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The Story of the Moment: Risk Averse Cypriot Farmers Respond to Drought Management

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Abstract

This paper illustrates the importance of estimating risk preferences when evaluating water policy. Using agricultural production data from the Kiti region of Cyprus we estimate farmers' risk preferences à la Antle (1983, 1987) and show sensitivity to higher order moments of profit, such as skewness. We show that farmers in the Kiti region are risk averse with risk premiums in the region of 20% of expected profit. We use these estimates to analyse the impact of a water quota from the perspective of three policy-makers who differ only in their understanding of farmers' risk preferences. We show in the case of Kiti that policy-makers who model risk preferences incorrectly, that is, either; a) assume risk neutrality or; b) ignore down-side risk, wrongly predict the magnitude and direction of input responses and therefore the magnitude of welfare changes. This highlights the importance of accommodating preferences for higher order moments of profit in the evaluation of water policy.

Keywords: *stochastic agricultural production, risk attitudes, conservation policy, moments-based estimation.*

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The Story of the Moment:

Risk Averse Cypriot Farmers Respond to Drought Management

1. Introduction

In recent years much attention has been paid to the analysis of farmers' responses to water conservation policies (e.g. Moore et al., 1994; Schaible, 1997; Iglesias et al., 2003). Naturally, irrigated agriculture has been the focus of much of this analysis due to the common perception of this sector as both 'originator and victim' of drought (Grigg, 1996, Iglesias et al., 2003). Several key dimensions of farmer responses to water conservation policies, such as water pricing or quantitative restrictions, have been studied empirically. For instance, the price elasticity of demand for irrigation water (e.g., Nieswiadomy, 1988); the effect of water price on irrigation development and irrigation technology choice, (e.g., Koundouri et al., 2005); the effect of water restrictions and pricing on crop-choice, land allocation, and crop specific water demand (e.g., Moore et al., 1994, Moore and Negri, 1992). More recently, Schaible (1997) analysed farmers' responses to water conservation policies where groundwater is available as a substitute, while Keplinger et al. (1998) focus on quantitative restrictions on groundwater use. Furthermore, using a dynamic simulation, Iglesias et al. (2003) show that prudent surface water allocations during non-drought years can limit the negative impacts of water quantity restrictions upon farmers during periods of drought.

Despite this burgeoning literature, one dimension of farmers' responses that is frequently overlooked in the evaluation of water conservation policies is farmers' preference for risk. This is likely to be a serious omission since, not only is uncertainty almost ubiquitous for farmers, e.g. due to climatic variability and the prospect of drought, but production theory and empirical evidence shows clearly that farmers' preferences for risk are of considerable moment in determining their production decisions (e.g. Leathers and Quiggin 1991, Wik et al. 2004, Miyata 2003). Hence, to a large extent, risk preferences will determine responses to, and the welfare impacts of, water conservation policiesⁱ.

Unfortunately, the empirical problems associated with incorporating risk in production analysis are numerous. Early empirical studies made implicit, if not explicit assumptions regarding the effect of inputs on production riskⁱⁱ. The multiplicative stochastic specifications

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4 employed disallowed inputs that marginally reduce risk. Such models are clearly at odds with
5 the risk-reducing nature of some inputs and the observation that risk averse farmers configure
6 their inputs to hedge against production risk in line with their risk preferences. As an initial
7 response, Just and Pope (1978, 1979) (JP) proposed a more general stochastic specification
8 for the production function allowing risk-increasing or risk-decreasing inputs. However, Antle
9 (1983, 1987) showed that JP restricts the effects of inputs across higher order moments in
10 exactly the way traditional econometric models do across all moments. Antle's 'moment-
11 based approach' identified a set of general conditions under which standard econometric
12 techniques can be used to identify agricultural technology without imposing such arbitrary
13 restrictions on inputs.
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23 One further advantage of Antle's method is that, while later contributions (e.g. Love and
24 Buccola, 1991, 1999) could not escape making implicit assumptions about the form of
25 farmers' utility functionsⁱⁱⁱ, Antle (1987), and more recently Kumbhakar (2002), also provides
26 a flexible approach to the estimation of risk preferences. In each case risk preferences are
27 estimated as part of a structural econometric model in which neither the impact of inputs on
28 risk nor the form of the utility function is restricted. These qualities make the approach ideally
29 suited to analyse responses to interventions in uncertain environments.
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38 In the light of this discussion, the objectives of this paper are twofold. Firstly, we wish to
39 understand precisely how farmers' decisions are influenced by their risk preferences.
40 Secondly, we wish to establish the importance of considering risk preferences in the *ex ante*
41 evaluation of the welfare impacts of temporary water conservation policies. Such temporary
42 restrictions are frequently implemented in response to severe and unexpected drought and are
43 commonplace in irrigation water management in general (Iglesias et al. 2003). Less common
44 however, is any analysis either of how preferences over higher order moments of profit
45 determine farmers' responses or, more importantly, the potential costs of ignoring these
46 determinants in the evaluation process.
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55 We use production data from the Kiti region of Cyprus. Kiti is representative of arid and
56 semi-arid agricultural regions in that considerable climatic uncertainty prevails, while it
57 reflects our policy interests in that water restrictions are employed periodically and at short
58 notice here in response to drought episodes (Socratous, 2000; Koundouri, 2000). In meeting
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4 our first objective we employ Antle's (1983, 1987) moment based approach to flexibly
5 estimate agricultural technology and risk preferences reflected by Arrow-Pratt and down-side
6 measures, as well as risk premiums. Towards our second objective we use the empirical
7 estimates to evaluate farmers' responses to, and welfare impacts of, the imposition of an
8 irrigation water quota. We contrast the evaluations of three hypothetical water managers that
9 differ only in the extent to which they have information on farmers' risk preferences. This
10 analysis reveals how the determination of water restrictions, predicted input responses and the
11 design of drought compensation policies, may differ in light of information about such
12 preferences.
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21 The paper is organised as follows. In the Section 2, we present the underlying model of
22 farmer behaviour under risk and discuss implications of risk aversion for simple conservation
23 policies (irrigation water quota). The data are described in Section 3. Section 4 presents the
24 econometric analysis and results. Section 5 presents the policy analysis for our hypothetical
25 water planners. Section 6 concludes.
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32 **2. Farmer behaviour under risk: the response to water restrictions**

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34 In this section we analyse the impact of drought management policy on the production
35 decisions of a farmer in a risky environment. To fix ideas we assume that the source of
36 production risk is climatic and that the drought management policy is a temporary restriction
37 upon water use: a water quota. Given the temporary nature of the water quota, our focus here
38 is on variable inputs in agricultural production, such as water, fertilizers, and labour, whose
39 choice and mixture may be modified by the farmer in the short-run in order to hedge against
40 production risk. Furthermore, given the temporary nature of the quota, land allocation
41 decisions and their relationship with variable-input demand are not addressed here. I.e., land
42 is assumed to be a fixed factor and does not respond to temporary drought management
43 policies. This means that fixed cost and technology choice considerations are also outside the
44 scope of this paper. We assume throughout that technology is fixed and known to the
45 environmental regulator. As for prices, we make the assumption that farmers are price-takers,
46 so that a modification in their input allocation decision following, e.g., the implementation of
47 the water quota, will affect neither output nor input prices. Finally prices are perfectly
48 predictable in the short-run, so that they are considered non-random by the farmer^{iv}.
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4 Assume the environmental agency selects a value for the water quota in order to maximize a
5 social welfare objective criterion including environmental considerations. Such welfare
6 function would typically include the consumer surplus associated with the good produced,
7 any environmental externalities related to natural resource depletion, and so on. An important
8 aspect of our framework is that the quota is exogenous, so that once it is chosen, farmers
9 decide on their production plans considering this quota as given. Both problems (choice of
10 quota conservation policy and decision on the level of production) are thus completely
11 separated. This can be thought of as a scenario in which the agency's environmental criterion
12 is based upon the whole population of farmers, e.g. through some technological and
13 preference representation, and each farmer is too small to influence the agency's decision. A
14 key ingredient to assess accurately the performance of such conservation policy is naturally
15 the sensitivity of producers to different values of the quota (the conservation policy
16 instrument). This requires first, an adequate representation of the technology, but also of
17 farmer preferences towards risk.
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31 *The model of production*

32 In this section, the basic representative agent production model under risk is developed.
33 As noted above, we assume an exogenously given quota whose determination is not detailed
34 here. Let p denote output price for a single crop, $f(\cdot)$ is the production function, \mathbf{X} is the K
35 vector of inputs, and \mathbf{r} is the corresponding vector of unit input prices. The environmental
36 policy quota is directed towards a single input, irrigation water in our case, which is denoted
37 X_w with associated unit price r_w . We then have $\mathbf{X}' = (X_1, X_2, \dots, X_{K-1}, X_w)$ and
38 $\mathbf{r}' = (r_1, r_2, \dots, r_{K-1}, r_w)$. The restriction imposed on X_w is written^v:
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$$47 \quad X_w \leq \bar{X}_w. \quad [1]$$

51 We assume that climatic risk affects crop yield through the variable ε , whose distribution
52 $G(\cdot)$ is not affected by farmer actions. In addition, to fix ideas we assume that prices p and \mathbf{r}
53 are non-random, so that ε is the only source of production risk^{vi}. Let us suppose further that
54 $f(\cdot)$ is continuous and twice differentiable. The agent's problem is to maximize expected
55 profit if she is risk-neutral, or to maximize the expected utility of profit if she is risk-averse,
56 subject to condition [1]. In the latter case, the agent's problem is
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$$\text{Max}_{\mathbf{X}} E [U(\pi)] = \text{Max}_{\mathbf{X}} \int [U(pf(\varepsilon, \mathbf{X}) - \mathbf{r}'\mathbf{X})] dG(\varepsilon) + \lambda(\bar{X}_w - X_w), \quad [2]$$

where $U(\cdot)$ is the Von Neuman-Morgenstern utility function and λ is the Lagrange multiplier associated with [1]. The optimal solution for element X_k would then depend upon (p, \mathbf{r}) and on the shape of functions $U(\cdot)$, $f(\cdot)$ and $G(\cdot)$. The first-order condition for irrigation water input, X_w , associated with this problem is:

$$\begin{aligned} E[r_w \times U'] &= E\left[p \frac{\partial f(\varepsilon, \mathbf{X})}{\partial X_w} \times U'\right] - \lambda \\ \Leftrightarrow \frac{r_w + \lambda/E(U')}{p} &= E\left(\frac{\partial f(\varepsilon, \mathbf{X})}{\partial X_w}\right) + \frac{\text{cov}(U', \partial f(\varepsilon, \mathbf{X})/\partial X_w)}{E(U')} \end{aligned} \quad [3]$$

because p and the volumetric price of irrigation water, r_w , are not random, and where $U' = \partial U(\pi)/\partial \pi$. It is apparent that the shape of the utility function (whose curvature is increasing with the degree of absolute risk aversion) will determine the magnitude of the departure from the risk-neutrality case. For a risk-neutral producer, the price ratio under the quota $(1/p)[r_w + \lambda/E(U')]$ equals the expected marginal productivity of X_w . When the producer is risk averse, the second term in the right-hand side of [3] is different from 0, and measures deviations from the risk-neutrality case. More precisely, this term is proportional and has the opposite sign, to the marginal risk premium. If irrigation water is risk increasing, the marginal risk premium increases with X_w and the desired level of that input decreases, all other things being equal. In principle, solving Equation [3] for X_w yields the equilibrium input quantity in terms of p , \mathbf{r} , \bar{X}_w and λ .

This problem, however, is empirically difficult. In addition to the choice of technology specification, the distribution of ε needs to be known and the agent's preferences need to be specified. For this reason we choose a flexible estimation approach that has the advantage of requiring only cross-sectional information on prices and input quantities. The key feature of

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4 this approach is to note that the solution to the producer problem can be written as a function
5 of input levels alone. More precisely, maximizing the expected utility of profit under the
6 quota restriction with respect to any input, is equivalent to maximizing a function of moments
7 of the distribution of ε , those moments having themselves \mathbf{X} as an argument. There is no loss
8 of generality here, because such a function of the moments, denoted $F(\cdot)$, is completely
9 unspecified. The farmer's problem becomes:
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$$14 \quad \text{Max}_{\mathbf{X}} E [U(\pi)] = F[\mu_1(\mathbf{X}), \mu_2(\mathbf{X}), \dots, \mu_m(\mathbf{X})] \quad \text{subject to} \quad X_w \leq \bar{X}_w, \quad [4]$$

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17 where $\mu_j = E(\Pi - \mu_1)^j$, $j = 2, \dots, m$, is the m^{th} moment of profit.
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25 ***Assessing risk attitudes: Antle's approach***

26 Based on the expression above, Antle (1983, 1987) proposes a moment-based
27 approach to estimate risk-attitude parameters of a population of producers. Focusing on the
28 population instead of focusing on each individual producer has two main advantages. It
29 avoids any problem of aggregation of individuals and allows the identification of the risk-
30 attitude parameters from a cross-sectional dataset. However, this approach relies on some
31 assumptions. First, the farmer solves a single-period maximisation program in which inputs
32 are predetermined variables. Second, all farmers produce with similar technology. Below, this
33 stochastic technology is represented by the corresponding distribution of profit, which
34 amounts to assuming that the same profit distribution applies to each farm and that all farmers
35 form the same expectations.
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46 Antle's method amounts to estimating the following K equations, which are derived from the
47 first order condition for the k^{th} input ($k = 1, \dots, K$) in matrix form:
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$$51 \quad \frac{\partial \mu_1(X)}{\partial X_k} = \theta_{1k} + \theta_{2k} \frac{\partial \mu_2(X)}{\partial X_k} + \theta_{3k} \frac{\partial \mu_3(X)}{\partial X_k} + \dots + \theta_{mk} \frac{\partial \mu_m(X)}{\partial X_k} + u_k \quad [5]$$

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56 where θ_{jk} ($j = 2, \dots, m$) is equal to $-1/j! \times (\partial F(\mathbf{X}) / \partial \mu_j(\mathbf{X})) / (\partial F(\mathbf{X}) / \partial \mu_1(\mathbf{X}))$; that is, θ_{jk}
57 represents average population risk attitude parameter relating to the j^{th} moment in the k^{th}
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input's first order condition. Hence for each input k , we have m unknown parameters, θ_{jk} , and u_k is the usual econometric error term^{vii}.

The analysis is made input by input to capture the possibility that each input contributes differently to the moments of the profit distribution. In general, we expect that all inputs increase the expected profit but, for the second-order moment, inputs can be risk-increasing or risk-decreasing. Equation [5] shows that the marginal contribution of input k to the expected profit, given by $\partial\mu_1(X)/\partial X_k$, is written as a linear combination of the marginal contributions of input k to the other moments (variance: $\partial\mu_2(X)/\partial X_k$, skewness: $\partial\mu_3(X)/\partial X_k$, ...). The most important feature of this model is that the parameters θ_{2k} and θ_{3k} are directly interpretable as Arrow-Pratt and down-side risk aversion coefficients, respectively. The Arrow-Pratt (AP) absolute risk aversion coefficient is defined by:

$$AP = -\frac{E(U''(\pi))}{E(U'(\pi))} \cong -\frac{\partial F(X)/\partial\mu_2(X)}{\partial F(X)/\partial\mu_1(X)} = 2\theta_2. \quad [6]$$

A positive AP coefficient means that the farmer is risk-averse. Down-side (DS) risk aversion is measured by:

$$DS = \frac{E(U'''(\pi))}{E(U'(\pi))} \cong \frac{\partial F(X)/\partial\mu_3(X)}{\partial F(X)/\partial\mu_1(X)} = -6\theta_3. \quad [7]$$

A positive DS coefficient means that the farmer is averse to down-side risk, where downside-risk aversion can be thought of as a preference for disaster avoidance^{viii}. It is important to notice that in [6] and [7] we have dropped the index k . This reflects that, contrary to Antle (1987), we take the view that it does not make sense to have input specific measures of risk aversion. Although each input can affect the moments of profit in different ways, the AP and DS coefficients are related to the preferences over the moments of profit, Π . For this reason, no matter what the effect of inputs on the moments of profit, the preferences over moments of profit should remain the same across inputs. Thus it should be the case that $\theta_{jk} = \theta_j$, and hence $AP_k = AP$ and $DS_k = DS$.

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6 The AP and DS coefficients can then be used to compute the risk premium, denoted RP .
7 Assuming that the farmer is concerned by the first three moments of the distribution only, we
8 have $RP = \mu_2 AP/2 - \mu_3 DS/6$, where μ_2 and μ_3 are respectively a measure of the second-
9 and third-order moments of the distribution. $RP > 0$ means that the farmer is characterized by
10 a positive willingness-to-pay to be insured against risk. Coefficients θ_2 and θ_3 , directly
11 related to AP and DS , can also be interpreted as a measure of the marginal contribution of
12 each moment to the risk premium.
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21 3. Dataset description

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23 Cyprus is representative of arid and semi-arid regions in general, typified by low and
24 variable rainfall and overuse of groundwater resources. There are a wide variety of crops
25 grown in Cyprus ranging from the permanent crops such as olives, citrus and other deciduous
26 fruits and nuts, to more temporary cereal and vegetable crops. The Kiti region lies within the
27 southerly Larnaca area of Government controlled Cyprus. To date over 2200ha of irrigation
28 has been developed in the Larnaca area (MIT, 1999) and historically the Kiti region has been
29 dependent upon groundwater to sustain irrigated agriculture.
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35 The farm level data is drawn from a survey of agricultural production of the coastal Kiti
36 region of Cyprus undertaken by the University of Cyprus and the Ministry of Agriculture in
37 the summer of 1998. A cross-section of 283 farmers was surveyed regarding production
38 activities on representative parcels of their land. Information included expenditures upon, and
39 quantities purchased of, fixed and variable inputs used in the production of final outputs. The
40 total area of land owned by the farmer and the area(s) devoted to irrigated/non-irrigated and
41 temporary/permanent crops were also provided. The survey data included climatic data in the
42 form of rainfall measurements and soil quality characteristics for each parcel of land.
43 Qualitative data was also provided, e.g. information regarding farm ownership, family
44 characteristics and access to water resources. The total area of land cultivated by the farmers
45 is 807ha of which approximately 42% is irrigated. The cross-section sample represents
46 approximately 15% of the developed irrigated land in the Larnaca area^{ix}. The wide variety of
47 crop types represented in the sample necessitated the grouping of crops into broad categories
48 to overcome the sparseness of individual crop observations^x. Crops have been grouped into
49 two categories namely: vegetables and cereals^{xi}. Once grouped in this way, the data show that
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4 85% of the farmers grow a single crop. The data sample used is almost equally dominated by
5 agricultural parcels, which cultivate vegetables (133 parcels) and cereals (135 parcels).
6 Relatively few agricultural units choose to cultivate citrus (30 parcels). Moreover, on average
7 more hectares per parcel of land are devoted to vegetables (2.87) and cereals (2.79)
8 cultivations, than to citrus cultivations. While mean annual crop-specific gross revenues (total
9 sales) per hectare of land are higher for vegetables than for cereals, vegetable cultivation
10 involves higher mean input expenditure. The variability of expenditures among farmers is
11 also higher for vegetables. Table 1 presents descriptive statistics by crop groups regarding
12 surface, revenue and major input expenditures. We also report descriptive statistics for
13 variables to be used as instruments in the econometric application: WELLON, a dummy
14 variable which takes the value of 1 if there is a well in the parcel and zero otherwise, DIST1:
15 distance of the parcel to the nearest town (in km), DIST5: distance of the parcel to the nearest
16 river (in km), RESERVOIR, a dummy variable which takes the value of 1 if the farmer has
17 access to a water reservoir and zero otherwise, LAND, a dummy variable which takes the
18 value of 1 if the parcel belongs to an agricultural zone and zero otherwise.
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33 [Table 1 here]
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36 Data on the quantities of water used in crop production were sparse. In response, information
37 regarding water requirements for the specified crops were gathered from the Ministry of
38 Agriculture (Agricultural Research Institute, 1998) and were used to calculate theoretical
39 water demands for the farms based on the areas of land devoted to particular crops. This
40 information is used in the absence of specific data on irrigation water use^{xii}. Similarly, data
41 regarding the cost of water were sparse. This necessitated the construction of a tariff for
42 groundwater pumping costs based on hydrological information obtained from the Ministry of
43 Agriculture in Nicosia^{xiii}. It is assumed here that farms are totally reliant on groundwater, an
44 assumption again borne out by the data, which shows that 80% of the farmers use solely
45 groundwater in this area.
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55 **4. Econometric estimation and results**

56 *Estimation*

57 Following Antle (1987), we propose to estimate the sample-average risk-attitude
58 parameters. Given that 85% of the farmers grow a single crop, we distinguish between two
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groups of producers: producers of vegetables and cereals. We report the results for three important variable inputs: fertiliser (including manure), agricultural labour and water. For both groups, our estimation methodology is the following. First, we estimate the conditional expectation of profit using a quadratic functional form: total observed profit is regressed on all levels, squared and cross-products of input expenditures^{xiv}. We choose a linear quadratic form because it is flexible in the sense of a second-order approximation of any unknown profit function (Kumbhakar and Tveterås, 2003). The residuals of the latter regression are then used to compute conditional higher moments (variance and skewness) and are regressed on all levels, squared and cross-products of input expenditures^{xv}.

Analytical expressions for derivatives of these moments with respect to each input are then computed. Finally, we use 2SLS (Two-Stage Least Squares) to estimate the system of equations [5] above for three inputs, water, labour and fertiliser. Instruments used were (WELLON, DIST1, DIST5 RESERVOIR, LAND), see above for a definition and Table 1 for summary statistics on these variables. These instruments are the same for each equation (fertiliser, water, labour), in the case of cereals as well as vegetables.

However, as discussed in the previous section, contrary to the work of Antle (1987) and in line with economic theory, we restrict the coefficients upon the moments of profit to be equal across inputs, i.e. we estimate the system in [5] with the following restrictions: $\hat{\theta}_{2k} = \hat{\theta}_2$ and $\hat{\theta}_{3k} = \hat{\theta}_3$, where k = fertiliser, labour, water. The estimated parameters are then used to recover the population average Arrow-Pratt (AP) and down-side (DS) risk aversion measures using the relationships in [6] and [7]: $AP \cong 2\hat{\theta}_2$ and $DS \cong -6\hat{\theta}_3$. These estimates are finally used to compute the risk premium, RP , which is approximately equal to:

$$RP \cong \frac{1}{2}\mu_2 AP - \frac{1}{6}\mu_3 DS \quad [8]$$

where μ_2 and μ_3 are as before: measures of the second and third moments of profit. The estimation is undertaken for two crop-groups: cereals and vegetables, and hence crop specific risk aversion parameters are estimated. This is not to say that risk aversion varies across crops for a given farmer, but rather to capture the observation made earlier that these crop groups

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4 are grown by different groups of farmers in our sample. Hence, the average risk aversion
5 coefficients are likely to differ between crops.
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9 The results also allow us to estimate the elasticity of the various moments of profit with
10 respect to inputs. This provides us with some indication of the extent to which inputs are risk
11 increasing or decreasing in the production of each crop. In turn, in the following section this
12 enables us to understand how restricted water allocations affect the welfare of risk averse
13 farmers. The results of estimation procedure: the population average risk aversion parameters,
14 test statistics and elasticities of profit moments are reported in Tables 2 and 3 below.
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20 21 **Results**

22 The estimates in Table 2 show that the farmers in the Kiti area exhibit positive Arrow
23 Pratt and downside risk aversion parameters. This indicates that on average cereal and
24 vegetable farmers in the Kiti region of Cyprus have preferences over higher order moments of
25 profit since they are averse to risk (profit variance) and down-side risk (profit skewness).
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32 [Table 2 here]
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35 Furthermore it is interesting to note that the extent of risk aversion appears to be different for
36 cereal farmers compared to vegetable farmers. This is indicated by the higher estimate for *AP*
37 in the cereal group, while *DS* parameter is not significant in the latter but significant for
38 vegetable farmers. The Wald test statistic for equality between *AP* and *DS* parameters across
39 the two groups is equal to 264.98, with an associated *p*-value less than 0.0001. Hence, the
40 hypothesis of similar risk preferences for cereal and vegetable producers is strongly rejected
41 and the following two results are established: (a) cereal farmers are willing to give up more of
42 their expected profit in order to receive a given level of profit in the future with certainty; (b)
43 vegetable farmers are willing to pay more than cereal farmers in order to hedge against
44 disastrous events. As already mentioned in the 'Estimation' sub-section of Section 4, these
45 results indicate that these two crop groups are grown by different groups of farmers in our
46 sample. Those farmers that grow cereals are hedging against the variability of their mean
47 income, while those that grow vegetables are more sensitive to extreme events. Furthermore,
48 the related risk premium (by unit of profit) associated to cereals is lower than its counterpart
49 for the vegetable group. This could reflect a number of factors including self-selection of
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4 more risk averse farmers into the production of cereals, and more down-side risk averse
5 farmers into the production of vegetables, on the basis of the associated distribution of profit.
6 Such a configuration of risk preference might be explained by the fact that most cereal
7 growers are full-time farmers, hence interested in sustaining a minimum income from
8 farming, while most vegetable growers are part-time farmers, hence their mean income (from
9 farming and non-farming activities) is significantly affected by changing weather conditions
10 only in the occurrence of disastrous events. [Personal Communication: Prof. George
11 Socratous, University of Cyprus]. It is more difficult to compare values of the relative risk
12 premium on the basis of risk preferences alone, as the relative risk premia also depend on
13 group-specific moments of the distribution of profit.
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23 Given that the estimated system of equations in [5] are derived from the first order conditions
24 for expected profit maximisation, theory suggests that the origin of the estimated equation
25 should be equal to zero for each input (Antle 1987). Estimates of the constant term that are
26 different from zero can be interpreted as a deviation from profit maximising choice of the
27 particular input. We see from Table 2 that the estimate of the constant term is always
28 significant, albeit close to zero for labour and water inputs. This suggests that, given the
29 marginal cost, water and labour are being used efficiently by farmers in this region. However,
30 the same cannot be said for fertilisers where positive and significant estimates for the constant
31 terms are recorded for both crops. This implies that fertiliser is being overused by farmers in
32 the production of both crops.^{xvi}
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42 The sensitivity of the moments of profit with respect to inputs are also of interest here. In
43 general the three inputs have a positive impact upon expected profit, except fertiliser for
44 cereals, but it is not significant (see Table 3). Only water and labour for vegetables are
45 significant when explaining expected profit. Fertiliser is a variance increasing input in the
46 production of both crops (although significantly so only for cereals) while water appears to be
47 variance decreasing for vegetables but variance increasing for cereals. Labour is variance
48 decreasing for both crop groups. These results concerning the variance of profit are consistent
49 with the intuition (and earlier empirical work, see Antle 1987) that more labour generally
50 helps reducing risk because problems associated with plant growth can be monitored more
51 accurately, while overuse of fertiliser can increase production risk. Fertiliser and labour have
52 a significant positive impact on profit skewness in the production of vegetables and cereals
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4 respectively. Table 3 shows clearly the benefits of employing the flexible approach of Antle
5 in the estimation of agricultural production technology compared to that of, for example Just
6 and Pope (1978, 1979). Whereas traditional estimation methods place constraints upon the
7 impact of inputs on the moments of profit, the method employed here allows inputs to impact
8 some moments of profit positively and others negatively. It seems clear that this is a more
9 realistic representation of the production technology.
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16 [Table 3 here]
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18 19 **5. Analysis of the impact of water quotas**

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21 In this section we illustrate the importance of estimating farmers' risk preferences for
22 the economic evaluation of a water management policy: an unanticipated, exogenous quantity
23 restriction or water quota. Quantity restrictions such as this are common water management
24 instruments especially in the face of severe periodic water shortages and drought (Iglesias et
25 al., 2003; Garrido et al., 2002; Moore and Negri, 1992). Given that irrigation water is derived
26 from groundwater, one might ask how this policy exercise of water quotas could effectively
27 be carried out. The difficulty of establishing and monitoring quotas in the context of common-
28 pool groundwater extraction gives rise to the need for a tradable permit scheme (Provencher
29 and Burt, 1993). In such a scheme, farms are granted an endowment of tradeable permits to
30 the *in situ* groundwater stock, which they control over a specific time period. Each farm's
31 bundle of permits represents its private stock of groundwater. This private stock declines due
32 to groundwater pumping and increases to reflect the farm's share of periodic recharge. It also
33 changes in response to the farm's activity in the market for groundwater stock permits,
34 increasing when permits are purchased and decreasing when permits are sold. As a practical
35 matter, the market price for permits serves to allocate groundwater over time. Our work in
36 this paper indicates the importance of accounting for risk considerations when deciding the
37 size of the endowment of tradable permits to the *in situ* groundwater stock. That is, this
38 endowment should be a function, not only of the hydrogeological and climatic conditions that
39 prevail in the region and farmers' production technology, but also the risk preferences of
40 these farmers, which will define the way they use inputs in order to hedge against production
41 risk.
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Scenarios

In order to illustrate our point we consider three scenarios, which differ only in the information assumed available to the policy maker regarding farmers' risk preferences. We then go on to show how the evaluation of the policy differs across scenarios. In particular we evaluate three important dimensions of farmers' responses to restrictions in a risk averse environment: input mix, the moments of profit and average risk premiums. We assume that land (and other factors) is fixed and hence the response evaluated represents either a short-run response to a once and for all quantity restriction or the response to a one off water restriction in the face of a periodic water shortage.

In Scenario 1 we assume that the policy maker assesses the immediate impacts of the policy on the understanding that farmers are risk neutral and attempt to maximise expected profit. This represents perhaps the most usual way to handle conservation policies. In Scenarios 2 and 3 we assume that the policy maker is less naïve about risk preferences. In Scenario 2 farmers' preferences over the variance of profit are considered while in Scenario 3 it is assumed that preferences for both variance and skewness of profit are considered in evaluating the water management policy. That is, the policy maker considers both Arrow-Pratt (*AP*) parameters in Scenario 2 and both *AP* and down-side risk (*DS*) aversion characteristics in Scenario 3. Scenario 3 allows us to illustrate the importance of preferences for higher order moments of profit in determining farmer responses. In evaluating the impact upon farmers of the water quota policy we calculate the elasticity with respect to water of the inputs to production for two crop groups: cereals and vegetables.

Measurement of Farmer Responses

Elasticities of inputs with respect to water are calculated from the system of first order conditions for expected profit maximisation, evaluated using the previously-obtained parameter estimates. Direct application of the general implicit function theorem yields:

$$\frac{\partial F}{\partial W} = \frac{\partial^2 \mu_1 / \partial F \partial W - (AP/2) \partial^2 \mu_2 / \partial F \partial W + (DS/6) \partial^2 \mu_3 / \partial F \partial W}{\partial^2 \mu_1 / \partial F^2 - (AP/2) \partial^2 \mu_2 / \partial F^2 + (DS/6) \partial^2 \mu_3 / \partial F^2} \quad [9]$$

$$\frac{\partial L}{\partial W} = \frac{\partial^2 \mu_1 / \partial L \partial W - (AP/2) \partial^2 \mu_2 / \partial L \partial W + (DS/6) \partial^2 \mu_3 / \partial L \partial W}{\partial^2 \mu_1 / \partial L^2 - (AP/2) \partial^2 \mu_2 / \partial L^2 + (DS/6) \partial^2 \mu_3 / \partial L^2}.$$

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4 In Scenario 1 ('Risk Neutrality'), equation [9] is evaluated assuming that AP and DS are equal
5 to zero. Scenario 2 ('No down-side Risk') assumes that only DS is equal to zero and employs
6 the estimated values for AP , whilst Scenario 3 employs the estimates of both AP and DS
7 reported in the previous section. Using the comparative statics in [9] means that in each case
8 and for each crop, elasticities of fertiliser and labour are assessed after water use, fertiliser and
9 labour have responded.^{xvii} The results to this analysis are shown in Table 4. Note that, because
10 the DS parameter is not significant for cereals, results are the same for Scenarios 2 and 3
11 concerning this group.
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20 [Table 4 here]
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23 The impacts of a water conservation policy can be interpreted as follows. In Scenario 1 the
24 policy maker would expect cereal growers to increase fertiliser use by 0.29% and labour by
25 0.60% in response to a 1% restriction in water use. Once AP characteristics are introduced in
26 Scenario 2 the policy maker would expect a 0.52% increase for fertiliser and 0.22% for labour
27 ; the sophisticated policy maker who takes into account preferences for higher order moments
28 of profit would expect the same input variations, as DS is not significant for cereals. These
29 estimates are statistically significant predicted responses for risk neutrality regarding
30 fertiliser, and full preferences regarding labour. The differences between the scenarios are
31 clear. The naïve policy maker who assumes risk neutrality would underestimate (resp.
32 overestimate) the response of farmers in choosing their substitute fertiliser (resp. labour)
33 inputs.
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44 In the case of vegetables, the difference between the naïve and the sophisticated policy maker
45 is even more pronounced. The naïve policy maker in Scenario 1 would expect a significant
46 and negative response (-0.17%) in fertiliser applications, and a significant and positive
47 response (0.38%) for labour by farmers. On the contrary, the sophisticated policy maker in
48 Scenario 3 would expect a significant and positive response (0.11%) in fertilizer applications,
49 and a significant and negative response (-0.33%) for labour by farmers. Clearly, the
50 sophisticated policy maker sees that water and fertiliser (resp. labour) are substitute (resp.
51 complementary) inputs in the production of vegetables, whereas the naïve policy maker of
52 Scenario 1 would, if anything, expect these inputs to be complementary (resp. substitute).
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4 This represents an important reflection of the importance of risk preferences in determining
5 production decisions and evaluating policy responses.
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9 The substantive differences between the scenarios analysed here come from the fact that
10 under risk-neutrality reallocation of inputs is only determined by technological constraints,
11 whereas under risk-aversion farmers reallocate inputs by considering not only technological
12 issues but also risk hedging. A policy maker that ignores the latter elements of farmer
13 decision-making will obtain a limited and potentially false prediction of the impacts upon
14 farmers of water management policies. In the results above this is reflected in the different
15 signs for input responses and the welfare effects reflected in the risk premium. As a result
16 water managers will come to erroneous conclusions with regard to the optimal response to
17 drought on the one hand and the optimal package of assistance or compensation to farmers in
18 the face of constraints on the other. More generally, policy makers may fail to correctly
19 predict the external effects if they are naïve to risk preferences. It is easy to imagine a
20 scenario in which water restrictions lead to an increase in e.g. pesticide and fertiliser use,
21 which in turn leads to a decline in water quality, where a naïve policy maker would expect the
22 opposite response. The results in Table 4 alert our attention to this possibility in the case of
23 fertilisers in Cyprus.
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38 **6. Conclusion and suggestions for further research**

39 This paper contributes to the analysis of drought management policies in irrigated agriculture
40 by illustrating the importance of estimating the risk preferences in evaluating their impact.
41 Using data from the arid Kiti region of Cyprus we first estimate farmers' risk preferences
42 using Antle's (1987, 1983) flexible method of moments approach. This reveals sensitivity of
43 preferences to variance and, importantly, higher order moments of profit. We then analyse a
44 drought management policy commonly applied in irrigation: a water quota restriction, from
45 the perspective of three hypothetical water policy-makers who differ only in their
46 understanding of farmers' risk preferences. We show that a naïve policy-maker, who believes
47 farmers are risk neutral, can wrongly predict the direction of input responses and hence
48 welfare changes by ignoring preferences over higher order moments of profit. This leads to
49 the possibility of badly designed drought management policy: the quota restriction and/or
50 compensation measures may be too lenient, severe or missing important dimensions such as
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4 insurance. Our analysis of a temporary water restriction represents the first step towards more
5 comprehensive analyses of the response of risk averse farmers to water conservation policies.
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7 On the whole, this paper aims to draw policy-makers' attention to the fact that although under
8 risk-neutrality reallocation of inputs is only determined by technological constraints, under
9 risk-aversion farmers reallocate inputs by considering not only technological issues but also
10 risk hedging. Hence, in the face of resource scarcity and uncertain resource availability,
11 policy makers should design conservation policies and packages of technical assistance or
12 compensation to farmers, by taking into account the effects of the farmers' risk preferences on
13 production decisions. Ignoring these effects can lead to wrong evaluation of policy-responses.
14 These results are relevant for the regulation of productive activities that are affected by
15 exogenous stochastic events, in general.
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Table 1. Descriptive statistics by crop group

| | VEGETABLES | | CEREALS | |
|----------------------------------------------------|------------|---------|---------|---------|
| | Mean | St Dev. | Mean | St Dev. |
| Surface allocated ¹ (ha) | 2.87 | 5.79 | 2.79 | 4.11 |
| Gross revenue/ha (CYP/year) ² | 2614.91 | 4079.79 | 628.33 | 1138.26 |
| Fertiliser expenditures ³ (CYP/ha/year) | 201.53 | 395.50 | 85.43 | 274.56 |
| Water expenditures (CYP/ha/year) | 359.66 | 359.00 | 104.23 | 211.34 |
| Labour expenditures (CYP/ha/year) | 662.38 | 2147.58 | 589.35 | 2075.12 |
| WELLON (1= well on parcel) | 0.4592 | 0.5001 | 0.39 | 0.49 |
| DIST1 (distance to nearest town, in km) | 11.43 | 6.80 | 9.91 | 5.24 |
| DIST5 (distance to nearest river, in km) | 2.07 | 2.97 | 2.15 | 1.54 |
| RESERVOIR (1= access to water reservoir) | 0.2370 | 0.4268 | 0.1804 | 0.38 |
| LAND (1= parcel belongs to agricultural zone) | 0.7926 | 0.4069 | 0.8295 | 0.39 |
| Number of observations | 133 | | 135 | |

¹ includes irrigated and not irrigated area.

² CYP: Cyprus pound (1 CYP was US\$1.5 in 1998).

³ including manure.

Table 2. Estimation results

| Parameter | Cereals | Vegetables |
|------------------------------------------------------------------------------|-----------------------|----------------------|
| θ_{1F} (fertiliser intercept) | -0.0540*** (-3.48) | 0.0619*** (31.63) |
| θ_{1W} (water intercept) | 0.0011*** (15.58) | 0.0000*** (2.82) |
| θ_{1L} (labour intercept) | 0.0035*** (8.58) | 0.0011*** (9.52) |
| AP | 0.3401** (2.61) | 0.0726*** (2.97) |
| DS | -0.0884 (-0.61) | 0.2930*** (35.90) |
| Observations | 135 | 133 |
| Wald test for equality between AP and DS : $\chi^2(2) = 264.98$ (0.0000) | | |
| Relative Risk Premium ($RP/E\Pi$) | 0.1708 | 0.2216 |

Estimation method: 2SLS. Instruments used: (WELLON, DIST1, DIST5, RESERVOIR, LAND). t -ratio (Student) statistics are in parentheses, except p -value for the Wald test.

***, ** and * denote significance at 1, 5 and 10 percent respectively. AP and DS denote Arrow-Pratt and down-side risk coefficients respectively.

Table 3. Sensitivity of the distribution of profit with respect to inputs

| Parameter | Cereals | | Vegetables | |
|--------------------------------|-----------|------------|------------|------------|
| | Mean | Std. Error | Mean | Std. Error |
| $\partial E(\Pi)/\partial F$ | -0.0344 | 0.0689 | 0.0493* | 0.0278 |
| $\partial E(\Pi)/\partial W$ | 0.0035 | 0.0072 | 0.0002** | 0.0001 |
| $\partial E(\Pi)/\partial L$ | 0.0180 | 0.0864 | 0.0021 | 0.0028 |
| $\partial Var(\Pi)/\partial F$ | 0.1293* | 0.0687 | 0.1367 | 0.0969 |
| $\partial Var(\Pi)/\partial W$ | 0.0114 | 0.0301 | -0.0004 | 0.0004 |
| $\partial Var(\Pi)/\partial L$ | -0.0070 | 0.0113 | -0.0015 | 0.0040 |
| $\partial Sk(\Pi)/\partial F$ | -0.2788 | 0.2539 | 0.3547** | 0.1546 |
| $\partial Sk(\Pi)/\partial W$ | 0.0335 | 0.0818 | -0.0002 | 0.0008 |
| $\partial Sk(\Pi)/\partial L$ | 0.1864*** | 0.0696 | -0.0219 | 0.0437 |

Notes. Π is profit, F , W and L are respectively fertiliser, water and labour inputs, Var and Sk denote the second moment (variance) and third moment (skewness), respectively.

***, ** and * denote significance at 1, 5 and 10 percent respectively.

Table 4. Water quota policy simulation - Input elasticities (for a 1% decrease in water use)

| Cereals - Elasticity of Fertiliser and Labour to Water | | |
|-----------------------------------------------------------|---------------------|--------------------|
| | Fertiliser / Water | Labour / Water |
| Risk Neutrality ($AP=DS=0$) | 0.2984*** (0.1016) | 0.6018 (0.4262) |
| No down-side Risk ($DS=0$) | 0.5180 (0.3621) | 0.2275*** (0.0749) |
| Full Risk Preferences | 0.5180 (0.3621) | 0.2275*** (0.0749) |
| Vegetables - Elasticity of Fertiliser and Labour to Water | | |
| | Fertiliser / Water | Labour / Water |
| Risk Neutrality ($AP=DS=0$) | -0.1708*** (0.0434) | 0.3812*** (0.0683) |
| No down-side Risk ($DS=0$) | -0.7241*** (0.0442) | 0.1101* (0.0645) |
| Full Risk Preferences | 0.1093* (0.0641) | -0.3374** (0.1696) |

Notes: Standard errors are in parentheses. ***, ** and * denote significance at the 1%, 5% and 10% level respectively. Reported estimates correspond to a 1 percent **decrease** in the water input.

Endnotes

ⁱ Ozanne (1998) provides evidence of the importance of risk preferences for policy analysis in agriculture.

ⁱⁱ Such an approach goes as far back as Stiglitz (1974).

ⁱⁱⁱ See for example, Pope (1982).

^{iv} This assumption is not critical as long as farmers are price-takers. Extending the model by allowing for price risk in addition to production risk, although feasible, would not bring about significant changes in the analysis.

^v \bar{X}_w is either in absolute or relative terms. In the latter case, we would have for example $\bar{X}_w = (1 - \delta)X_w^0$, with X_w^0 the reference water consumption, and δ the desired rate of reduction in water use.

^{vi} With the multiplicative risk specification that we have here, ε could also represent output price risk, p . However, we wish to focus on climate as the particular source of uncertainty.

^{vii} The inclusion of a constant term in the empirical model measures the extent to which the population exhibits profit maximising behaviour. Theory suggests that for profit maximising farmers this should be zero and hence in the results section we check this hypothesis for each model.

^{viii} Down-side risk is concerned with asymmetric (skewed) statistical distributions of profit and in particular aversion to disastrous events (see e.g., Menezes et al., 1980 for a discussion).

^{ix} A comparison to national statistics (see Agricultural Research Institute, 1998) reveals that the Kiti region provides a reasonable representation of the composition of crop production in Cyprus as a whole.

^x Major crops in the region are coriander and broad bean (respectively 13.5 % and 16.5 % of total area), barley and wheat (respectively 18.9 % and 14.6 % of total area).

^{xi} Citrus is also grown in the Kiti area however the data for this production were too sparse for the estimation of risk parameters.

^{xii} Water requirements range from 2200 m³/ha/year for broad bean, to 6800 m³/ha/year for okra. Concerning cereals, these requirements are respectively 5500 m³/ha/year for bran, barley and wheat, and 6500 m³/ha/year for corn.

^{xiii} Irrigation water costs depend on an area-specific pumping lift, ranging between 6.5 and 18.5 meter. Marginal groundwater costs are estimated between 0.13 CYP/m³ and 0.37 CYP/m³, depending on the area (Koundouri, 2000).

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5 ^{xiv} All variables are rescaled by their standard deviation.

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7 ^{xv} The 4th moment, kurtosis, was also considered however, estimated coefficients were not
8 significant. We concentrate on variance and skewness in order to illustrate the importance of
9 higher order moments to farmers' decisions.

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11 ^{xvi} However, this could be some remnant of the composite nature of the fertilizer input.

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13 ^{xvii} Given our assumption that land (and other factors), output and input prices are assumed
14 fixed, it is unrealistic to draw inferences from a simulation scenario that results in input values
15 very far from reference values. Presumably, if the quota policy requires large variations in
16 water use from the reference case, farmers are likely to react, not only by adjusting the levels
17 of their other inputs, but also by curtailing production on certain areas of land, possibly also
18 modifying prices.
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**Replies to the referee on « The story of the moment: risk averse Cypriot farmers
respond to drought management »**

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We wish to thank the referee for his relevant comments and useful suggestions. We explain below how we responded to each of the critics.

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Comments 1 and 2) Specification of the production function.

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The authors collectively agree with the referee's critic about the omission of labour in the production function. We thus followed the referee's suggestion by considering labour as an additional variable input in the production function, in addition to fertilizer and water. Land is still assumed to be a fixed factor. Basic statistics on the three variable inputs are shown in Table 1.

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Comment 3) Choice of the quadratic functional form.

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The quadratic functional form (which is commonly used in the estimation of agricultural profit functions) has been chosen because it is flexible in the sense of a second-order approximation of any unknown profit function (Kumbhakar and Tveterås, 2003). Although other flexible forms are considered in the literature, such as the Translog specification in particular, preliminary estimates revealed that the quadratic profit function performed better in terms of statistical fit on our sample. We justify our choice of a quadratic functional form, along these lines, in the revised version of the article (page 11).

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Comment 4) Choice of GMM as an estimation technique.

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Following the referee's comment, we decided to estimate the model using a Two Stage Least Squares (2SLS) estimation technique, instead of a GMM. The major difference in our (linear) case between 2SLS and GMM would be in terms of robustness with respect to error variance misspecification, the 2SLS estimator being however more efficient under the assumption of homoskedasticity. Instruments are: WELLON, a dummy variable which takes the value of 1 if there is a well in the parcel and zero otherwise, DIST1: distance of the parcel to the nearest town (in km), DIST5: distance of the parcel to the nearest river (in km), RESERVOIR, a dummy variable which takes the value of 1 if the farmer has access to a water reservoir and

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3 zero otherwise, LAND, a dummy variable which takes the value of 1 if the parcel belongs to
4 an agricultural zone and zero otherwise.
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9 **Comment 5) Definition of variables.**

10 In the revised version of the article, we define precisely all the variables, including
11 instruments, and show corresponding descriptive statistics in Table 1.
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16 **Comment 6) Better explain differences between results for vegetables and cereals.**

17 We describe the differences in terms of estimated risk aversion parameters (between the two
18 groups of farmers) in greater details, and we provide some explanations for these differences.
19 We argue that “such a configuration of risk preference might be explained by the fact that
20 most cereal growers are full-time farmers, hence interested in sustaining a minimum income
21 from farming, while most vegetable growers are part-time farmers, hence their mean income
22 (from farming and non-farming activities) is significantly affected by changing weather
23 conditions only in the occurrence of disastrous events. [Personal Communication: Prof.
24 George Socratous, University of Cyprus].” This discussion is found on pages 12-13 in the
25 revised version of the paper.
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35 **Comment 7) Testing of underlying assumptions.**

36 The statistical significance of the risk parameters (Arrow-Pratt and Down-side risk
37 parameters) is an indirect test of the following joint hypotheses: a) underlying production risk
38 is affected by input choices by the farmer; b) producers care about production risk, i.e., they
39 are not risk neutral.
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46 **Comment 8) Conclusion.**

47 We have tried to add more elements in the conclusion, in particular to emphasize more the
48 implications of our results for policy makers. We argue that, “on the whole, this paper aims to
49 draw policy-makers’ attention to the fact that although under risk-neutrality reallocation of
50 inputs is only determined by technological constraints, under risk-aversion farmers reallocate
51 inputs by considering not only technological issues but also risk hedging. Hence, in the face
52 of resource scarcity and uncertain resource availability, policy makers should design
53 conservation policies and packages of technical assistance or compensation to farmers, by
54 taking into account the effects of the farmers’ risk preferences on production decisions.
55 Ignoring these effects can lead to wrong evaluation of policy-responses. These results are
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3 relevant for the regulation of productive activities that are affected by exogenous stochastic
4 events, in general.” This discussion can be found on pages 17-18 of the revised article.
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9 **Comment 9) Presentation of the results in Table 2.**

10 We improved the presentation of the results in Table 2. In particular, in the revised version of
11 the paper, we explain that the parameter θ_{1k} is the intercept in the first order condition
12 (derived from the maximisation of farmer’s expected utility of profit) for input k ($k =$
13 fertilisers, water, labour). AP and DS, which represent the Arrow Pratt and down-side risk
14 aversion parameters respectively, are now described in the note at the bottom of Table 2. The
15 Hansen test no longer appears in the table, as we no longer use GMM (the Hansen test was
16 used in the previous version of the paper, to test for the validity of the moment conditions).
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25 We believe that these revisions address the concerns expressed and the points of clarification;
26 however, if you should require any further explanation from us with regard to these points,
27 please do not hesitate to contact us.
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