

Rice Example: Strip-Plot Analysis

Strip Plot design is also called a split block.

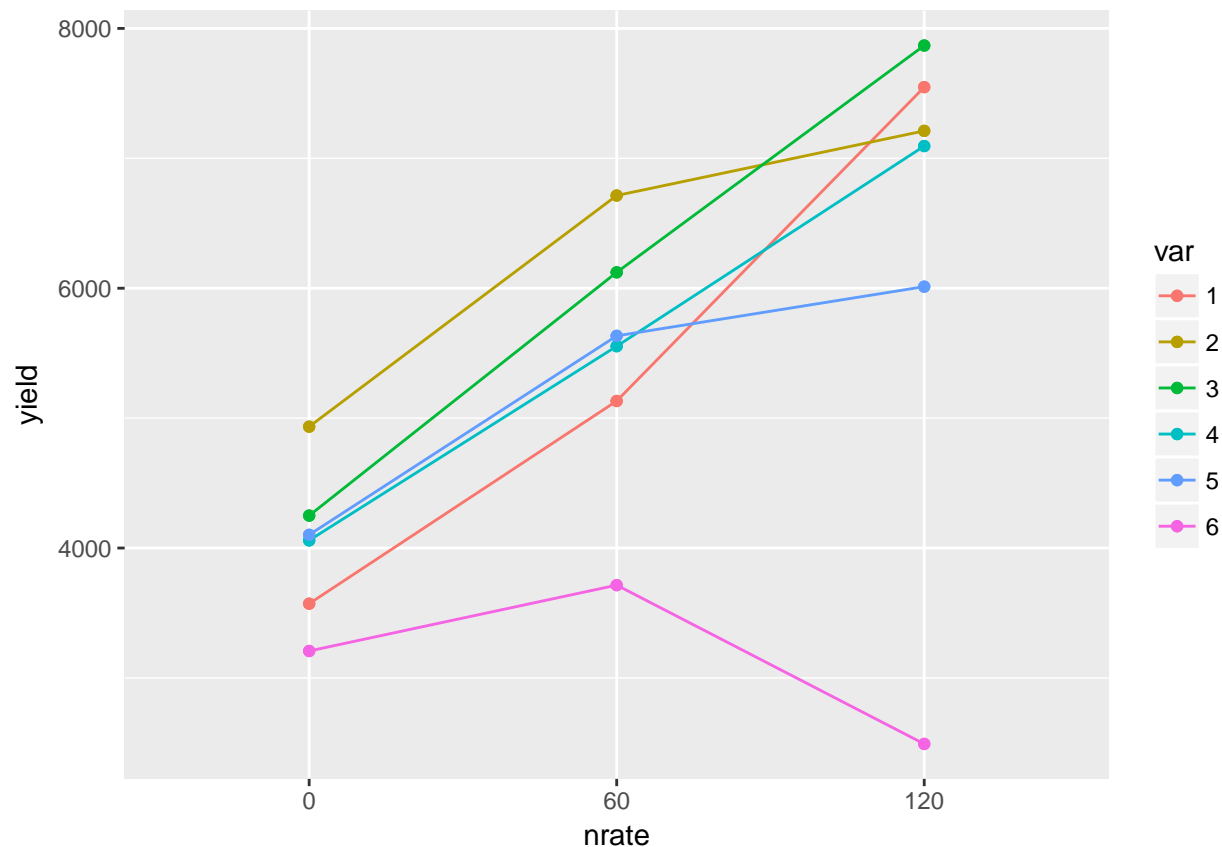
```
library(ggplot2)
library(lme4)
library(lmerTest)
library(pbkrtest)
library(emmeans)
Rice <- read.csv("C:/hess/STAT512/RNotes/Random2/R2_Rice_StripPlot.csv")
str(Rice)

## 'data.frame':   54 obs. of  4 variables:
##  $ var   : int   1 1 1 1 1 1 1 1 1 2 ...
##  $ nrates: int   0 0 0 60 60 60 120 120 120 0 ...
##  $ block: int   1 2 3 1 2 3 1 2 3 1 ...
##  $ yield: int  2373 3958 4384 4076 6431 4889 7254 6808 8582 4007 ...

#Important: Need to define things as.factor!!!
Rice$var <- as.factor(Rice$var)
Rice$nrates <- as.factor(Rice$nrates)
Rice$block <- as.factor(Rice$block)
#Interaction Plot
AvgData <- aggregate(yield ~ var + nrates, data = Rice, mean)
str(AvgData)

## 'data.frame':   18 obs. of  3 variables:
##  $ var   : Factor w/ 6 levels "1","2","3","4",...: 1 2 3 4 5 6 1 2 3 4 ...
##  $ nrates: Factor w/ 3 levels "0","60","120": 1 1 1 1 1 1 2 2 2 2 ...
##  $ yield: num  3572 4934 4250 4059 4102 ...

p <- qplot(x = nrates, y = yield, colour = var, group = var, data = AvgData)
p + geom_line() + geom_point()
```



```
Model1 <- lmer(yield ~ var*nrate + (1|block) + (1|block:var) + (1|block:nrate), data = Rice)
summary(Model1)
```

```
## Linear mixed model fit by REML t-tests use Satterthwaite approximations
## to degrees of freedom [lmerMod]
## Formula:
## yield ~ var * nrate + (1 | block) + (1 | block:var) + (1 | block:nrate)
## Data: Rice
##
## REML criterion at convergence: 607.4
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -1.52993 -0.52843  0.05394  0.51466  1.46903
##
## Random effects:
## Groups      Name                Variance Std.Dev.
## block:var   (Intercept)    360205     600.2
## block:nrate (Intercept)    55347      235.3
## block       (Intercept)    154785      393.4
## Residual                    411646      641.6
## Number of obs: 54, groups:  block:var, 18; block:nrate, 9; block, 3
##
## Fixed effects:
##              Estimate Std. Error      df t value Pr(>|t|)
## (Intercept)   3571.67    572.13    17.72  6.243 7.40e-06 ***
```

```
## var2      1362.67    717.33    20.77    1.900    0.0715 .
## var3      678.00    717.33    20.77    0.945    0.3554
## var4      487.33    717.33    20.77    0.679    0.5044
## var5      530.00    717.33    20.77    0.739    0.4683
## var6     -364.33    717.33    20.77   -0.508    0.6169
## nrate60    1560.33    557.97    21.80    2.796    0.0106 *
## nrate120   3976.33    557.97    21.80    7.126 4.01e-07 ***
## var2:nrate60 219.00    740.85    19.10    0.296    0.7707
## var3:nrate60 312.33    740.85    19.10    0.422    0.6780
## var4:nrate60 -65.67    740.85    19.10   -0.089    0.9303
## var5:nrate60 -28.67    740.85    19.10   -0.039    0.9695
## var6:nrate60 -1053.33    740.85    19.10   -1.422    0.1712
## var2:nrate120 -1699.33    740.85    19.10   -2.294    0.0333 *
## var3:nrate120 -357.67    740.85    19.10   -0.483    0.6347
## var4:nrate120 -941.00    740.85    19.10   -1.270    0.2193
## var5:nrate120 -2066.00    740.85    19.10   -2.789    0.0117 *
## var6:nrate120 -4691.67    740.85    19.10   -6.333 4.35e-06 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
anova(Model1, ddf="Kenward-Roger")
```

```
## Analysis of Variance Table of type III with Kenward-Roger
## approximation for degrees of freedom
##          Sum Sq Mean Sq NumDF DenDF F.value    Pr(>F)
## var      15751300  3150260     5    10   7.653 0.0033722 **
## nrate     28048730 14024365     2     4  34.069 0.0030746 **
## var:nrate 23877979  2387798    10    20   5.801 0.0004271 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
emmeans(Model1, pairwise ~ var|nrate)
```

```
## $emmeans
## nrate = 0:
##   var   emmean      SE    df lower.CL upper.CL
## 1  3571.667 572.1257 17.76 2368.490 4774.843
## 2  4934.333 572.1257 17.76 3731.157 6137.510
## 3  4249.667 572.1257 17.76 3046.490 5452.843
## 4  4059.000 572.1257 17.76 2855.823 5262.177
## 5  4101.667 572.1257 17.76 2898.490 5304.843
## 6  3207.333 572.1257 17.76 2004.157 4410.510
##
## nrate = 60:
##   var   emmean      SE    df lower.CL upper.CL
## 1  5132.000 572.1257 17.76 3928.823 6335.177
## 2  6713.667 572.1257 17.76 5510.490 7916.843
## 3  6122.333 572.1257 17.76 4919.157 7325.510
## 4  5553.667 572.1257 17.76 4350.490 6756.843
## 5  5633.333 572.1257 17.76 4430.157 6836.510
## 6  3714.333 572.1257 17.76 2511.157 4917.510
##
## nrate = 120:
##   var   emmean      SE    df lower.CL upper.CL
## 1  7548.000 572.1257 17.76 6344.823 8751.177
```

```

## 2 7211.333 572.1257 17.76 6008.157 8414.510
## 3 7868.333 572.1257 17.76 6665.157 9071.510
## 4 7094.333 572.1257 17.76 5891.157 8297.510
## 5 6012.000 572.1257 17.76 4808.823 7215.177
## 6 2492.000 572.1257 17.76 1288.823 3695.177
##
## Degrees-of-freedom method: kenward-roger
## Confidence level used: 0.95
##
## $contrasts
## nrate = 0:
## contrast estimate SE df t.ratio p.value
## 1 - 2 -1362.66667 717.3336 20.9 -1.900 0.4295
## 1 - 3 -678.00000 717.3336 20.9 -0.945 0.9298
## 1 - 4 -487.33333 717.3336 20.9 -0.679 0.9824
## 1 - 5 -530.00000 717.3336 20.9 -0.739 0.9746
## 1 - 6 364.33333 717.3336 20.9 0.508 0.9953
## 2 - 3 684.66667 717.3336 20.9 0.954 0.9271
## 2 - 4 875.33333 717.3336 20.9 1.220 0.8222
## 2 - 5 832.66667 717.3336 20.9 1.161 0.8500
## 2 - 6 1727.00000 717.3336 20.9 2.408 0.1987
## 3 - 4 190.66667 717.3336 20.9 0.266 0.9998
## 3 - 5 148.00000 717.3336 20.9 0.206 0.9999
## 3 - 6 1042.33333 717.3336 20.9 1.453 0.6958
## 4 - 5 -42.66667 717.3336 20.9 -0.059 1.0000
## 4 - 6 851.66667 717.3336 20.9 1.187 0.8379
## 5 - 6 894.33333 717.3336 20.9 1.247 0.8092
##
## nrate = 60:
## contrast estimate SE df t.ratio p.value
## 1 - 2 -1581.66667 717.3336 20.9 -2.205 0.2769
## 1 - 3 -990.33333 717.3336 20.9 -1.381 0.7377
## 1 - 4 -421.66667 717.3336 20.9 -0.588 0.9908
## 1 - 5 -501.33333 717.3336 20.9 -0.699 0.9800
## 1 - 6 1417.66667 717.3336 20.9 1.976 0.3876
## 2 - 3 591.33333 717.3336 20.9 0.824 0.9596
## 2 - 4 1160.00000 717.3336 20.9 1.617 0.5970
## 2 - 5 1080.33333 717.3336 20.9 1.506 0.6644
## 2 - 6 2999.33333 717.3336 20.9 4.181 0.0049
## 3 - 4 568.66667 717.3336 20.9 0.793 0.9657
## 3 - 5 489.00000 717.3336 20.9 0.682 0.9821
## 3 - 6 2408.00000 717.3336 20.9 3.357 0.0310
## 4 - 5 -79.66667 717.3336 20.9 -0.111 1.0000
## 4 - 6 1839.33333 717.3336 20.9 2.564 0.1508
## 5 - 6 1919.00000 717.3336 20.9 2.675 0.1229
##
## nrate = 120:
## contrast estimate SE df t.ratio p.value
## 1 - 2 336.66667 717.3336 20.9 0.469 0.9967
## 1 - 3 -320.33333 717.3336 20.9 -0.447 0.9974
## 1 - 4 453.66667 717.3336 20.9 0.632 0.9872
## 1 - 5 1536.00000 717.3336 20.9 2.141 0.3054
## 1 - 6 5056.00000 717.3336 20.9 7.048 <.0001
## 2 - 3 -657.00000 717.3336 20.9 -0.916 0.9380

```

```

## 2 - 4      117.00000 717.3336 20.9   0.163  1.0000
## 2 - 5      1199.33333 717.3336 20.9   1.672  0.5636
## 2 - 6      4719.33333 717.3336 20.9   6.579  <.0001
## 3 - 4       774.00000 717.3336 20.9   1.079  0.8842
## 3 - 5      1856.33333 717.3336 20.9   2.588  0.1445
## 3 - 6      5376.33333 717.3336 20.9   7.495  <.0001
## 4 - 5      1082.33333 717.3336 20.9   1.509  0.6627
## 4 - 6      4602.33333 717.3336 20.9   6.416  <.0001
## 5 - 6      3520.00000 717.3336 20.9   4.907  0.0009
##
## P value adjustment: tukey method for comparing a family of 6 estimates
emmeans(Model1, pairwise ~ nrate|var)

## $emmeans
## var = 1:
## nrate  emmean      SE    df lower.CL upper.CL
## 0      3571.667 572.1257 17.76 2368.490 4774.843
## 60     5132.000 572.1257 17.76 3928.823 6335.177
## 120    7548.000 572.1257 17.76 6344.823 8751.177
##
## var = 2:
## nrate  emmean      SE    df lower.CL upper.CL
## 0      4934.333 572.1257 17.76 3731.157 6137.510
## 60     6713.667 572.1257 17.76 5510.490 7916.843
## 120    7211.333 572.1257 17.76 6008.157 8414.510
##
## var = 3:
## nrate  emmean      SE    df lower.CL upper.CL
## 0      4249.667 572.1257 17.76 3046.490 5452.843
## 60     6122.333 572.1257 17.76 4919.157 7325.510
## 120    7868.333 572.1257 17.76 6665.157 9071.510
##
## var = 4:
## nrate  emmean      SE    df lower.CL upper.CL
## 0      4059.000 572.1257 17.76 2855.823 5262.177
## 60     5553.667 572.1257 17.76 4350.490 6756.843
## 120    7094.333 572.1257 17.76 5891.157 8297.510
##
## var = 5:
## nrate  emmean      SE    df lower.CL upper.CL
## 0      4101.667 572.1257 17.76 2898.490 5304.843
## 60     5633.333 572.1257 17.76 4430.157 6836.510
## 120    6012.000 572.1257 17.76 4808.823 7215.177
##
## var = 6:
## nrate  emmean      SE    df lower.CL upper.CL
## 0      3207.333 572.1257 17.76 2004.157 4410.510
## 60     3714.333 572.1257 17.76 2511.157 4917.510
## 120    2492.000 572.1257 17.76 1288.823 3695.177
##
## Degrees-of-freedom method: kenward-roger
## Confidence level used: 0.95
##
## $contrasts

```

```

## var = 1:
## contrast      estimate      SE    df t.ratio p.value
## 0 - 60    -1560.3333  557.9682  22.43  -2.796  0.0270
## 0 - 120   -3976.3333  557.9682  22.43  -7.126  <.0001
## 60 - 120  -2416.0000  557.9682  22.43   -4.330  0.0007
##
## var = 2:
## contrast      estimate      SE    df t.ratio p.value
## 0 - 60    -1779.3333  557.9682  22.43   -3.189  0.0112
## 0 - 120   -2277.0000  557.9682  22.43   -4.081  0.0013
## 60 - 120   -497.6667  557.9682  22.43   -0.892  0.6508
##
## var = 3:
## contrast      estimate      SE    df t.ratio p.value
## 0 - 60    -1872.6667  557.9682  22.43   -3.356  0.0076
## 0 - 120   -3618.6667  557.9682  22.43   -6.485  <.0001
## 60 - 120  -1746.0000  557.9682  22.43   -3.129  0.0128
##
## var = 4:
## contrast      estimate      SE    df t.ratio p.value
## 0 - 60    -1494.6667  557.9682  22.43   -2.679  0.0349
## 0 - 120   -3035.3333  557.9682  22.43   -5.440  <.0001
## 60 - 120  -1540.6667  557.9682  22.43   -2.761  0.0292
##
## var = 5:
## contrast      estimate      SE    df t.ratio p.value
## 0 - 60    -1531.6667  557.9682  22.43   -2.745  0.0302
## 0 - 120   -1910.3333  557.9682  22.43   -3.424  0.0065
## 60 - 120   -378.6667  557.9682  22.43   -0.679  0.7781
##
## var = 6:
## contrast      estimate      SE    df t.ratio p.value
## 0 - 60     -507.0000  557.9682  22.43   -0.909  0.6406
## 0 - 120      715.3333  557.9682  22.43    1.282  0.4196
## 60 - 120    1222.3333  557.9682  22.43    2.191  0.0947
##
## P value adjustment: tukey method for comparing a family of 3 estimates

```