0,26	0,20	0,44	0,46	0,18	0,30	0,28	0,32
Al-Hassakeh 2			1	0,34	0,25	0,34	0,63	0,30	0,24	0,45	0,57	0,29	0,42	0,31	0,36
Al-Sweida 1				1	0,90	0,21	0,34	0,69	0,76	0,23	0,23	0,23	0,32	0,03	0,04
Al-Sweida 2					1	0,20	0,33	0,56	0,66	0,17	0,14	0,17	0,25	-0,07	-0,06
Aleppo 1						1	0,82	0,58	0,20	0,62	0,62	0,69	0,49	0,77	0,59
Aleppo 2							1	0,52	0,21	0,78	0,69	0,57	0,47	0,64	0,52
Dar'a 1								1	0,70	0,29	0,24	0,52	0,36	0,34	0,23
Dar'a 2									1	0,15	0,10	0,22	0,25	-0,01	0,02
Hama 1										1	0,87	0,56	0,61	0,66	0,62
Hama 2											1	0,62	0,73	0,65	0,67
Homs 1												1	0,81	0,53	0,29
Homs 2													1	0,45	0,38
Idleb 1														1	0,81
Idleb 2															1