

# DETERMINANTS OF THE RISK ATTITUDE OF INDIGENOUS CHICKEN FARMERS AND THE EFFECT OF RISK ATTITUDE ON INDIGENOUS CHICKEN PRODUCTIVITY IN KENYA

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**Abstract.** Indigenous Chicken (IC) keeping in Kenya is predominantly based on an extensive system that is characterized by high mortality rates, resulting mainly from disease outbreaks and predation. Information on farmers' risk attitudes is scarce despite the risks inherent in IC production systems. Similarly, it is unclear how socioeconomic factors influence IC farmers' risk attitudes and how their risk attitudes influence IC productivity. As a result, an understanding of the determinants of farmers' risk attitude and the effects of risk attitude on IC productivity are critical. Primary data were collected using a structured questionnaire. Multi-stage sampling procedure was used to sample 240 IC farmers from an accessible population of 598 chicken farmers in Nyanza region. Ordinary least squares regression analysis was carried out to determine the influence of the socio-economic variables on the risk attitudes of the IC farmers, and a two-stage least squares regression analysis was used to determine the effect of risk attitude on IC productivity. Total land size, family size, occupation of the farmer, and total household expenditure had a positive and significant influence on the risk aversion behavior of the farmers. Farming experience, number of chickens, and cost of depreciation had a negative impact on risk aversion. The risk aversion coefficient had a negative and significant relationship with chicken productivity. Farmers' risk attitude and socioeconomic characteristics should be considered part of the guide to formulating and implementing policy on risk management.

**Keywords:** Risk attitude, indigenous chicken, determinants, productivity

## INTRODUCTION

Like any other business, farming is inherently risky (Ogurtsov et al., 2008). Agricultural risks are primarily caused by climate variability, biological diseases, production seasonality, different geographical production areas, consumers of agricultural production (McNeil et al., 2015; Ullah et al., 2015; Huong et al., 2018), regular natural disasters (World Bank, 2011), the unpredictability of agricultural products, production, prices, imperfect input/output markets, and a lack of financial and credit facilities (Musser and Patrick, 2002; Senyole et al., 2009; Xaba and Masuku, 2013).

Understanding individual risk attitudes and perception is a prerequisite to understanding economic behavior (Reynaud and Couture, 2012; Ullah and Shivakoti, 2014). They are crucial factors that affect farm production, investment, and management decisions (Ullah et al., 2015). Furthermore, the identification of farmers' preferences towards risk can be considered an essential element in creating effective and efficient risk management mechanisms (Komarek et al., 2020) and helping policymakers design more effective policies that can help farmers reduce various potential sources of risk in developing countries (Brauw and Eozenou, 2014).

According to their risk attitudes, farmers can be categorized into three groups: risk-averse, risk seekers, and

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risk-neutral farmers (Murray-Webster and Hillson, 2008). Risk-averse farmers are those who are extremely uncomfortable with an uncertain outcome. This may cause them to forego expected profit in order to avoid risk. They are willing to accept a lower average income to avoid or mitigate risks (Murray-Webster and Hillson, 2008). Furthermore, Kahneman and Tversky (1979) elucidated that risk-averse individuals would value a protective action that keeps the probability of injury at zero level. Risk seekers are quite interested in uncertainties, and they do not have a desire to avoid or reduce threats. They perceive risk as a profitable chance and thus, they seek to pursue the venture and accept losses to take their chances (Murray-Webster and Hillson, 2008). Between the two extreme attitudes, we have risk-neutral individuals who are uncomfortable with uncertainty in the long term. Therefore, they can take whatever necessary short-term activities to gain a certain long-term outcome. Risk-neutral individuals are deemed unconcerned with risk when deciding between investments. Thus, they are disinterested in the risk involved in the investment and are only concerned about the predicted outcome (Nguyen, 2007).

Indigenous Chicken (IC) contributes significantly to income generation and food and employment creation in rural communities (Thorton et al., 2012; Kyule et al., 2014; Ngongolo et al., 2021). However, the largest proportion of the indigenous poultry in Kenya is raised under harsh conditions such as the prevalence of diseases, predation, inadequate feeding, poor housing, extreme weather changes, and markets, which predispose them to risk and result in sub-optimal production levels and profitability (Bett et al., 2012; Chuma, 2019; Ngongolo and Chota, 2021).

Moreover, the productivity of indigenous chickens in Kenya expressed in terms of egg production, growth, and survival of chicks is quite low (Magothe et al., 2006; Olwande et al., 2010; Okeno et al., 2011). Despite the aforementioned risks in IC production systems, only a few studies have reported farmers' attitudes toward risk (Mose et al., 2018a). The extent to which socioeconomic factors affect the risk attitude of IC farmers and how their risk attitudes have an effect on IC productivity is unknown. Therefore, an understanding of farmers' attitudes towards risk, determinants, and effect of IC productivity is vital for the implementation of risk management tools in IC production. Previous studies on indigenous chickens in Kenya have concentrated mainly on the production and marketing of birds with limited information on the behavior of farmers towards

risk (Ochieng et al., 2012; Bett et al., 2012; Olwande et al., 2013). In addition, the studies that have been done on risk attitude did not use econometric measures to estimate attitude and hardly considered determinants of these attitudes and their influence on IC productivity (Korir, 2011; Tongruksawattana, 2014; Mose et al., 2018a). Therefore, this study fills the gap by carrying out detailed research to determine how socioeconomic variables of IC farmers affect their risk attitude and the effect of risk attitude on chicken productivity.

## METHODOLOGY

### Study area and sampling procedure

The research was rigorously designed to ensure representativeness. It was carried out in the Nyanza region, which has six Counties: Siaya, Kisumu, Homabay, Migori, Kisii, and Nyamira, as well as one of the highest populations of indigenous chickens in Kenya (MOLD, 2008; Mose et al., 2018a). The study utilized a multi-stage sampling procedure, carefully selecting respondents to maximize representation within the population. In this approach, at level one, purposive sampling was used to select four counties in which TECHNOSERVE operates in Nyanza region for ease of accessing the respondents since the lists of the farmers and the number of IC they kept already existed in these counties. At level two, IC farmers who kept more than 50 birds and were commercially oriented were purposively selected from a list of 1520 IC farmers to form an accessible population of 598 farmers. At level three, proportionate sampling was used to sample 240 respondents from the accessible population of the four counties as shown in Table 1. At the final level, simple random sampling

**Table 1.** Proportionate sampling per county

County	Accessible population per county	% per county	Sample size per county
Migori	147	24.58	59
Siaya	222	37.12	89
Kisumu	104	17.39	42
Homabay	125	20.9	50
Total	598	100	240

Source: own elaboration.

procedure was used to select IC farmers for interview at the county level. This involved assigning random numbers to all the IC farmers who kept more than 50 birds in a particular County. Then, the numbers were selected randomly to form the sample size per County.

### Sample size determination

The study adopted Yamane's (1967) formula of sample size determination as shown in equation 1 (Yamane, 1967).

$$n = \frac{N}{1 + N(e)^2} \quad (1)$$

where  $n$  = required sample size,  $N$  = population, and  $e$  = margin of error at 5% (standard value of 0.05).

Taking the study accessible population of 598 IC farmers, the sample size of the study was computed as follows:

$$n = \frac{598}{1 + 598(0.05)^2} \quad (2)$$

### Data collection

This study employed a structured questionnaire for data collection. The questionnaire was pre-tested to ascertain the validity of the instrument with a sample of 30 IC farmers in Nyamira, a location within the study area but not among the counties selected for the actual data collection. Thereafter, necessary changes were made on the questionnaire before the actual data collection. Data collected included household characteristics, farm size, information on the flock size, price of various types of chicken, types and cost of feeds, cost of labor, cost of drugs, and information on the indigenous chicken farmers' perception of and attitude towards risks associated with IC production. To assess multicollinearity in the independent variables, the Variance Inflation Factor (VIF), a measure of reliability, was used (Andreev et al., 2009). A VIF value less than 10 is acceptable (Gujarati, 2013).

### Ethical consideration

The study sought approval from Maseno University Ethical Review Committee (REF: MSU/DRPI/MUERC/00598/18. Prior to data collection, informed consent was obtained from the IC farmers, emphasizing

the voluntary nature of their participation and ensuring they were fully informed about the implications without any form of pressure or coercion. Throughout the research process, the utmost objectivity was maintained in discussions and analyses. The principle of confidentiality was upheld, guaranteeing that the identities of all IC farmers remained anonymous, and their provided information was treated with the utmost respect and discretion. Measures were taken to ensure the confidentiality of research data, including secure storage protocols such as password protection for digital data and the use of encrypted storage where possible. Paper-based data were securely filed in a locked cabinet to prevent unauthorized access.

### Data analysis

Determination of the effect of socioeconomic variables on risk attitudes of IC farmers

The ordinary least squares (OLS) regression model was used to determine the effect of socioeconomic variables on the risk attitudes of indigenous chicken farmers, as shown in equation 3:

$$K_1 = f(V_1, V_2, V_3, V_4, V_5, V_6, V_7, V_8, V_9, V_{10}, V_{11}, V_{12}, e) \quad (3)$$

where:  $K_1$  – risk attitude of the IC farmer (continuous value ranging 0–1);  $V_1$  – gender of household head (male = 1, otherwise = 0);  $V_2$  – age of farmers (years);  $V_3$  – educational status (years);  $V_4$  – main occupation (farming and other income generating activities = 1, otherwise = 0);  $V_5$  – size of land (acres);  $V_6$  – household size (numbers);  $V_7$  – farming experience (years);  $V_8$  – flock size (numbers);  $V_9$  – production objective (commercial = 1, otherwise = 0);  $V_{10}$  – production system (semi intensive = 1, otherwise = 0);  $V_{12}$  – total cost on drugs (Kshs);  $V_{13}$  – total cost on depreciation (Kshs);  $V_{14}$  – household total expenditure (Kshs); and  $e$  = error term.

The risk attitude of the IC farmers was estimated using the safety-first principle (Mose et al., 2018a). This principle assumes that the individual's objective is to minimize the probability of experiencing variability (a shortfall) in output or income below a certain initial level (specified levels of disaster) (Moscardi and De Janvry, 1977).

### Estimation of the effect of risk attitude on IC productivity

A two-stage least square (2SLS) regression analysis was used in the estimation of the effect of risk attitude on IC

productivity. In this study, productivity, which was the dependent variable, was taken to be the net profit from the sale of IC and its products per 50 birds. Net Profit was obtained by subtracting the total cost incurred in the production of IC from the total income from sales. The original regression equations were given as:

$$\ln Y = \ln a + b_1 K_1 + b_2 Z_1 + b_3 Z_2 + b_4 Z_3 + b_5 Z_4 + b_6 Z_5 + b_7 Z_6 + b_8 Z_7 + b_9 Z_8 + b_{10} Z_9 + b_{11} Z_{10} + b_{12} \ln X_1 + b_{13} \ln X_2 + b_{14} \ln X_3 + b_{15} \ln X_4 + b_{15} \ln X_5 + e \quad (4)$$

where:  $Y$  – is IC productivity;  $K_1$  – risk attitude (continuous value ranging 0–1);  $Z_1$  – gender;  $Z_2$  – age (years);  $Z_3$  – level of education (years);  $Z_4$  – main occupation (farming and other income generating activities = 1, otherwise = 0);  $Z_5$  – total land size (acres);  $Z_6$  – family size (numbers);  $Z_7$  – experience (years);  $Z_8$  – number of IC birds (numbers);  $Z_9$  – objective of the farmer (commercial = 1, otherwise = 0);  $Z_{10}$  – total household expenditure;  $X_1$  – average cost of feed per month in Kenya shillings;  $X_2$  – average cost of the flock (birds) in Kenya shillings;  $X_3$  – average labor cost in Kenya shillings;  $X_4$  – average cost of drugs, veterinary services, and chemicals in Kenya shillings;  $X_5$  – capital input in Kenya shillings (depreciated values of poultry equipment and structures);  $b$ 's – partial regression coefficients; and  $e$  – error term.

Estimation of the above equation using the ordinary least squares (OLS) would lead to biased estimators because the error term in equation 3 is correlated with the error term in equation 4. The risk attitude was a problematic causal variable i.e., it was an endogenous variable whose error term was correlated with IC productivity. A common way to correct for endogeneity is by use of instrumental variable (IV) estimators (Angrist et al., 1996; Greene, 2012).

The first stage of the analysis involved identifying the instrumental variable and using the instrumental variable to create a new variable of risk attitude. The study identified at least one instrumental variable that was correlated with the treatment variable (risk) but uncorrelated with chicken productivity. The study tested various instruments until one was found to fulfill all the instrument validity requirements. The instrument that was used in this study was a dummy that indicated whether the IC farmer had ever bought any kind of insurance. Having taken any kind of insurance, the IC farmer can negatively or positively impact the farmers' attitude

towards risk. At the same time, this variable is not correlated with chicken productivity. The study tested the correlation of the instrument with chicken productivity and found that the correlation coefficient was small in absolute terms and was statistically insignificant. Therefore, the study concluded that the instrument was valid, and equation 4 was estimated with treatment effect IV estimators.

In the second stage, the model-estimated values from stage one were then used in place of the actual values of the problematic variable to compute an OLS model for IC productivity. The final model was as follows:

$$\ln Y = \ln a + b_1 \hat{k}_1 + b_2 Z_1 + b_3 Z_2 + b_4 Z_3 + b_5 Z_4 + b_6 Z_5 + b_7 Z_6 + b_8 Z_7 + b_9 Z_8 + b_{10} Z_9 + b_{11} Z_{10} + b_{12} \ln X_1 + b_{13} \ln X_2 + b_{14} \ln X_3 + b_{15} \ln X_4 + b_{15} \ln X_5 + u_i \quad (5)$$

$\hat{k}_1$  – estimated value of risk attitude and  $Z_1$ – $Z_{10}$ ,  $X_1$ – $X_{10}$  remain as explained in the original models.  $u_i$  is a composite error term uncorrelated with the independent variables.

## RESULTS AND DISCUSSIONS

### Determinants of risk attitudes of the indigenous chicken farmers

Results of the risk attitude of indigenous chicken farmers (the dependent variable) are presented in Mose et al. (2018a). Table 2 presents estimates of the socioeconomic factors that influence IC farmers' risk attitude. The VIF (test for multicollinearity) was less than 10, which is considered acceptable. This indicated that multicollinearity among variables was not present. The value of R Square was 52.4%. This implied that 52.4% of the variation in  $K_1$  (risk attitude) was explained by the independent variables (the socio-economic characteristics of the IC farmers). The adjusted R square was (49.6%).

The main occupation of the household head and household expenditure contributed positively to risk aversion and were significant ( $P < 0.05$ ). The occupation and household expenditure had a positive and significant effect on risk aversion. The indigenous chicken farmers were engaged in other economic activities such as rearing other livestock, crop production, operating businesses, and casual and salaried employment apart from rearing the IC as an alternative source of income (Mose et al., 2018a). It is worth noting that mixed farming (farming of crops and livestock) was practiced in a study area as a traditional practice. This implies that

**Table 2.** Determinants of IC farmers’ attitudes towards risk

Variable	Coefficient	s.e.	t-values
Gender	$-5.168 \times 10^{-5}$	0.000	-0.172
Age	$-1.238 \times 10^{-5}$	0.000	-1.158
Level of education	0.001	0.000	1.427
Occupation	0.001**	0.000	2.265
Total land size	0.001**	0.000	2.151
household size	0.002***	0.000	3.343
Experience	$-6.560 \times 10^{-5}$ ***	0.000	-1.959
flock size	$-6.551 \times 10^{-6}$ ***	0.000	-5.151
production objective	0.001	0.001	0.874
Production system	0.000	0.000	1.143
Total cost of Drugs	$-7.416 \times 10^{-7}$	0.000	-1.277
Total cost of depreciation on poultry structures and equipment	$-4.204 \times 10^{-6}$ ***	0.000	-5.336***
Total household expenditure	$1.112 \times 10^{-8}$ ***	0.000	2.451**
Constant	0.588***	0.001	412.210***
R <sup>2</sup>	0.524		
Adjusted R <sup>2</sup>	0.496		
F – value	19.108		
No. of observation	240		

s.e. – standard errors.

\*\*\*, \*\*, \* – coefficients are significant at 1%, 5%, and 10% level respectively.

the tendency of the IC farmers to be more risk-averse increased with an increase in household income from non-IC activities. This could be because the household off-farm and other on-farm enterprises were considered less risky and income generation through these alternatives was more stable. The finding contradicts with the results of Ullah et al. (2015) and Iqbal et al. (2016), as they documented that an increase in off-farm income reduces risk aversion. This is because higher off-farm incomes may indicate a greater risk-bearing capacity, allowing farmers to enhance their financial resilience and invest in risk reduction strategies, ultimately leading to reduced risk aversion.

The greater the total household expenditure, the more risk-averse the IC farmers become. The total land size had a positive and significant relationship with the

risk-averse behavior of the farmer ( $P < 0.05$ ), implying that IC farmers who had bigger sizes of land were more risk-averse than those with smaller sizes of land. Larger landholdings led to the increased area under crop and livestock production, resulting in increased production and spreading the risk, hence, impacting positively on the risk-averse attitude of the IC farmer. Total land size is also a proxy for wealth. Consequently, the wealthier IC farmers had larger land sizes and were more risk averse. These results agree with the findings of Lucas and Pabuayon (2011) and Ullah et al. (2015), who found a positive effect of farm size on the risk-averse attitude of the farmers. Income and proxies for wealth such as per capita household expenditure and the number of rooms in the homestead are positively associated with risk aversion (Cohen and Einav, 2007; Ihli et al., 2013).

Family size was statistically significant and positively related to the farmers' risk attitude ( $P < 0.01$ ). The larger the family size, the greater the total consumption needs, hence, a positive contribution to the risk-averse behavior of the farmer. However, it is worth noting that IC farmers used both family and hired labor in IC production. This study is consistent with Chinwendu et al., (2012) on poultry farmers in Nigeria. This study contradicts the findings of Dadzie and Acquah (2012) and Ullah et al. (2015), who found a negative relationship between family size and the risk attitude of the farmers. This was because a larger family size also augments the farm's total labor supply, thereby enhancing income-generating potential and reducing farmers' risk aversion.

Farming experience had a significant inverse relationship with risk aversion ( $P < 0.05$ ). Farmers with higher farming experience were less risk-averse compared with those with less farming experience. Farming experience had an inverse relationship with risk aversion. Farming experience enables the IC farmers to understand the various sources of risks and strategies to cope with the risks. According to Aye and Oji (2005), the more experience farmers have, the less risk-averse they are. This result is in line with Ayinde (2008), who reported a negative relationship between farming experience with the level of risk aversion.

The number of the IC had an inverse relationship with risk aversion. The number of IC kept by the farmers was a significant determinant of risk aversion ( $P < 0.01$ ). The total number of IC kept had a negative and significant effect on risk aversion. Farmers having more birds enjoy economies of scale and feel more secure from various risks, leading to a decrease in their level of risk aversion. Additionally, IC farmers with more birds have invested in market intelligence and infrastructure and have better perspectives of the future. Therefore, they are less risk-averse. According to Jing et al. (2001), size of business, higher gross sales, and a higher number of employees are often wealthier and are therefore assumed to be less risk-averse. Farm or business size was found to be inversely related to risk aversion (Jing et al., 2001; Meuwissen et al., 2001; Flaten et al., 2005).

The total cost of depreciation on poultry structures and equipment negatively affected risk aversion ( $P < 0.01$ ). The cost of depreciation had a negative and significant effect on risk aversion. The majority of the farmers provided shelter to birds to minimize production risks; therefore, they got high returns, leading to

a decrease in their level of risk aversion. According to Ajetomobi and Binuomote (2006), the cost of depreciation had a significant effect on the risk aversion of the poultry egg farmers.

The production objective and the production system of the IC farmers had positive and insignificant effects on the risk attitude of the IC farmers. Most of the IC farmers (97.8%) were rearing the IC for commercial purposes (Mose et al., 2018a). The commercial orientation of the farmers largely informed the reason for keeping the IC under a semi-intensive production system (Mose et al., 2018a).

### Effect of farmers' risk attitudes on the chicken productivity

The results of the analysis of the effect of risk attitude on chicken productivity are presented in Table 3. A test of multicollinearity gave a VIF of less than 10, implying that there was no multicollinearity between the variables. The value of R Square indicated that 64.6% of the variation in chicken productivity was explained by the independent variables. The model estimated was a true reflection of the equations, as it had *F*-values that were highly significant at 99%. The risk attitude of the farmer was a negative and significant determinant ( $P < 0.01$ ) of IC productivity. An increase in the risk aversion coefficient led to a decrease in productivity. One percent increase in risk coefficient led to around 49 percent decrease in IC productivity. Cost of feeds and cost of labor were positive and significant determinants of IC productivity ( $P < 0.01$ ), as presented in Table 3. The number of IC kept by the farmer was positive and significant ( $P < 0.01$ ). The main objective of the farmer keeping IC was negative and significant ( $P < 0.05$ ).

The IC farmers were risk-averse; therefore, they kept the birds under extensive and semi-intensive production systems. The two production systems are usually characterized by low input and operate on a cost minimization strategy. As a result, producers are more content with maintaining a stable level of production than increasing productivity, which would come with more risks (Hurley, 2010). This consequently results in low productivity as presented in Table 3. These results contradict the studies by Antle and Crissman (1990) and Haneishi et al. (2014), which suggest that the higher the degree of farmers' aversion, the higher the output they achieve. These studies measured productivity in terms of quantity produced, while our study considered

**Table 3.** Influence of farmers' risk attitudes on chicken productivity

Variable	Ba	s.e	t-values
LNK <sub>1</sub>	-49.142***	15.383	-3.361
Gender	-0.043	0.081	-0.534
Age	-0.003	0.003	-1.145
Education	-0.058	0.083	-0.698
Occupation	-0.009	0.085	-0.107
Land size	0.031	0.025	1.247
Family size	-0.02	0.015	-1.352
Experience	0.009	0.009	0.932
No. of IC	.001***	0	2.873
F. objective	-0.380**	0.178	-2.128
Expenditure	2.036×	0	1.668
LNTCFS	0.354***	0.074	4.802
LNTCFD	0.043	0.047	0.926
LNTCL	0.521***	0.101	5.15
LNTDEPR	0.067**	0.034	1.967
(Constant)	-70.305***	16.515	-4.257
R <sup>2</sup>	0.646		
Adj. R <sup>2</sup>	0.623		
F-value	27.306***		
No. of Obs.	240		

s.e. – standard errors;  $\beta$  – the coefficient.

\*\*\*, \*\*, \* – coefficients are significant at 1%, 5%, and 10% level, respectively.

productivity in terms of income from the sale of IC and its products.

Socioeconomic factors were important in determining the risk aversion of the IC farmers. Occupation, total land size, family size, and total household expenditure had a positive and significant effect on the risk aversion behavior of the farmer. Farming experience, number of IC birds, and cost of depreciation had a negative impact on risk aversion.

Emphasis should also be laid on the need to consider the risk attitudes and socioeconomic characteristics of the IC farmers to serve as a guide to formulating and implementing policy on risk management that will improve the IC sector.

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## DATA AVAILABILITY

The datasets generated during and /or analysed during the current study are not publicly available due to Mase-no University policy but are available from the corresponding author or reasonable request.

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