

Communication



Implications of Experimental Design on Predicting Economic Optimum Nitrogen Rates in Rice

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Abstract: Nitrogen (N) response studies in rice (*Oryza sativa* L.) are conducted to provide grower recommendations with economically optimum N rates (EONRs). This study was conducted to determine if experimental design alters the predicted EONR for rice. The effects of experimental design and soil texture on predicted EONR were investigated near Arcola, Greenville, Minter City, and Shaw, MS on soil textures ranging from sandy loam to clay. The response of rice grain yield to seven N fertilizer rates was fitted with a quadratic equation, and the quadratic trend was compared between the randomized complete block (RCB) and split-plot (SP) designs. No differences were detected between RCB and SP designs for rice grain yield response to N rate; therefore, either design, RCB or SP, would be appropriate for use in N response studies for rice.

Keywords: rice; nitrogen rate; experimental design; EONR; split-plot; randomized complete block

1. Introduction

Rice (*Oryza sativa* L.) is produced on approximately 160 million hectares worldwide and is the primary staple for over half of the global population [1]. Nearly 90% of rice is grown in Asia, while less than 2% is produced in the US [1]. In Mississippi, rice is the fourth largest crop by hectarage and 500,000 metric tons are produced annually [2]. Across the southern region of the US, including Mississippi, rice is produced in the drill-seeded, delayed flood production system where rice is grown upland until the four- to the five-leaf stage, at which time a flood is established [3].

Historically, nitrogen (N) fertilizer recommendations for rice have been defined according to the current inbred or hybrid cultivars being grown and are modified according to soil texture, tillage system, seedbed condition, and previous crop [4,5]. Fertilizer recommendations are derived from response data generated each year by university scientists across multiple locations [6]. Annual N response experiments are necessary because of the dynamic nature of N, especially in the dry-seeded, delayed-flood rice culture common to much of the southern US.

Currently, N response experiments for rice are conducted in small-plot trials with a minimum of three replications arranged in a randomized complete block (RCB) design [4–6]. In this experimental design, factors such as rice cultivars and N rates are randomized within each replication, and adjacent plots have different fertilizer treatments. Plots are harvested and yield data are subjected to a quadratic response curve to predict economically optimum nitrogen rates (EONRs) for newly released rice cultivars in the mid-southern US [6].



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Copyright: © 2021 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). In an RCB design, the interaction of adjacent experimental units can increase error and decrease the accuracy of the response model through border effects, particularly in grain crops with narrow row spacing [7]. Gomez and Gomez (1984) reported differences in grain yield between the outer and inner rows in fertilized and non-fertilized plots. An interaction between the adjacent N rate and the outside rows was detected; however, the N rate of adjacent plots did not impact yield on the inner rows. When adjacent units receive different fertilizer treatments, border effects can be expected if a levee is not constructed between experimental units [8]. However, constructing levees between plots is not practical for US rice research programs, primarily due to a lack of time for field preparation prior to planting.

A practical solution to mitigate experimental error associated with outside rows is to remove the outermost rows of each experimental unit before data analysis, as is practiced by several US researchers. For example, nitrogen response experiments conducted in Arkansas use a custom-built combine header to harvest the middle four rows [9], the middle five rows [10–12], or five to eight of nine rows [13]. However, the International Rice Research Institute (IRRI) concluded that rice grain yield was no different if outside rows were included or excluded in the analysis.

Another method to minimize border effects is through experimental design. Grouping homogeneous treatments, as in a split-plot (SP) design with fertilizer as the main-plot factor, allows the grouping of plots with similar fertilizer rates, thus minimizing fertilizer competition [7]. The disadvantage of the split-plot design is that the error terms associated with the main units will likely be greater compared to an experimental design with no block component [14]. This is especially true if the main unit error is a large source of the total variability. The objective of this study was to determine if experimental design, RCB vs. SP, alters the predicted EONR for rice N rate response experiments on clay and silt loam textured soils in Mississippi.

2. Materials and Methods

Replicated N response studies were conducted at six locations in Mississippi from 2013 and 2014 on soil textures ranging from sandy loam to clay (Table 1). Two newly released cultivars, 'Colorado' [15] and 'Mermentau' [16], were evaluated to compare two different experimental designs: RCB and SP. The experimental design was a split-plot, with the environment (ENV) as the main plot and design (RCB or SP) as the sub-plot. Within sub-plot treatment (design), the SP treatment was arranged with N rate as the main plot and the cultivar was the sub-plot. One replicate of each experimental design was evaluated in each ENV, with four replications of N rate and cultivar for both SP and RCB. At each site year, the SP and RCB treatments were arranged directly adjacent to one another. The SP design was compared to a RCB design separately for clay and silt loam soil textures.

All individual experimental units consisted of eight-row plots (20 cm spacing) at 4.6 m in length seeded at 80 kg ha⁻¹. Adjacent plots were spaced at 40 cm. A 1.6-m alley separated each experimental unit replication in front of and behind each plot. For all experimental units, rice was grown in an upland condition until the five-leaf growth stage, at which time N treatments were broadcasted onto dry soil as urea (46-0-0) within 2 days prior to flood establishment. Nitrogen rates used were 0, 67, 100, 135, 170, 200, and 235 kg N ha⁻¹ for silt loam textured soils and 0, 100, 135, 170, 200, 235, and 270 kg N ha⁻¹ for clay textured soils. Fertilizer was applied using a Hege 80 belt cone (Wintersteiger, Inc., Salt Lake City, UT, USA) and a zero-max (Zero-Max, Inc., Plymouth, MN, USA) situated onto a custom-manufactured, self-propelled distributor. Agronomic and pest management practices were conducted according to Mississippi State University recommendations [4]. Plots were drained at maturity, approximately 2 weeks prior to harvest.

			Soil					
Site	Year	ear Location Series Texture Taxonomic Classification		Taxonomic Classification	Crop Rotation			
1	2013	Shaw, MS	Sharkey	Clay	Very-fine, smectic, thermicChromic Epiaquerts	Rice-soybean		
2	2013	Greenville, MS	Commerce	Sandy loam	Fine-silty, mixed, superactive, nonacid, thermic Fluvaquentic Endoaquepts	Rice-soybean		
3	2013	Minter City, MS	Dubbs	Loam	Fine-silty, mixed, thermic TypicHapludalfs	Rice-soybean		
4	2014	Shaw, MS	Sharkey	Clay	Very-fine, smectic, thermicChromic Epiaquerts	Rice-soybean		
5	2014	Shaw, MS	Forestdale	Silty clayloam	Fine, smectitic, thermic TypicEndoaqualfs	Rice-soybean		
6	2014	Arcola, MS	Sharkey	Clay	Very-fine, smectic, thermicChromic Epiaquerts	Rice-soybean		

Table 1. Individual site locations, soil series, taxonomic classification, and crop rotation information for rice nitrogen (N) response tests were conducted comparing randomized complete block (RCB) and split-plot (SP) experimental designs in Mississippi in 2013 and 2014.

Rice plots were harvested with a Wintersteiger Delta (Wintersteiger USA, Salt Lake City, UT, USA) small-plot combine when grain moisture reached a range of 150 to 180 g kg⁻¹. Plot grain yields were measured using a Harvest Master weighing system (Juniper Systems, Inc., Logan, UT, USA) equipped on the combine. Yields were adjusted to a moisture content of 120 g kg⁻¹ for analysis.

Rice grain yield data were subjected to analysis of variance (ANOVA) using a general linear mixed model. Initially, a separate ANOVA was performed on each environment for each type of design. Rough rice grain yield response was analyzed with N rate, variety and their interactions as fixed effects. For comparisons purposes, random effects of Block and Block*N rate were included for both the RCB and split-plot design; however, the Block*N rate should not be necessary for the RCB design. N rate was treated as a quadratic trend in the model instead of a classification effect. A quadratic response model was selected for use in response analysis due to its superiority of fit over other models in rice small plot experiments [6]. The quadratic response is defined by:

$$Y = a + bN + cN^2 \tag{1}$$

where Y is rough rice grain yield (kg ha^{-1}) and N is the rate of N application (kg ha^{-1}); a is the yield when no N is applied (intercept), b is the linear coefficient and c is the quadratic coefficient [6].

Analysis of variance was also performed on data combined over environments for each soil type and design, with environments and interactions with environments included as random effects. Considering site-year, an environmental or random effect permits inferences about treatments to be made over a range of environments [17,18]. Based on this combined analysis, nonsignificant (p > 0.05) model terms were removed, and a final ANOVA was performed for each soil texture to test for differences in N rate quadratic trend coefficients for RCB and SP experimental designs. Estimates for parameters for each trend and test to compare the trends of RCB and SP designs were calculated using the GLMMIX procedure [19] in SAS 9.4 (SAS Institute Inc., Cary, NC, USA).

Grain yield response equations to N rate were used to calculate EONR using coefficients derived from Equation (1). Based on the final ANOVA, separate EONRs were calculated using the trend parameter estimates of significant model terms. EONRs were calculated by equating the first derivatives of the response equations to a fertilizer-to-rice price ratio and solving for N [20]. The prices of fertilizer ($$1.22 \text{ kg}^{-1} \text{ N}$) and rice ($$0.30 \text{ kg}^{-1}$ rice) were chosen based on 2013 and 2014 planning budgets [21,22].

3. Results

Based on the final ANOVA, no significant differences were discovered in a trend of RCB compared to SP design (F = 0.02, p = 0.97) for silt loam textured soils. In addition, no differences were detected in intercept values for the design × cultivar interaction. (F = 1.3, p = 0.26). Therefore, these terms were eliminated from the model to obtain an F-test for the overall design effect, which was insignificant (F = 1.0, p = 0.44). The trend of RCB and SP design and model estimates on silt loam soil texture are shown in Figure 1.

For clay textured soils, the interaction of trend × cultivar did affect the grain yield response to N rate (F = 10.35, p = 0.0002); however, no trend × cultivar × design interaction was detected (F = 0.22, p = 0.8). Additionally, pooled over cultivar, design did not influence the trend (F = 1.18, p = 0.32). These terms were removed from the model to obtain an overall test for design, which was not significant (F = 1.39, p = 0.36). For each cultivar, Colorado and Mermentau, the trend of RCB and SP design and model estimates for environments with clay soils are shown in Figure 2.



Figure 1. Rice grain yield response to N fertilizer rate for an experiment comparing the trend of a randomized complete block design to the trend of a split-plot experimental design for environments with a silt loam soil texture in 2013 and 2014.



Figure 2. Rice grain yield response of two cultivars, Colorado (**A**) and Mermentau (**B**), to N fertilizer rates for an experiment comparing the trend of a randomized complete block design to the trend of a split-plot experimental design for environments with clay textured soil in 2013 and 2014.

The response trend of rice grain yield to N rate was similar for RCB and SP design; therefore one EONR was calculated for each soil texture. The EONR for rice grown in Mississippi on silt loam soils for 2013 and 2014 was determined to be 205 kg N ha⁻¹, and the predicted rice grain yield for EONR was 12160 kg ha⁻¹. The EONR for rice grown in Mississippi on clay soils in 2013 and 2014 was determined to be 265 kg N ha⁻¹, and the predicted rice grain yield at EONR is 11880 kg ha⁻¹.

4. Discussion

The objective of this study was to determine if experimental design, RCB vs. SP, affects the predicted EONR for rice N rate response experiments on clay and silt loam textured soils in Mississippi. The experimental design had no effect on the response trend of rice grain yield to N rate or predicted EONR for both clay and silt loam soil textures. These data validate the use of RCB design for N response studies conducted in Mississippi. The plot-to-plot movement of N fertilizer to adjacent units does not influence the trend derived from rice grain yield data for RCB as compared to SP design. No differences in the intercept coefficient comparing RCB and SP indicates that movement of N from experimental units treated with high N rate, such as 270 kg N ha⁻¹, to a lower N rate (i.e., 0 kg ha⁻¹) is minimal or does not occur.

Grouping similar N rate treatments together, as in SP experimental design, did not positively affect the precision of this experiment (Table 2). Ideally, the main unit (MU) rep x rate component of error for the RCB design should be equal to 0. In this study, however, the MU error for RCB > 0 in three of six environments. For the SP design, a MU rep \times rate component of error > 0 indicates that experimental units within the overall block were not uniform. In this experiment, the SP MU error was not different from 0 in five of six environments (Table 2).

Table 2. Initial ANOVA estimates of variance and standard errors (SE) for random effects, covariance for random effects, and variability percentage described for main and subunit errors for an N rate response experiment comparing a split-plot (SP) design to a randomized complete block (RCB) design.

			RCB		SP		Variability ⁺		
Soil	Env [‡]	CovParm §	Estimate	SE	Estimate	SE		RCB	SP
Silt loam	2	rep	4,387	(15,578)	204,806	(197,326)	Block		
Silt loam Silt loam	2 2	rate × rep Residual Total (excluding block)	43,452 108,823 152,274	(33,279) (30,780)	80,900 349,095 429,995	(91,485) (98,739)	MU err SU err	28.5% 71.5%	18.8% 81.2%
Silt loam	3	rep	72,813	(89,136)	59,650	(77,605)	Block		
Silt loam Silt loam	3 3	rate × rep Residual Total (excluding block)	0 500,643 500,643	(104,360)	115,956 240,080 356,036	(79,752) (69,456)	MU err SU err	0.0% 100.0%	32.6% 67.4%
Silt loam	5	rep	770,899	(679,224)	1,039,663	(921,203)	Block		
Silt loam Silt loam	5 5	rate × rep Residual Total (excluding block)	0 852,109 852,109	(175,777)	0 1,237,312 1,237,312	(255,238)	MU err SU err	0.0% 100.0%	0.0% 100.0%
Sharkey	1	rep	17,263	(24,768)	42,255	(49,267)	Block		
Sharkey Sharkey	1 1	rate × rep Residual Total (excluding block)	6,370 165,158 171,528	(35,564) (46,714)	38,435 171,337 209,772	(44,579) (48,461)	MU err SU err	3.7% 96.3%	18.3% 81.7%
Sharkey	4	rep	25,382	(58,434)	1,296,037	(1,147,604)	Block		
Sharkey Sharkey	4 4	rate × rep Residual Total (excluding block)	111,307 397,462 508,768	(109,078) (112,419)	630,452 263,833 894,285	(232,871) (74,623)	MU err SU err	21.9% 78.1%	70.5% 29.5%
Sharkey	6	rep	66,962	(69,678)	233,282	(207,379)	Block		
Sharkey Sharkey	6 6	rate × rep Residual Total (excluding block)	0 255,516 255,516	(52,709)	87,224 112,270 199,494	(46,468) (32,253)	MU err SU err	0.0% 100.0%	43.7% 56.3%

⁺ Variability, % of variability described by main-unit error (MU err) and sub-unit error (SU err). [‡] Env, environment. [§] CovParm, random-effect variance component Estimate, variance component estimate.

Using a split-plot experimental design for rice N response trials may reduce the amount of time spent on preparation (i.e., measuring fertilizer) and minimize error during the application of fertilizer to individual units in RCB designs. However, RCB design experiments allow rice agronomists and breeders to make side-by-side visual comparisons

of multiple cultivar and N rate combinations. Visual observation of experimental plots is vital for phenotypic response comparisons, as well as pest and disease infestations that may differ among cultivar and N rates. Although both RCB and SP experimental designs provide advantages to research scientists, our data suggest that the use of one experimental design over another does not influence the response of rice grain yield to N rate. This provides research scientists versatility in choosing an experimental design appropriate for the research program without sacrificing accurate rice grain yield response to N fertilizer rates.

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