

Neighbour balance in a strip-block design for an experiment on irrigation

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(Joint work with Silvio Zocchi, ESALQ)

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Irrigation experiment on citrus plants in a greenhouse

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This is called a **strip-block** design or **criss-cross** design.

One block of the design

	22	22	24	24	21	21	23	23	
	22	22	24	24	21	21	23	23	
	42	42	44	44	41	41	43	43	
	42	42	44	44	41	41	43	43	
	32	32	34	34	31	31	33	33	
	32	32	34	34	31	31	33	33	
	12	12	14	14	11	11	13	13	
	12	12	14	14	11	11	13	13	

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In order not to lose degrees of freedom, it may be better not to model these neighbour effects explicitly but to use a **neighbour-balanced** design.

Constructing a neighbour-balanced design

- ▶ Start with a special column whose differences are all different modulo 4: $0 - 3 = 1$; $3 - 1 = 2$; $1 - 2 = 3$.

0	
3	
1	
2	

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0	1	2	3	0	1	2	3
3	0	1	2	3	0	1	2
1	2	3	0	1	2	3	0
2	3	0	1	2	3	0	1

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- ▶ Develop this column modulo 4.
- ▶ Now every level has every **other** level on the immediate North the same number of times (ditto South).

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3	0	1	2	3	0	1	2
1	2	3	0	1	2	3	0
2	3	0	1	2	3	0	1

Design key modulo 4 to construct the design

factors	$N, L \text{ (water)}, R \text{ (rows)}, C \text{ (columns)}, B_1$	B_2
levels modulo 4	$0, 1, 2, 3$	$0, 2$

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Put $L \equiv R + B_1$ and $N \equiv C + B_1 + B_2$. (This is the design key.)

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- ▶ N is confounded with columns in each block, in a neighbour-balanced design.

One block of the design

This is the block in which $B_1 = 1$ and $B_2 = 2$.

$$L = R + B_1 = R + 1 \quad (\text{shown first})$$

$$N = C + B_1 + B_2 = C + 3 \quad (\text{shown second})$$

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		C			
		0	3	1	2
R	0	1 3	1 2	1 0	1 1
	3	0 3	0 2	0 0	0 1
	1	2 3	2 2	2 0	2 1
	2	3 3	3 2	3 0	3 1

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L represents the factor water, with 4 levels.

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The 3 df for L are aliased with 3 of the df for $R.B$:
are these for 'rows within blocks' or
for 'the interaction of rows and blocks'?

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Because of our neighbour-balanced design, there is a 4-level factor **Row position** and a 4-level factor **Column position**, and these are completely crossed with each other and with the 8-level factor **Blocks**.

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$R, 2R, 3R$	3 df	contrasts between row-positions
$B_1, 2B_1, 3B_1,$ $B_2,$	7df	contrasts between blocks
$B_1 + B_2, 2B_1 + B_2, 3B_1 + B_2$		
all other combinations of $R, B_1,$ and B_2	21 df	contrasts between rows within blocks and row-positions

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Each level of **Position** has a constant level of R and a constant level of C .

Because $L \equiv R + B_1$ and $N = C + B_1 + B_2$, each level of **Position** has 8 treatments.

Because $2L + 2N \equiv 2R + 2C + 4B_1 + 2B_2 = 2R + 2C$, these 8 are either those satisfying $2L + 2N = 0$ or those satisfying $2L + 2N = 2$.

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We should like this single degree of freedom confounded with **Position** to be orthogonal to the linear-by-linear component of the N -by- L interaction.

Real levels of L and N

L	0	1	2	3	\leftarrow 3 df
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The confounded contrast is $2L + 2N$.

If N and L both have equally-spaced real levels, and the two extreme levels of each correspond to either notional levels 0, 2 or notional levels 1, 3, then the confounded contrast is the quadratic-by-quadratic component of the N -by- L interaction.

- ▶ Randomize **B**locks.

Randomization

- ▶ Randomize **Blocks**.
- ▶ We cannot randomize **Row Position** (apart from randomly reflecting it or not) or **Column Position**, without destroying the neighbour balance.

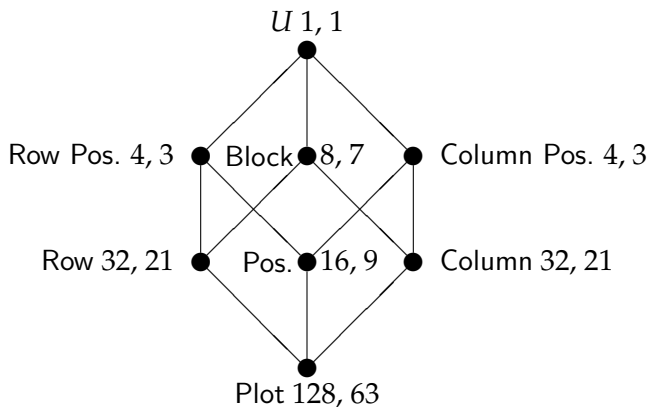
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- ▶ If we randomize the levels of N or of L , we change the contrast which is confounded with **Position**. So, for each treatment factor independently, we choose at random among the 8 possible labellings that make its two extreme levels correspond to either notional levels 0, 2 or notional levels 1, 3.

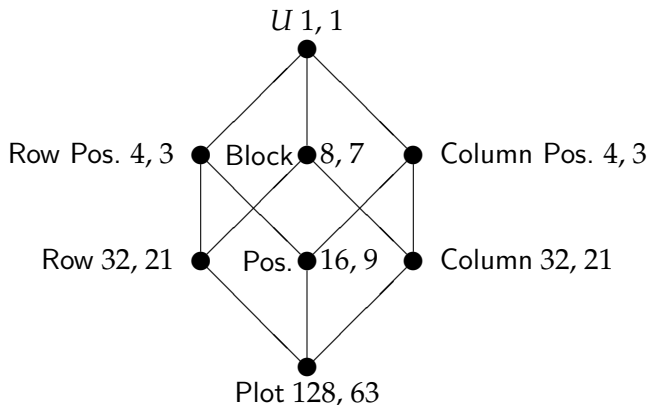
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- ▶ For validity, strictly speaking we should introduce two 2-level factors 2R and 2C which distinguish 'outer' from 'inner'. However, this gives 18 strata in the ANOVA, and we do not believe that inner/outer corresponds to any real effect, especially as each block is surrounded by 'guard' pots. So we do not do this.

Hasse diagram for the plot structure

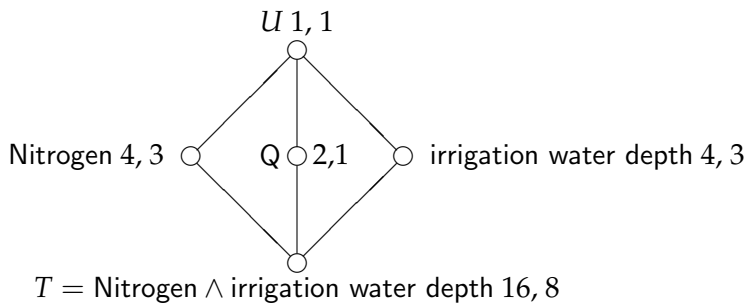


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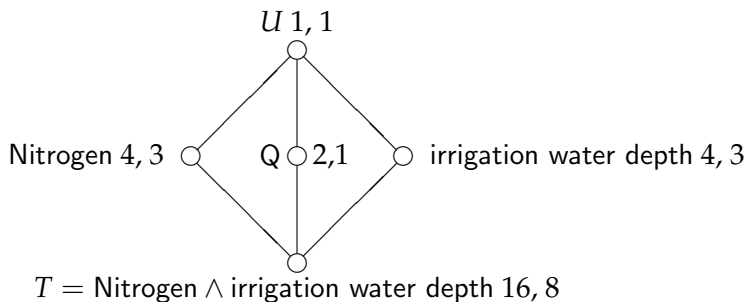


The response on each plot is the mean of the responses on the 4 pots in that plot.

Hasse diagram for the treatment structure



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$$Q = 2N + 2L:$$

the contrast between its 2 levels is $\text{quadratic}(N) \times \text{quadratic}(L)$.

ANOVA table

stratum	df		
<i>U</i>	1		
Block	7		
Rowpos	3		
Colpos	3		
Position	9		
Row	21		
Column	21		
Plot	63		
Total	128		

ANOVA table

stratum	df	source	df
U	1		
Block	7		
Rowpos	3		
Colpos	3		
Position	9	Q	1
Row	21	L	3
Column	21	N	3
Plot	63	$N \wedge L - Q$	8
Total	128		

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stratum	df	source	df
U	1		
Block	7		
Rowpos	3		
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Position	9	Q residual	1 8
Row	21	L residual	3 18
Column	21	N residual	3 18
Plot	63	$N \wedge L - Q$ residual	8 55
Total	128		

ANOVA table

stratum	df	source	df
U	1	mean	1
Block	7	Block	7
Rowpos	3	Rowpos	3
Colpos	3	Colpos	3
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