

## DESIGN AND ANALYSIS OF $2^3$ FACTORIAL EXPERIMENTS OF VARIABLES AFFECTING STUDENTS' ACADEMIC PERFORMANCE

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### Abstract

*In this paper, a  $2^3$  factorial experiment is designed to examine the influence of such factors as teaching method, gender and level of study on students' academic performance. The subjects were tested on effect of teaching method, gender and level of study on their academic performance. The data obtained from the experiment were analyzed using the Analysis of Variance technique of  $2^k$  factorial designs devised by Yates (1937), known as Yates Algorithm. In the analysis process, the magnitude and direction of the factor effects were first examined to determine the likely important variables. It was found that each of the Level, Method, and Level-Method interaction effects has large impact on students' academic performance while Gender and all the other interaction effects do not appear to have impact on students' performance. The significance of these effects with large impact was then confirmed by the analysis of variance, which shows that teaching method, level of study, and level-method interaction, have significant effects on students' academic performance, at 5% level of significance, while gender and each of the other interactions have no effect on students' performance.*

**Keywords:** Factorial experiments, academic performance, algorithm, interaction.

### Introduction

The quality of a nation's education system directly affects its economy through the quality of the workforce available to employers, the demographics of the consumer market, the productive capability of the economy, the pace of innovation, and the relative standing of the nation globally. The quality of education determines the life opportunities available to individuals and their ability to exercise their right to life, liberty and the pursuit of happiness. For a nation's education system to attain high quality level, timely assessments and review of the methods by which students are taught in schools, among other factors, is very vital. This paper is on an experiment that seeks to examine the role of teaching methods in schools, level of study and gender, on academic performances of students. The paper investigates the influence of teaching method, gender and level of study on students' academic performance using a  $2^3$  factorial design.

Design of experiment is the design of all information-gathering exercises where variation is present, whether under the full control of the experimenter or not. When several factors are of interest in an experiment, a factorial experimental design is the most efficient. A factorial experiment is an experiment whose design consists of two or more factors, each with discrete possible values or "levels", and whose experimental units take on all possible combinations of these levels across all such factors. The design technique involves varying several factors simultaneously and drawing out the individual

effect of the factors and looking for any possible combination (interaction) effects.

Factorial designs are frequently used in experiments involving several factors where it is necessary to investigate the joint effect of the factors on a response (Montgomery, 1996). These experiments enable us to investigate all possible combinations of the levels of the factors in each complete replication. The  $2^k$  type of these designs is used here with  $k = 3$ . This type of design provides the smallest number of runs for which  $k$  factors can be studied in a complete factorial design.

The teaching method consists of two levels which include the traditional lecture method and the Computer Assisted Learning method. Computer Assisted Learning (CAL) is a computer program or file developed specifically for educational purposes.

This study examines the importance of CAL, among the level and gender factors, to students of tertiary institutions. A 12-year meta-analysis of research by the U.S. Department of Education found that higher education students in online learning generally performed better than those in face-to-face courses (Means et al, 2009).

The popularization of this form of learning and the increased ownership of personal computers led to the development of widely distributed educational CDROMS such as Encarta (Roschelle et al, 2005).

Information technology (IT) is an enabler and facilitator of human capability. As technology continued to grow

and with the introduction of the Internet, information on CAL programs became more interactive, reflecting a social need for flexible learning outcomes.

Factorial designs are more efficient than one factor at a time experiments. The experiment allows for estimation of experimental error in two ways: the experiment can be replicated, or the sparsity –of –effects principle can often be exploited. These designs enable us to examine any possible interactions to avoid misleading conclusions. Factorial designs also allow us to estimate effects of a factor at several levels of the other factors, thereby yielding conclusions that are valid over a range of experimental conditions.

### Methodology

#### Data collection

The experiment involves randomly selected national diploma students (96), part – time programme, from the business studies department of Niger State Polytechnic, Zungeru, Bida campus. Forty eight (48) of these students consisting of twenty four (24) males and twenty four (24) females, all selected randomly, were from ND1 and the same number from ND2. The selected students from each level were then randomly subdivided into two groups of 24 each, with each group made up of 12 males and 12 females. We wish to stress here that from the beginning of the experiment, all the selections and groupings were

done randomly using the technique of simple sampling, to ensure experimental law and order. From the first group of each level were then taught Accounting course with the traditional lecture method for two months while those in the second group received the same lecture with the CAL package, which was presented in tutorial in modules, for the same duration. Thus at the end of the period, a test was conducted separately for each of the two groups in each level and the results were recorded. Thus the three factors in this design are level (ND1 and ND2), the lecture method (Traditional and CAL, i.e., the Control and Experimental) and gender (Male and Female).

#### Analysis

The method of analysis used to analyze the experimental data (test scores) is the Analysis of Variance (ANOVA) technique of  $2^k$  factorial designs devised by Fisher (1937), known as Yates' Algorithm. The analysis examines the significance of each of the three effects, and each of all the possible interactions, on the academic performance of the students. The layout of Yates' Algorithm for the  $2^3$  factorial experiment is given below:

Treatment combination	Response	(1)	(2)	(3)	Effect	Effect estimate $(3) \div n2^{k-1}$	Sum of squares $(3)^2 \div n2^k$
(1)					I		
a					A		
b					B		
ab					AB		
c					C		
ac					AC		
bc					BC		
abc					ABC		

The total sum of squares is obtained using the usual formula

$$\sum_i \sum_j \sum_k \sum_l Y_{ijkl}^2 - \frac{Y^2}{n2^k}$$

The error sum of squares may be found by

$$SSE = SST - SS_{subtotals(ABC...K)}$$

The sum of squares of any effect is given by

$$SS_{eff} = \frac{(Contrasts)^2}{n2^k}$$

Where

$$Contrasts_{eff} = (a \pm 1)(b \pm 1)(c \pm 1) \dots,$$

and the sign in the parenthesis is negative if the factor is included in the effect and positive otherwise; k is the number of factors and n is the number of replicates.

#### Presentation of data

The summary of the results obtained are shown in tables below:-

Table 1: The performance Data Set

Factor Levels			Scores out of 20 obtained by twelve students											
$L^-$	$M^-$	$S^-$	14	6	9	6	12	6	12	9	8	5	12	10
$L^+$	$M^-$	$S^-$	9	10	8	7	10	12	12	6	8	7	13	8
$L^-$	$M^+$	$S^-$	9	9	17	8	13	14	16	12	15	10	18	12
$L^+$	$M^+$	$S^-$	20	18	21	16	20	18	13	15	14	11	17	19
$L^-$	$M^-$	$S^+$	16	15	10	8	5	8	5	11	6	7	10	13
$L^+$	$M^-$	$S^+$	11	14	15	8	10	12	5	12	10	11	9	9
$L^-$	$M^+$	$S^+$	17	13	11	14	11	12	11	14	15	10	16	13
$L^+$	$M^+$	$S^+$	14	18	20	11	10	18	21	10	20	16	9	16

Where

$L$  = level of study,  $L^-$  = ND1,  $L^+$  = ND2;

$M$  = Method by which the student was taught,  $M^-$  = Traditional lecture method (i.e., Control),  $M^+$  = CAL method (i.e., Experimental);

$S$  = Sex,  $S^-$  = female,  $S^+$  = male.

Table 2: The design outlay

	$M$			
	$M^-$		$M^+$	
	$S^-$	$S^+$	$S^-$	$S^+$
$L^-$	14,6,9,6,12,6,12,9 8,5,12,10 (109)	16,15,10,8,5,8,5,11,6,7 10,13 (114)	9,9,17,8,13,14,16 12,15,10,18,12 (153)	17,13,11,14,11 12,11,14,15,10 16,13 (157)
$L^+$	9,10,8,7,10,12,12 6,8,7,13,8 (110)	11,14,15,8,10,12,5,12,10 11,9,9 (126)	20,18,21,16,20,18 13,15,14,11,17,19 (202)	14,18,20,11,10 18,21,10,20,16 9,16 (183)

Note: The numbers in brackets are the totals in each sub-level.

The statistical model for the design is given by

$$y_{ijkl} = \mu + \tau_i + \beta_j + \gamma_k + (\tau\beta)_{ij} + (\tau\gamma)_{ik} + (\beta\gamma)_{jk} + (\tau\beta\gamma)_{ijk} + e_{ijkl}$$

$$\begin{cases} i=1,2,\dots,a \\ j=1,2,\dots,b \\ k=1,2,\dots,c \\ l=1,2,\dots,r \end{cases}$$

Where  $y_{ijkl}$  is the observed response when factor  $A$  is at the  $i$ th level,  $B$  is at the  $j$ th level, and  $C$  is at the  $k$ th level for the  $l$ th replicate.  $\mu$  is the overall mean effect,  $\tau_i$  is the effect of the  $i$ th level of factor  $A$ ,  $\beta_j$  is the effect of the  $j$ th level of factor  $B$ , and  $\gamma_k$  is the effect of the  $k$ th level of factor  $C$ .  $(\tau\beta)_{ij}$  is the effect of the interaction between  $\tau_i$  and  $\beta_j$ ,  $(\tau\gamma)_{ik}$  is the effect of the interaction between  $\tau_i$  and  $\gamma_k$ ,  $(\beta\gamma)_{jk}$  is the effect of the

interaction between  $\beta_j$  and  $\gamma_k$ ,  $(\tau\beta\gamma)_{ijk}$  is the effect of the interaction between  $\tau_i, \beta_j$  and  $\gamma_k$ , and  $e_{ijk}$  is a

random error component.

The Yates algorithm table for the above data is as given below:

Treatment combination	Response	(1)	(2)	(3)	Effect	Effect estimate (3) ÷ n2 <sup>k-1</sup>	Sum of squares (3) <sup>2</sup> ÷ n2 <sup>k</sup>
(1)	109	219	574	1154	I	-	-
l	110	355	580	88	L	1.833	80.667
m	153	240	50	236	M	4.917	580.167
lm	202	340	38	62	LM	1.292	40.042
s	114	1	136	6	S	0.125	0.375
ls	126	49	100	-12	LS	-0.25	1.500
ms	157	12	48	-36	MS	-0.75	13.500
lms	183	26	14	-34	LMS	-0.708	12.042

$$SS_T = 15472 - 13872.042 = 1599.958$$

$$SS_E = 1599.958 - 80.667 - 580.167 - 40.042 - 0.375 - 1.500 - 13.500 - 12.042 = 871.665$$

- (i) they proceed from low level of study to the high level (ND2);
- (ii) there is a switch from the traditional method (Control) to the CAL (Experimental).

From the effects estimate column of the algorithm above, we see that the largest effects are for level (L = 1.833), method (M = 4.917), level – method interaction (LM = 1.292), and gender (S = 0.125), which are all positive. These suggest that students’ academic performance will improve when

The gender effect, though positive, does not appear to have as large an impact on students’ performance. Level and Method effects. All the other effects are negative.

The analysis of variance further confirms the significance of these positive effects and the table is given below

Anova table

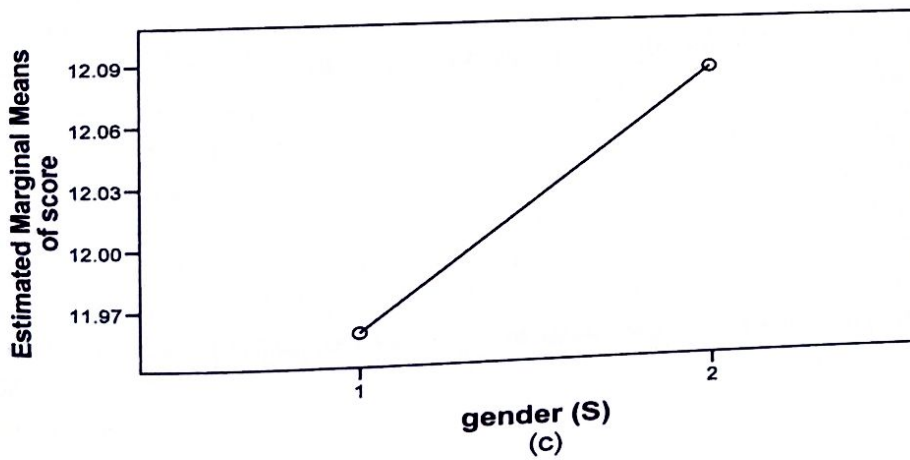
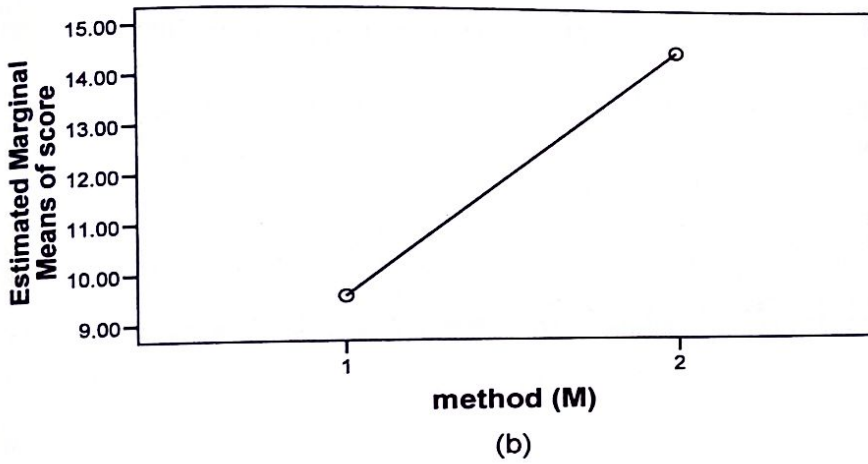
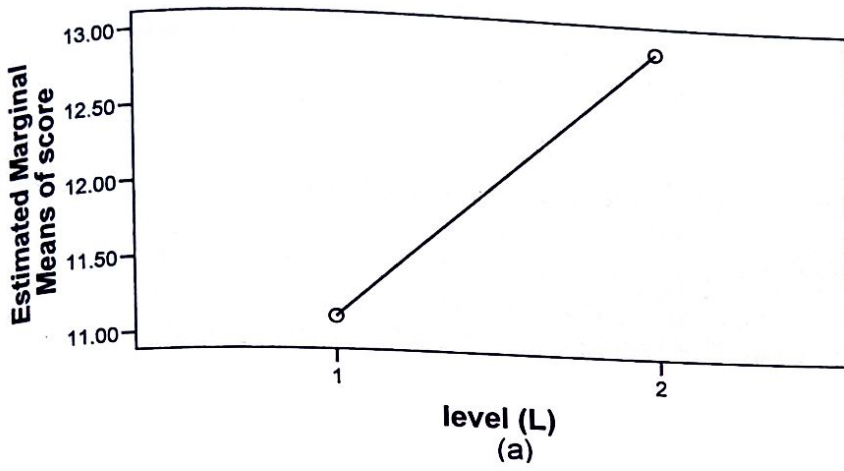
Source of variation	df	SS	MS	F <sub>0</sub>	F <sub>0.05,1,88</sub>
l	1	80.667	80.667	8.144	4.00
m	1	580.167	580.167	58.573	4.00
lm	1	40.042	40.042	4.043	4.00
s	1	0.375	0.375	0.038 <sup>ns</sup>	4.00
ls	1	1.500	1.500	0.151 <sup>ns</sup>	4.00
ms	1	13.500	13.500	1.363 <sup>ns</sup>	4.00
lms	1	12.042	12.042	1.216 <sup>ns</sup>	4.00
Error	88	871.665	9.905		
Total	95	1599.958			

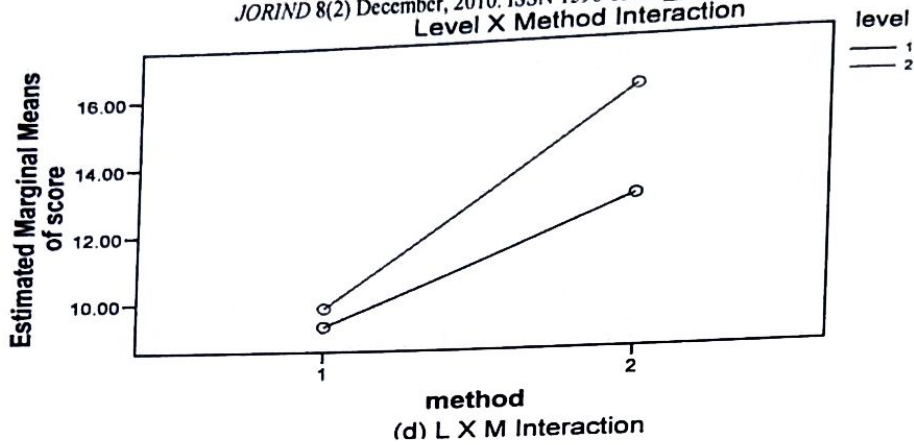
ns = not significant

From the ANOVA table above, it can be concluded that students’ academic performance depends on level of study, method of teaching and the interaction of level and

method. Gender and all other interactions do not have an effect on students’ performance.

The profile plots of the three main effects and the level-method interaction are given below for comparing marginal means.





(d) L X M Interaction

These plots also indicate the positive effects of all the three variables and the level-method interaction. That is, moving from low level to the high level moves the performance upward, but the largest effect is that of the Method factor as can be observed from the estimated marginal means axis of the plots.

### Conclusion

Factorial experimental designs and analysis are powerful statistical techniques for more complicated and realistic experiments involving certain phenomena. From the analysis of the designed  $2^3$  factorial experiment involving level of study, method of teaching and gender, it is observed that students' academic performance is significantly influenced by their level of study, method of teaching and level – method interaction. A careful observation of the profile plots shows that the computer – aided learning (CAL) method of teaching has the largest influence on students' performance followed by the second level of study. Therefore, whilst Computer Assisted Learning may encounter some negativity from people resistant to change, there is no doubt that this educational tool is extremely valuable. From children to

adults, there is much to be gained from CAL's and self motivating format for learning.

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