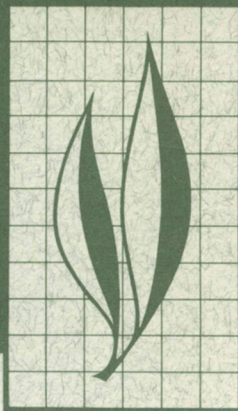


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Uniformity Field Trials and Monte Carlo Simulations

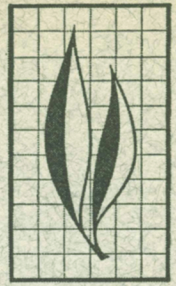
George A. Baker and John P. Johnson

Significant Differences on the Basis of Stable Rankings Analyzed by the SD Technique

George A. Baker and Burton J. Hoyle

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In the first paper, actual uniformity field trials are examined and it is found that analyses based on conventional mathematical models may assess very poorly the probabilities used in detecting significantly different varieties.

Monte Carlo results show changes in the mathematical model of field trials that can give probability distributions that correspond closely to the distributions observed for actual trials.

In the second paper, emphasis is placed on reproducibility of field plot results as the most desirable evaluation. Techniques by which a stable ranking among treatments can be obtained (i.e.: A is better than B) are discussed as a matter of field plot manipulation. Examples are given where reproducibility, as measured by the SD technique in a single year, is applicable to a high degree of certainty to results based on several years' experience. The SD technique provides a confidence limit depending on design, and the values of the limits are computed.

A reproducible ranking order is held to be desirable and the problems of securing one are discussed. Techniques are offered which simplify obtaining a stable ranking. Mathematical formulas are given by which given cut-off points of confidence can be calculated. Adequate field plot decisions are based on both agronomic usefulness and mathematical confidence. The SD technique is shown to fulfill both of these considerations.

THE AUTHORS:

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Uniformity Field Trials and Monte Carlo Simulations^{1, 2}

INTRODUCTION

EXAMINATION OF actual uniformity field trials shows that the ordinary analyses of variance of such trials give erratic results both from the standpoint of errors of the first kind and errors of the second kind. An error of the first kind is made when we say that a difference between varieties exists when, in fact, there is no difference. An error of the second kind is made when we say that no difference exists when, in fact, there is a difference. Monte Carlo simulations of uniformity trials, theoretical models, and detailed scrutiny of real trials indicate that island-like fertility levels with random elements whose variabilities depend upon the fertility levels are realistic and greatly disturb the validity of the conventional analyses.

Concern over the adequacy of the conventional model for the analyses of field trials has been expressed for a long

time (Baker, 1941). Attempts to clarify the difficulties have been made by Baker (1952) and Baker and various co-authors (1944, 1949, 1950, 1952, 1953, 1957, 1961). In general, it has been found that errors of the first kind may be over- or underestimated and that the same is true for errors of the second kind. There is a distinct tendency for fertility levels to occur in the form of islands that cannot be assessed well before the results are observed. The variability of the observed responses depends on the fertility level.

This paper presents further Monte Carlo results concerning possible disturbing elements present in actual trials that are not realistically allowed for in the presently used mathematical models. Also, a brief indication of the possibility of more realistic mathematical models is given.

ACTUAL FIELD TRIALS

Table 1 concerns errors of the first kind. In this table, we have taken the 57 tenth-acre barley plots in the uniformity trial reported by Baker, *et al.* (1952) and regarded them as three randomized blocks of 19 varieties for seven of the years. One hundred random assignments of varieties were made. The mean yields and standard deviations of

57 plots are given. The mean of the 100 F 's and their variances are listed along with the number of values exceeding the values of F for the 5 and 1 per cent levels indicated by the conventional normal model. The means and variances of correlations between observed values and residuals based on 20 trials (except 8 trials for 1925) are given also.

¹ Submitted for publication April 15, 1964.

² Part of the computing for this project was done by the Computer Center, University of California, Davis. The Computer Center is partially supported by National Institute of Health Grant No. FR-00009.

TABLE 1
ERRORS OF THE FIRST KIND*

Year	Mean (Pounds) per acre	S.D. (Pounds) per acre	Mean of F	Variance of F	Number > $F_{.05}(1,90)$	Number > $F_{.01}(2,49)$	Correlations†	
							Mean	Variance
1924.....	2881	709	1.086	0.177	2	1		
1925.....	2567	198	1.150	0.302	12	2	.8546	.000851
1926.....	2811	507	1.278	0.504	12	8	.8116	.001926
1929.....	2978	330	1.051	0.133	3	0	.8578	.001940
1930.....	3605	269	1.031	0.178	3	1	.6996	.000869
1933.....	2002	165	1.076	0.139	4	0	.8223	.001879
1934.....	1374	141	1.192	0.450	10	3	.6796	.000724
Expected (conventional model).....			1.059	0.202	5	1		

* Means and variances for 100 F -values for 57 barley plots regarded as three randomized blocks of 19 varieties for seven of the years as given in Baker *et al.* (1952) along with the number of values exceeding 5 and 1 per cent levels. Means and variances of correlations between observed values and residuals are based on 20 trials, except in 1925 when they were based on eight trials.

† Professor P. W. M. John of the Mathematics Department, University of California, Davis, has pointed out that the square of the correlation coefficients in tables 1, 3, 4, and 5 can be computed as the ratio of the error sum of squares to the total sum of squares in the corresponding analysis of variance tables.

This table indicates considerable variation in the year-to-year behavior of the conventional F -test for significance of varieties as far as errors of the first kind (α -errors) are concerned.

Table 2 considers the behavior of some of the years listed in table 1 with respect to errors of the second kind (β -errors). Real differences were applied to varieties for the years 1925, 1930, 1934. The magnitude of the real differences is indicated by the value

of Tang's ϕ . For a complete discussion of ϕ see Baker and Roessler (1957).

The years 1925 and 1934 behaved as expected under the conventional model, but in 1930, significantly fewer errors of the second kind were found than expected.

Results for 25 actual 9×9 latin squares are listed in table 4. These results for the α -error situation seem to be different from the normal conventional model as given in its first line.

TABLE 2
ERRORS OF THE SECOND KIND*

Year	Mean	SD	Number of F 's	ϕ	α	β	Number > $F_{.05}$	Number > $F_{.01}$	$\chi^2 - 1$ df
1925...	2568	194	100	1.44	0.01	0.8	95	82	0.25
1930...	3604	273	100	1.27	0.01	0.7	80	54	12.18
1934...	1374	143	50	2.32	0.01	> 0.8	50	50

* Real differences were applied to varieties in the set-up for the previous table. The values of Tang's ϕ (see Baker *et al.*, 1952) are given.

EFFECT OF UNIFORM FUNDAMENTAL ERROR DISTRIBUTIONS ON α -ERRORS

Since the actual data considered in the previous section indicate considerable possible deviation of field trials from the common normal-error distribution model, it becomes of interest to pinpoint the cause of failure, if possible. To examine the possible effect of distur-

tions of the fundamental error distribution, we considered an extensive set of quite different distributions by Monte Carlo methods for 6×6 , 9×9 and 12×12 latin squares. These results are given in tables 3, 4 and 5. The populations I, II, III, IV and V are given in detail by

TABLE 3

MEANS AND VARIANCES OF VARIETY *F*-VALUES AND CORRELATIONS
BETWEEN OBSERVED AND RESIDUAL VALUES FOR SIMULATED UNIFORMITY
6 × 6 LATIN SQUARES

Population	Number	<i>F</i> -values		Correlations	
		Mean	Variance	Mean	Variance
Normal.....	100	1.0888	.627015	.7596	.005058
I.....	100	1.1988	1.754286	.7377	.007527
II.....	100	1.0548	.541458	.7564	.006185
III.....	100	1.2586	1.276479	.7363	.007698
IV.....	100	1.1070	.550421	.7558	.003907
V.....	100	1.0124	.651804	.7620	.006446

TABLE 4

MEANS AND VARIANCES OF VARIETY *F*-VALUES AND CORRELATIONS
BETWEEN OBSERVED AND RESIDUAL VALUES FOR SIMULATED AND
ACTUAL UNIFORMITY 9 × 9 LATIN SQUARE TRIALS

Population	Number	<i>F</i> -values		Correlations	
		Mean	Variance	Mean	Variance
Normal.....	100	1.0050	.424621	.8424	.001562
I.....	100	1.0121	.263890	.8414	.001161
II.....	100	1.0337	.260448	.8360	.001755
III.....	100	0.9219	.196033	.8435	.001827
IV.....	100	0.9880	.248998	.8483	.001498
V.....	100	1.0061	.257487	.8414	.001669
2 <i>N</i> (15.5, 5) + 1 <i>N</i> (75.5, 5).....	50	0.9876	.289900	.8350	.002293
<i>N</i> (15.5, 5) + <i>N</i> (65.5, 5).....	100	1.0761	.426100	.8376	.002344
<i>N</i> (15.5, 5) + <i>N</i> (60.0, 20).....	100	0.5255	.061327	.9211	.000308
Sum of rectangular and normal.....	100	1.0255	.014394	.8414	.001128
Actual (Tulelake)*.....	25	1.0972	.188754	.7883	.025261

* These data were furnished by B. J. Hoyle, Superintendent of the University of California Tulelake Field Station.

TABLE 5

MEANS AND VARIANCES OF VARIETY *F*-VALUES AND CORRELATIONS
BETWEEN OBSERVED AND RESIDUAL VALUES FOR SIMULATED UNIFORMITY
12 × 12 LATIN SQUARE TRIALS

Population	Number	<i>F</i> -values		Correlations	
		Mean	Variance	Mean	Variance
Normal.....	100	1.0168	.151692	.8760	.000640
I.....	100	1.0020	.146263	.8790	.000688
II.....	100	1.0318	.147178	.8754	.000818
III.....	100	1.0708	.314029	.8792	.000827
IV.....	100	1.0252	.188282	.8772	.000666
V.....	100	1.1046	.223967	.8818	.000572

Baker (1958). These populations are composed of two normal populations and are distinctly non-normal.
Considerable disturbance of the *F*-distributions was achieved by manipulation of the error distributions, but perhaps not enough to account for the observed failures for actual field trials.

EFFECT OF DIFFERENCES IN FERTILITY LEVELS AND
ERROR VARIANCES OF SUBPLOTS

Uniformity field trials, when differences in fertility levels of subplots are not included in experimental error for two randomized blocks with two subplots each, have been discussed by Baker (1952). Selected ordinates for systematic and randomized procedures for seven pairs of values of the parameters m_1/σ and m_2/σ for the corresponding F -distributions are given in table 1 of this paper. These parameters measure the inequality of the fertility levels of

the subplots in terms of the uniform standard deviation of the experiment. It was seen that the tails of some of the F -distributions are heavier than for the conventional model, indicating that much larger values of F are required for significance. On the other hand, some of the tails were lighter, so that smaller F -values are indicative of significance at the usual levels. Randomization is effective in some cases in giving a distribution that is closer to the con-

TABLE 6
SELECTED ORDINATES OF F DISTRIBUTIONS CORRESPONDING TO
 $m_1 = m_2 = 0$
AND VARIOUS VALUES OF r

F/r	0.0	.5	.9
(3)1...	31.828	27.566	13.878
(2)5...	4.479	3.898	1.984
.01...	3.152	2.756	1.419
.025...	1.964	1.742	.928
.05...	1.356	1.230	.693
.1...	.915	.864	.545
.2...	.593	.597	.470
.4...	.359	.391	.463
.6...	.257	.291	.465
.8...	.198	.227	.431
1.0...	.159	.184	.365
1.2...	.132	.152	.293
1.4...	.112	.128	.230
1.6...	.097	.110	.181
1.8...	.085	.095	.144
2.0...	.075	.084	.117
2.2...	.067	.074	.096
2.4...	.060	.066	.080
2.6...	.055	.059	.068
2.8...	.050	.054	.059
3.0...	.046	.049	.051
3.2...	.042	.045	.045
3.4...	.039	.041	.040
3.6...	.036	.038	.035
3.8...	.034	.035	.032
4.0...	.032	.033	.029
4.2...	.030	.031	.026
4.4...	.028	.029	.024
4.6...	.026	.027	.022
4.8...	.025	.025	.020
5.0...	.024	.024	.019
100.0...	(3)31	(3)28	(3)14
10,000.0...	(6)32	(6)28	(6)14

TABLE 7
SELECTED ORDINATES OF F DISTRIBUTIONS CORRESPONDING TO
 $m_1 = 0, m_2/\sigma = 1,$
AND VARIOUS VALUES OF r

F/r	0.0	.5	.9
(3)1...	19.306	19.435	21.933
(2)5...	2.730	2.740	3.093
.01...	1.930	1.932	2.181
.025...	1.220	1.211	1.367
.05...	.862	.845	.949
.1...	.607	.583	.642
.2...	.423	.397	.401
.4...	.287	.267	.201
.6...	.222	.211	.117
.8...	.182	.178	.085
1.0...	.154	.154	.077
1.2...	.133	.136	.082
1.4...	.116	.121	.090
1.6...	.103	.109	.098
1.8...	.093	.098	.102
2.0...	.084	.089	.103
2.2...	.076	.082	.101
2.4...	.070	.075	.097
2.6...	.064	.069	.092
2.8...	.059	.064	.087
3.0...	.055	.059	.081
3.2...	.051	.055	.076
3.4...	.048	.051	.071
3.6...	.045	.048	.066
3.8...	.042	.045	.061
4.0...	.039	.042	.057
4.2...	.037	.040	.053
4.4...	.035	.038	.050
4.6...	.033	.036	.047
4.8...	.032	.034	.044
5.0...	.030	.032	.042
100.0...	(3)46	(3)44	(3)41
10,000.0...	(6)47	(6)44	(6)40

TABLE 8
SELECTED ORDINATES OF *F* DISTRIBUTIONS CORRESPONDING TO
 $m_1/\sigma = 1, m_2 = 0,$
AND VARIOUS VALUES OF *r*

<i>F/r</i>	0.0	.5	.9
.(3)1...	46.516	44.125	40.030
.(2)5...	6.521	6.217	5.706
.01.....	4.570	4.379	4.067
.025.....	2.816	2.736	2.631
.05.....	1.908	1.893	1.924
.1.....	1.244	1.275	1.432
.2.....	.758	.807	1.048
.4.....	.417	.450	.591
.6.....	.276	.292	.278
.8.....	.200	.206	.131
1.0.....	.154	.154	.077
1.2.....	.123	.120	.057
1.4.....	.101	.097	.048
1.6.....	.084	.081	.043
1.8.....	.072	.068	.040
2.0.....	.062	.059	.037
2.2.....	.055	.051	.035
2.4.....	.049	.045	.033
2.6.....	.043	.040	.031
2.8.....	.039	.036	.029
3.0.....	.035	.033	.027
3.2.....	.032	.030	.026
3.4.....	.029	.027	.025
3.6.....	.027	.025	.023
3.8.....	.025	.023	.022
4.0.....	.023	.022	.021
4.2.....	.021	.020	.020
4.4.....	.020	.019	.019
4.6.....	.019	.018	.018
4.8.....	.018	.017	.017
5.0.....	.017	.016	.016
100.0.....	.(3)19	.(3)19	.(3)22
10,000.0.....	.(6)19	.(6)19	.(6)22

TABLE 9
SELECTED ORDINATES OF *F* DISTRIBUTIONS CORRESPONDING TO
RANDOMIZATION OF THE
PARAMETERS VALUES OF TABLES
7 AND 8 FOR VARIOUS VALUES OF *r*

<i>F/r</i>	0.0	.5	.9
.(3)1...	32.911	31.780	30.982
.(2)5...	4.626	4.478	4.400
.01.....	3.250	3.156	3.124
.025.....	2.018	1.974	1.999
.05.....	1.385	1.369	1.436
.1.....	.926	.929	1.032
.2.....	.590	.602	.724
.4.....	.352	.358	.396
.6.....	.249	.252	.198
.8.....	.191	.192	.108
1.0.....	.154	.154	.077
1.2.....	.128	.128	.070
1.4.....	.108	.109	.069
1.6.....	.094	.095	.070
1.8.....	.082	.083	.071
2.0.....	.073	.074	.070
2.2.....	.066	.066	.068
2.4.....	.060	.060	.065
2.6.....	.054	.054	.062
2.8.....	.049	.050	.058
3.0.....	.045	.046	.054
3.2.....	.041	.042	.051
3.4.....	.038	.039	.048
3.6.....	.035	.036	.045
3.8.....	.033	.034	.042
4.0.....	.031	.032	.039
4.2.....	.029	.030	.036
4.4.....	.027	.028	.034
4.6.....	.026	.027	.032
4.8.....	.025	.026	.030
5.0.....	.024	.024	.029
100.0.....	.(3)32	.(3)32	.(3)32
10,000.0.....	.(6)33	.(6)32	.(6)31

TABLE 10
SELECTED ORDINATES OF F DISTRIBUTIONS CORRESPONDING TO
 $m_1/\sigma = 1, m_2/\sigma = 1$ AND VARIOUS VALUES OF r

F/r	-.9	-.5	0.0	.5	.9
.(3)1.....	45.958	37.012	28.218	19.441	8.638
.(2)5.....	6.405	5.719	3.991	2.778	1.239
.01.....	4.461	3.623	2.821	1.984	.890
.025.....	2.693	2.220	1.783	1.293	.588
.05.....	1.757	1.493	1.257	.957	.448
.1.....	1.050	.962	.879	.732	.367
.2.....	.533	.580	.600	.580	.349
.4.....	.246	.323	.385	.454	.433
.6.....	.167	.222	.282	.368	.548
.8.....	.127	.168	.220	.299	.592
1.0.....	.102	.135	.177	.244	.526
1.2.....	.085	.112	.147	.201	.408
1.4.....	.072	.096	.124	.167	.299
1.6.....	.063	.083	.107	.140	.218
1.8.....	.055	.074	.093	.119	.162
2.0.....	.049	.066	.082	.102	.123
2.2.....	.045	.059	.073	.088	.096
2.4.....	.041	.054	.065	.077	.077
2.6.....	.038	.049	.059	.068	.063
2.8.....	.035	.045	.053	.061	.052
3.0.....	.033	.042	.049	.054	.044
3.2.....	.031	.039	.045	.049	.038
3.4.....	.029	.036	.041	.044	.033
3.6.....	.028	.034	.038	.040	.029
3.8.....	.027	.032	.035	.037	.025
4.0.....	.026	.030	.033	.034	.022
4.2.....	.025	.028	.031	.031	.020
4.4.....	.024	.027	.029	.029	.018
4.6.....	.023	.026	.027	.027	.016
4.8.....	.022	.024	.025	.025	.015
5.0.....	.021	.023	.024	.023	.014
100.0.....	.(3)45	.(3)36	.(3)28	.(3)20	.(4)89
10,000.0.....	.(6)46	.(6)37	.(6)28	• .(6)19	.(7)86

TABLE 11
SELECTED ORDINATES OF F DISTRIBUTIONS CORRESPONDING TO
 $m_1 = 0, m_2/\sigma = 2,$
AND VARIOUS VALUES OF r

F/r	0.0	.5	.9
(3)1...	4.309	5.973	9.715
(2)5...	.618	.848	1.360
.01.....	.444	.602	.952
.025.....	.293	.385	.584
.05.....	.221	.277	.394
.1.....	.175	.202	.259
.2.....	.147	.150	.166
.4.....	.131	.116	.109
.6.....	.123	.102	.085
.8.....	.116	.094	.071
1.0.....	.109	.090	.060
1.2.....	.103	.086	.053
1.4.....	.097	.083	.047
1.6.....	.091	.080	.043
1.8.....	.086	.077	.041
2.0.....	.081	.074	.040
2.2.....	.076	.072	.041
2.4.....	.072	.069	.043
2.6.....	.068	.067	.045
2.8.....	.065	.064	.047
3.0.....	.062	.061	.048
3.2.....	.059	.059	.049
3.4.....	.056	.057	.050
3.6.....	.053	.054	.050
3.8.....	.051	.052	.050
4.0.....	.049	.050	.050
4.2.....	.047	.048	.049
4.4.....	.045	.046	.049
4.6.....	.043	.044	.048
4.8.....	.041	.042	.047
5.0.....	.039	.041	.046
100.0.....	(.3)78	(.3)78	(.3)80
10,000.0.....	(.6)80	(.6)80	(.6)80

TABLE 12
SELECTED ORDINATES OF F DISTRIBUTIONS FOR $m_1/\sigma = 2, m_2 = 0,$ AND
VARIOUS VALUES OF r

F/r	0.0	.5	.9
(3)1...	80.468	80.014	79.787
(2)5...	11.189	11.184	11.288
.01.....	7.777	7.814	7.980
.025.....	4.676	4.761	5.026
.05.....	3.046	3.156	3.486
.1.....	1.845	1.947	2.268
.2.....	.987	1.035	1.141
.4.....	.440	.424	.274
.6.....	.248	.220	.118
.8.....	.158	.113	.080
1.0.....	.109	.090	.060
1.2.....	.080	.065	.048
1.4.....	.061	.049	.039
1.6.....	.048	.039	.033
1.8.....	.038	.032	.028
2.0.....	.032	.027	.024
2.2.....	.027	.023	.021
2.4.....	.023	.020	.019
2.6.....	.020	.017	.017
2.8.....	.017	.015	.015
3.0.....	.015	.013	.013
3.2.....	.013	.012	.012
3.4.....	.012	.011	.011
3.6.....	.011	.010	.010
3.8.....	(.2)97	(.2)93	(.2)97
4.0.....	(.2)88	(.2)86	(.2)91
4.2.....	(.2)81	(.2)79	(.2)85
4.4.....	(.2)74	(.2)74	(.2)79
4.6.....	(.2)69	(.2)69	(.2)74
4.8.....	(.2)63	(.2)64	(.2)70
5.0.....	(.2)59	(.2)60	(.2)66
100.0.....	(.4)44	(.4)60	(.4)95
10,000.0.....	(.7)43	(.7)60	(.7)97

TABLE 13
SELECTED ORDINATES OF F DISTRIBUTIONS FOR RANDOMIZATION FOR THE VALUES OF THE PARAMETERS FOR TABLES 11 AND 12, AND VARIOUS VALUES OF r

F/r	0.0	.5	.9
(3)1.....	42.388	42.994	44.751
(2)5.....	5.904	6.016	6.324
.01.....	4.110	4.208	4.466
.025.....	2.484	2.573	2.805
.05.....	1.634	1.716	1.940
.1.....	1.010	1.074	1.264
.2.....	.567	.592	.654
.4.....	.286	.270	.192
.6.....	.186	.161	.102
.8.....	.137	.104	.076
1.0.....	.109	.090	.060
1.2.....	.092	.076	.050
1.4.....	.079	.066	.043
1.6.....	.070	.060	.038
1.8.....	.062	.054	.034
2.0.....	.056	.050	.032
2.2.....	.052	.047	.031
2.4.....	.048	.044	.031
2.6.....	.044	.042	.031
2.8.....	.041	.040	.031
3.0.....	.038	.037	.030
3.2.....	.036	.035	.030
3.4.....	.034	.034	.030
3.6.....	.032	.032	.030
3.8.....	.030	.030	.030
4.0.....	.028	.029	.029
4.2.....	.027	.028	.029
4.4.....	.026	.027	.028
4.6.....	.025	.025	.028
4.8.....	.024	.024	.027
5.0.....	.023	.023	.026
100.0.....	.(3)41	.(3)42	.(3)45
10,000.0.....	.(6)42	.(6)43	.(6)45

ventional F -distribution than is the F -distribution for a systematic procedure.

In the present study, we permit the variances of the yields in the subplot to vary as well as the fertility levels within the subplots. We express the extent of the differences between the variances by means of a parameter r . Tables 6, 7, 8, 9, 10, 11, 12, 13 and 14 give the F -distributions corresponding to 9 columns of table 1, Baker (1952), for $r = -0.9, -0.5, 0.0, 0.5, 0.9$. The F -distributions for $r = 0.0$ in these tables are the same as for table 1 in the previous publication except for computing errors, mainly for columns 5 and 9. All of these tables except 10 and 14 are symmetrical with respect to plus and minus values of r and hence the columns for negative r are omitted.

It is seen that far greater distortions in the F -distributions are possible with the present model than with the previous one (Baker, 1952).

The details of the development of the present model are as follows.

As in Baker (1952), two randomized blocks with two subplots each shall be considered, and in place of the standard mathematical model,

$$v_{ij} = g + b_i + t_j + \epsilon_{ij}, \quad (1)$$

$$i = 1, 2 \text{ and } j = 1, 2,$$

where the random parts, ϵ_{ij} 's, are assumed to be distributed independently as $N(0, \sigma)$, we shall assume that ξ_{ij} is the "true" unknown fertility level in the j th subplot of the i th block and that our mathematical model is

$$v_{ij} = x_{ij} + \xi_{ij} \quad (2)$$

where the x_{ij} are independently distributed with zero means and variances proportional to ξ_{ij} .

If we apply the conventional analysis of variance, we obtain

TABLE 14
SELECTED ORDINATES OF *F* DISTRIBUTIONS CORRESPONDING TO
*m*₁/*σ* = 2, *m*₂/*σ* = 2, AND VARIOUS VALUES OF *r*

<i>F</i> / <i>r</i>	-.9	-.5	0.0	.5	.9
.(3)1.....	20.525	16.206	10.905	5.978	2.074
.(2)5.....	2.961	2.378	1.620	.886	.301
.01.....	2.135	1.742	1.201	.657	.218
.025.....	1.424	1.206	.862	.474	.149
.05.....	1.083	.958	.722	.409	.120
.1.....	.842	.786	.650	.403	.111
.2.....	.637	.636	.604	.460	.136
.4.....	.435	.467	.517	.550	.291
.6.....	.324	.359	.427	.546	.611
.8.....	.253	.284	.347	.484	.918
1.0.....	.205	.230	.284	.403	.909
1.2.....	.169	.190	.233	.327	.654
1.4.....	.143	.160	.194	.263	.415
1.6.....	.122	.136	.162	.211	.257
1.8.....	.106	.117	.138	.171	.163
2.0.....	.093	.102	.118	.140	.108
2.2.....	.082	.090	.102	.115	.075
2.4.....	.073	.079	.088	.096	.054
2.6.....	.066	.071	.078	.081	.040
2.8.....	.060	.063	.069	.069	.031
3.0.....	.054	.057	.061	.059	.025
3.2.....	.049	.052	.054	.051	.020
3.4.....	.045	.047	.049	.044	.016
3.6.....	.042	.043	.044	.039	.014
3.8.....	.039	.040	.040	.034	.012
4.0.....	.036	.037	.036	.030	.010
4.2.....	.033	.034	.033	.027	.(2)87
4.4.....	.031	.031	.030	.024	.(2)77
4.6.....	.029	.029	.028	.022	.(2)68
4.8.....	.027	.027	.026	.020	.(2)61
5.0.....	.025	.025	.024	.018	.(2)54
100.0.....	.(3)21	.(3)17	.(3)12	.(4)66	.(4)22
10,000.0.....	.(6)20	.(6)16	.(6)11	.(7)60	.(7)21

$$S_v^2 = \frac{1}{4}(v_{11} + v_{21} - v_{12} - v_{22})^2 \tag{3}$$
$$m_1 = \xi_{11} + \xi_{21} - \xi_{12} - \xi_{22} \tag{7}$$

and

$$S_e^2 = \frac{1}{4}(v_{11} - v_{21} - v_{12} + v_{22})^2 \tag{4}$$
$$m_2 = \xi_{11} - \xi_{21} - \xi_{12} + \xi_{22} \tag{8}$$

and variances and covariance

$$\begin{aligned} \text{var}(z_1) = \text{var}(z_2) = \sigma^2 = \sigma_{11}^2 \\ + \sigma_{21}^2 + \sigma_{12}^2 + \sigma_{22}^2 \end{aligned} \tag{9}$$

$$\text{cov}(z_1, z_2) = r\sigma^2 = \sigma_{11}^2 - \sigma_{21}^2 \tag{10}$$
$$+ \sigma_{12}^2 - \sigma_{22}^2 .$$

If we set $F = (z_1/z_2)^2$, then, by using equation (16), page 5, of Baker (1932), and transforming to a new variable, we have

where S_v^2 is the variety sum of squares and S_e^2 is the error sum of squares each with one degree of freedom.

Put

$$z_1 = v_{11} + v_{21} - v_{12} - v_{22} , \tag{5}$$
$$z_2 = v_{11} - v_{21} - v_{12} + v_{22} , \tag{6}$$

and we get that z_1 and z_2 have a bivariate normal distribution with means

$$\begin{aligned}
f(F, r, m_1, m_2, \sigma) = & \frac{1}{2\pi F^{1/2}} \left\{ \left(\frac{1}{a_1} + \frac{1}{a_2} \right) \sqrt{1 - r^2} \exp \left[-\frac{1}{2\sigma^2} (m_1^2 - 2rm_1m_2 + m_2^2) \right] \right. \\
& + \frac{b_1}{a_1^{3/2}} \exp \left[-\frac{1}{2\sigma^2 a_1} (m_2 - F^{1/2} m_1)^2 \right] \int_0^{-1/2} \frac{b_1 [a_1(1 - r^2)]}{e^{-u^2/2} du} \\
& \left. + \frac{b_2}{a_2^{3/2}} \exp \left[-\frac{1}{2\sigma^2 a_2} (m_2 + F^{1/2} m_1)^2 \right] \int_0^{-1/2} \frac{b_2 [a_2(1 - r^2)]}{e^{-u^2/2} du} \right\} \quad (11)
\end{aligned}$$

where

$$\begin{aligned}
a_1 &= 1 - 2rF^{1/2} + F \\
a_2 &= 1 + 2rF^{1/2} + F \\
b_1 &= (rm_2 - m_1 + F^{1/2}(rm_1 - m_2))/\sigma \\
b_2 &= (rm_2 - m_1 - F^{1/2}(rm_1 - m_2))/\sigma
\end{aligned} \quad (12)$$

which reduces to the F -distribution with one and one degree of freedom when $r = m_1 = m_2 = 0$.

SUMMARY

Actual uniformity yield trials are examined with respect to errors of the first and second kind, and it is found that the use of the conventional mathematical model may assess very poorly the probabilities involved. Very different fundamental error distributions were assumed, and Monte Carlo results were obtained by electronic computer methods. The F -distributions were somewhat robust under these models. The mathematical model was then changed to permit fertility levels to vary from subplot to subplot and also variability to vary

from subplot to subplot. With such a mathematical model, it is possible to get greatly distorted F -distributions which exhibit many of the characteristics of actual field trials.

In general, it appears that actual field trials may grossly over- or underestimate the probabilities of errors of the first kind and the same is true for errors of the second kind. When errors of the first kind are less probable than expected, then the probability of errors of the second kind is greatly increased.

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