Statistical Modeling and Significance of Inputs Studies for the Rice Crop Productivity in Pakistan

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Abstract
Lower production of rice crop and increasing population trend is a tangible question for Pakistan. The current study based cross-sectional data collected from crop reporting service Punjab. The multiple linear regression (MLR) model is applied to investigate the significant factor for rice crop yield enhancement. The inputs variable i.e. owned land, seed rate, DAP, Urea, no. of water, no. of ploughs, no. of levels, crop life periods days, other fertilizers, variety super yes or no, seed type yes or no, spray no or yes and disease attack yes or no are studied in MLR model for rice productivity. All the factors found to be statistical significant except land, level, crop life period and super variety. Adj R² is found to be 0.422 and it is good fit for cross-sectional data.

Keywords: Factors Significant, Multiple Linear Regression Model, Rice Crop.

Introduction
Wheat, rice, maize, jowar, bajra and barley are the food crops of Pakistan (PBS, ESP 2006-07). Table 1 depicts that the yield of rice is low about -52.50, -32.76, -16.31, -50.76, -51.96, -13.98, -59.57, -7.75 as compared to competitive countries like Korea, Indonesia, Bangladesh, China, Japan, Sri Lanka, USA and Malaysia (Badar, 2007). The population growth rate in Pakistan is about 2.05% and it is reported high in Asian countries. Low production and increasing population trend is a tangible question for Pakistan (Taye, 2014; Sohail et al. 2021).

Table 1: Comparison of rice crop yield with other countries

| Countries   | Avg yield kg/hec of rice crop (2002-03 to 2006-07) | % dec   |
|-------------|----------------------------------------------|--------|
| Korea       | 6438                                        | -52.50 |
| Indonesia   | 4548                                        | -32.76 |
| Bangladesh  | 3654                                        | -16.31 |
| China       | 6211                                        | -50.76 |
| Japan       | 6366                                        | -51.96 |
| Sri Lanka   | 3555                                        | -13.98 |
| USA         | 7563                                        | -59.57 |
| Pakistan    | 3058                                        | 0.00   |
Shah et al. (2014) statistical analyzed the agricultural crops by two stage systematic sampling scheme for district Bahawalpur on the data taken from CRS. They reported that lack of govt. cost and labor policies have decreased the yield of rice crop in district Bahawalpur. Singh et al. (2014) stated that Chhattisgarh region of India and applied different regression equations i.e. linear, logarithmic, inverse, quadratic etc. on paddy crop yield and reported that linear and logarithmic regression model found to be better fitted model. Kaloo et al. (2014) used simple linear regression to study rice crop and reported coefficient of determination 34.88% and concluded that production of rice depends on time.

**Problem Statement**

In Pakistan average yield rice crop is low as compared to other countries while the population is increasing across the year. The government is taking several steps to cope with the population explosion. It is reported that the population of Pakistan is 188.02 million in 2014 (ESP 2013-14) and it will touch 363 million in 2050 (world population data sheet 2013, ESP 2013-14). Crop production is a function of different physical and non-physical factors (Taye, 2014, Sohail et al., 2017). Physical factors means the factors which are controlled by nature and non-physical factors means factors which are controlled by human beings such as various inputs of fertilizers, irrigation, varieties, seed rate, seed treatment and pesticides etc.

**Objectives of the Study**

It is necessary to statistically analyze and build the regression model to investigate the significant of the different inputs to get the better production of rice crop to meet the challenge of food availability in Pakistan.

**Material and Methods**

**Data collection**

Crop reporting service (CRS) is govt. organization and is a wing of agriculture department of Punjab. The domain of the department is forecasting of area, yield and production of all major and minor crops in Punjab. Secondary data is collected from CRS district Bahawalpur for 2007-08 to 2014-15. About 423 fields and 10998 entries for rice has been utilized and investigated in SPSS.

**Regression Model Analysis**

Multiple linear regression (MLR) are also applied to investigate the significant on rice crop productivity

\[ Y_i = \beta_0 + \beta_1 L + \beta_2 SQ + \beta_3 \text{DAP} + \beta_4 \text{Urea} + \beta_5 W + \beta_6 P + \beta_7 \text{LV} + \beta_8 \text{CLP} + \beta_9 \text{OFR} + \beta_{10} \text{VARI} + \beta_{11} \text{ST} + \beta_{12} \text{SP} + \beta_{13} \text{DES} + \epsilon_i \]  \hfill (1)

where \( \beta_0 \) is intercept, \( \beta_i \) are the slope of regression and \( \epsilon_i \) is error term.

\( Y_i \) = Avg. yield in mds/acre rice crop, \( L \) = land in acres, \( SQ \)=Seed quantity, \( \text{DAP} \)= DAP kg/acre, \( \text{Urea} \)= Urea kg/acre, \( W \)= no. of water, \( P \)= No. of plough, \( \text{LV} \)= No. of levels, \( \text{CLP} \)=
Crop life periods, OFR= other fertilizers, VARI= Variety super, ST= Seed type, SP= Spray, DES= Disease attack.

**Diagnosis Regression**

Normality and Linearity is checked graphically by P-P plots and histogram with normal curve. Autocorrelation tested by Durban Watson test and multicolinearity tested by the variation inflation factor (VIF), (Montgomery, 2003).

\[
VIF = \frac{1}{1-R^2_i}
\]

(2)

VIF< 10 indicates absence of multicolinearity. F-test: is used to test the overall significance of the model.

\[
F = \frac{SSR_{reg} / k - 1}{SSR_{res} / n - k}
\]

(3)

where ‘k’ is no of independent variables and ‘n’ is no of observations. t-test is used to check the significance of coefficients

\[
t = \frac{\hat{\beta} - \beta}{\text{SE}(\hat{\beta})}
\]

(4)

The R^2 is used to check the explained variation in model

\[
R^2 = \frac{\sum (\hat{Y} - \bar{Y})^2}{\sum (Y - \bar{Y})^2}
\]

(5)

**Data Analysis**

For most of the statistical analysis normality in the data is pre-requisite for (Qayyum et al. 2012). Figures 1 and 2 shows the normality by histogram and P-P plots of district Bahawalpur and shows complete linear and normal behavior.

![Histogram of rice crop yield](image1.png)

![Normal P-P Plot of rice crop yield](image2.png)

**Figure 1**: Histogram and P-plot of rice crpe
Multiple Linear Regression Model for Rice Productivity

Effects of all the factors investigated by the multiple linear regression. Table 2, value of $R^2$ and Adj $R^2$ shows that model is good fit in view of cross-sectional datasets and 42.2% variation is explained by the model. Mean square error (MSE) reported as 68.059. The Value of the Durbin-Watson test is 1.096 indicate there is no autocorrelation in model.

| Model     | Sum of Squares | df   | MSE   | F     | Sig | $R^2$ | Adj R$^2$ | Durbin Watson |
|-----------|----------------|------|-------|-------|-----|-------|-----------|--------------|
| Regression| 21857.12       | 13   | 1681.317 | 24.70 | .000 | 0.440 | 0.422     | 1.096        |
| Residual  | 27836.17       | 409  | 68.059 | ------| -----| ------| --------- | -------------|
| Total     | 49693.3        | 422  | ------| ------| -----| ------| --------- | -------------|

Significance of Regression Coefficients

Table 3, determined that the own land coefficient is -0.021 which implies that a unit increase in the owned land in acre will decrease the rice production 0.021% and is statistically insignificant. The reason is that rice crop is sown in Bahawalpur district on small scale and mostly rice crop farmers are small farmers. Seed quantity coefficient is -0.653 which shows that a unit increase in recommended seed rate per acre will decrease the production about 0.653 percent and it is significant. Coefficient of the DAP and urea are 0.069 and 0.053 which means increase in DAP and urea will enhance the rice production about 0.069% and 0.053% and these coefficients are statistically significant The model depict that the coefficient of other fertilizers is 6.86, indicate increases in the other fertilizers will enhance the rice production up to 6.86% and is statistically significant, water for the rice crop are essential for yield maximization and its coefficient is 0.371 means one percent increase in the no. of water will maximize the yield 0.371% and it is statistically significant indicating no. of water is affecting the rice production. The coefficient of Plough is 1.795 which means increase in the no. of plough will increase the rice crop production up to 1.795% and it is found to be statistically significant. Level coefficient value is 0.129 indicate that one more use of no. of level will rise the rice production up to 0.129% and is statistically insignificant. For the crop life time from sowing to harvesting, coefficient is -0.001 indicating that one day late sowing leads to decrease the rice production up to 0.001% and it is statistically insignificant. For basmati super coefficient value is found to be -0.821 which means one percent increase super basmati will decrease rice production 0.821% and is statistically insignificant which indicates to shift the area toward he advanced rice varieties for better productivity There are two types of seed used home seed or certified and its coefficient is 6.837 indicating that one percent increase in the certified seed will increase the rice production 6.837% and is statistically significant. Spray coefficient value is 5.77 indicating that one percent increases in spray will increase the rice production 5.77% and is statistically significant which shows that it is affecting factor for rice production. Disease attack coefficient value is -7.398 indicating that one percent increase the share of disease crop will decrease the rice production about 7.398% and it is statistically significant which shows that it is affecting factors for rice crop.
Figures 2, histogram and P-P plot indicates that error term follows normality and linearity. Durban-Watson test is less than 2 indicate there are no autocorrelation and model is good fit. All values of VIF and tolerance supporting that there is no multicolinearity.

Table 3: Regression model analysis for rice crop district Bahawalpur

| Model MLR    | βi       | T       | Sig    | Tolerance | VIF |
|--------------|----------|---------|--------|-----------|-----|
| Constant     | 17.463   | 3.724   | 0.000  |           |     |
| Owned Land   | -0.021   | -0.646  | 0.519  | 0.966     | 1.035 |
| Seed rate    | -0.653   | -2.705  | 0.007  | 0.896     | 1.116 |
| DAP          | 0.069    | 3.987   | 0.000  | 0.856     | 1.168 |
| Urea         | 0.053    | 3.369   | 0.001  | 0.859     | 1.164 |
| No. of water | 0.371    | 2.574   | 0.010  | 0.814     | 1.229 |
| No. of ploughs| 1.795   | 4.026   | 0.000  | 0.865     | 1.156 |
| No. of levels| 0.129    | 0.215   | 0.830  | 0.97      | 1.031 |
| Crop life periods days | -0.001 | -0.019 | 0.985 | 0.88 | 1.136 |
| Other fertilizers | 6.86 | 5.742 | 0.000 | 0.889 | 1.125 |
| Variety Super yes or no | -0.821 | -0.951 | 0.342 | 0.946 | 1.057 |
| Seed Type yes or no | 6.837 | 5.826 | 0.000 | 0.898 | 1.113 |
| Spray no or yes | 5.77 | 5.815 | 0.000 | 0.654 | 1.529 |
| disease attack yes or no | -7.398 | -7.203 | 0.000 | 0.705 | 1.419 |

Conclusions

From multiple linear regression model it is found that coefficients of owned land, seed rate, DAP, Urea, no. of water, no. of ploughs, no. of levels, crop life periods days, other fertilizers, variety Super yes or no, seed type yes or no, spray no or yes and disease attack yes or no are reported as -0.021, -0.653, 0.069, 0.053, 0.371, 1.795, 0.129, -0.001, 6.86, -0.821, 6.837, 5.77 and -7.398 respectively. All the factors found to be statistical significant except land, level, crop life period and super variety. Adj R² is found to be 0.422 and it is good fit for cross-sectional data.
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