

# Valid restricted randomization for small experiments

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Joint work with Josh Paik (Penn State University)

## Introductory example

Suppose that scientists at a horticultural research institute are planning an experiment to compare three varieties of tomato, labelled  $A$ ,  $B$  and  $C$ , to see which gives the biggest yield (in weight of fruit per plant). They propose to use a greenhouse which has room for nine tomato plants in a single row. The initial, systematic layout is shown below.

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variety ("treatment")	$A$	$A$	$A$	$B$	$B$	$B$	$C$	$C$	$C$

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The usual method of randomization is to take a random permutation from the symmetric group  $S_9$  of all possible permutations of nine objects, and apply it to that initial layout. What should we do if a random permutation from  $S_9$  gives a layout such as  $AAABBBCCC$  or  $CCCAAABBB$  or  $BCAAACCBB$ ?

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Devil 2: If you keep doing that, differences between regions will contribute more to the estimate of experimental error than they will to the estimates of differences between varieties, so you may fail to detect genuine differences between varieties.

Angel: Can we use a smaller set of potential layouts with the properties that

- (a) we never get a series of 3 adjacent plots with the same variety;
- (b) we do not get the bias mentioned by Devil 2?



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He explained this well in his 1935 book *Design of Experiments*.

In 1939, Yates proposed the term **restricted randomization** for any method of randomization that does not include all possible layouts (but preferably avoids both forms of bias).

## Plot structure

Inherent nuisance factors

Maybe none

Maybe blocks

Maybe rows and columns

Small units inside large units

## Treatment structure

How many?

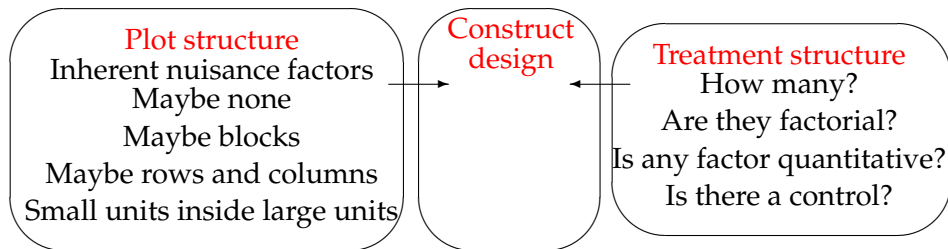
Are they factorial?

Is any factor quantitative?

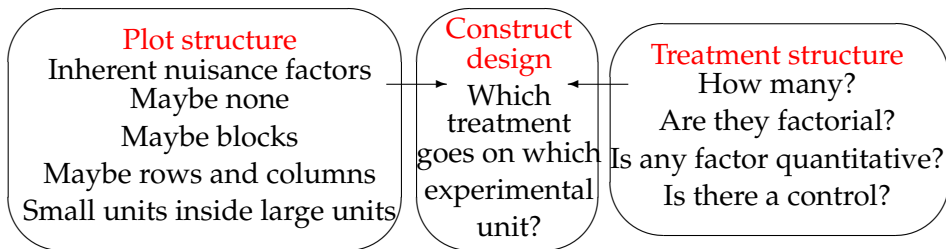
Is there a control?



# Terminology: UK, Australia



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## Randomization

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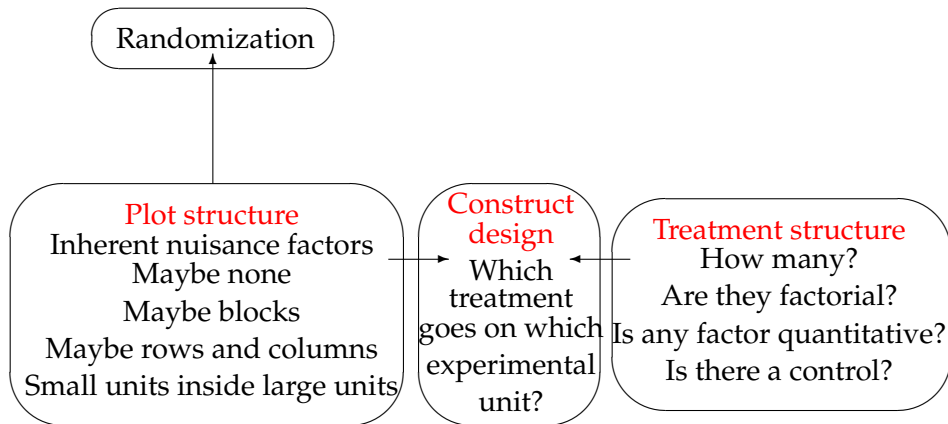
### Construct design

Which treatment goes on which experimental unit?

### Treatment structure

How many?  
Are they factorial?  
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Choose a permutation at random from **all** permutations of the plots that preserve the plot structure.

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**Restricted randomization** means using only a proper subset of the possible layouts.

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From now on, I will continue to use the term **restricted randomization** in the sense that Yates did.

## Valid randomization

In the context of experiments with a single error term in the analysis of variance,  
Fisher and Yates said that a method of randomization should have the property that,  
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This property was strengthened by Grundy and Healy in 1950 by requiring the expected mean square for any subset of treatment comparisons to be equal to the expected mean square for error. A method of randomization satisfying this property is called **strongly valid**.



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## Some notation and technical details

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Random choice of layout for the experiment turns all our statistical notions (such as estimators and mean squares) into random variables.

## More technical details

In an unblocked experiment with equal replication, a method of randomization is strongly valid if there are probabilities  $p_1$  and  $p_2$  such that, whenever  $\alpha$  and  $\beta$  are distinct plots,

$$P(T(\alpha) = T(\beta) = i) = p_1 \quad \text{for each treatment } i \quad (1)$$

and

$$P(T(\alpha) = i \text{ and } T(\beta) = j) = p_2 \quad \text{whenever } i \neq j. \quad (2)$$

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If a strongly valid method of randomization is used, then all pairs of distinct plots have the same probability  $p_2$  of contributing to the estimator of the difference between any ordered pair of distinct treatments, and probability  $vp_1$  of contributing to the mean square for error, where  $v$  is the number of treatments.



## Even more technical details

Suppose that there are  $v$  treatments, each with replication  $r$ , so that the number  $N$  of plots is given by  $N = vr$ . If Equations (1) and (2) are satisfied, then

$$p_1 = \frac{1}{v} \frac{r-1}{N-1} \quad (3)$$

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For a Latin square, there is one such pair for plots in the same row or in the same column, and another such pair for plots which are in different rows and different columns.

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Here we restrict attention to unblocked experiments where the plots form a single line. Denote the design for such an unblocked experiment by  $\Delta$ .

# First strongly valid method, using permutation groups

A group of permutations of the set of  $N$  plots is **doubly transitive** if, whenever  $\alpha, \beta, \gamma$  and  $\delta$  are plots with  $\alpha \neq \beta$  and  $\gamma \neq \delta$ , there is a some permutation in the group which takes  $\alpha$  to  $\gamma$  and  $\beta$  to  $\delta$ .

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In 1976–1978, RAB was employed as a post-doc at the Agricultural Research Council Unit of Statistics (in Edinburgh) because her DPhil thesis was about finite permutation groups. This led to a paper on restricted randomization for Latin squares (and other things) in *Biometrika* in 1983.



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Given such a rectangle, Youden proposed randomizing by choosing one of the rows with equal probability and then randomizing the actual treatments to the letters in that row.

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<i>A</i>	<i>B</i>	<i>B</i>	<i>A</i>	<i>C</i>	<i>C</i>
<i>A</i>	<i>B</i>	<i>C</i>	<i>B</i>	<i>A</i>	<i>C</i>
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Suppose that  $v = 3$  and  $r = 2$ .

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Randomize by choosing one of the 5 rows with equal probability, then randomizing the 3 treatments to *A*, *B* and *C*.

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If  $\alpha$  and  $\beta$  are the labels of two different columns, then there are precisely  $\lambda$  rows which have the same letter in both of those columns.

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2. Randomize the allocation of the treatments in our design  $\Delta$  to the  $v$  letters in that row.

## Our approach, continued

The first step ensures that, for each pair of distinct columns  $\alpha$  and  $\beta$ ,  $P(T(\alpha) = T(\beta)) = \lambda/m$ .

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Likewise,  $P(T(\alpha) \neq T(\beta)) = (m - \lambda)/m$ , and this probability is equally split between the  $v(v - 1)$  ordered pairs of distinct treatments in  $\Delta$ , and so

$$p_2 = \frac{1}{v(v-1)} \frac{m - \lambda}{m} = \frac{1}{v(v-1)} \frac{(N-r)}{N-1} = \frac{1}{v} \frac{r}{N-1},$$

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As with the first method, the task now is to find a permutation of the columns of the  $m \times N$  rectangle such none of the  $m$  rows gives a bad pattern.

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Each row contains exactly two adjacent pairs of columns with the same letter.

Moreover, no row has all three occurrences of any letter in either the first or last four columns.

# A potential catalogue

We are working on creating a catalogue of rectangles which give valid restricted randomization.

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When  $v = 2$  and  $r = 3$ , then  $\Gamma$  must be a resolved balanced incomplete-block design for 6 treatments in blocks of size 3.

The smallest such design consists of all triples of treatments, and so we cannot avoid the layout  $AAABBB$ .



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For example, here is a valid restricted randomization scheme for  $v = 5$  and  $r = 3$ .

1	2	3	4	5	6	7	8	9	10	11	12	13	14	15
A	C	E	B	E	B	D	D	A	E	C	C	D	A	B
A	A	C	B	D	C	D	A	B	B	E	D	E	C	E
B	A	D	B	A	E	E	C	E	C	C	D	B	A	D
E	B	D	B	C	C	B	A	D	E	D	E	C	A	A
D	E	E	B	A	D	C	A	A	C	D	B	E	B	C
A	D	B	B	A	D	E	B	C	D	E	C	C	E	A
C	A	C	B	B	E	C	E	A	D	B	E	D	D	A

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E	B	D	B	C	C	B	A	D	E	D	E	C	A	A
D	E	E	B	A	D	C	A	A	C	D	B	E	B	C
A	D	B	B	A	D	E	B	C	D	E	C	C	E	A
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Two identical duads per row.

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A	D	B	B	A	D	E	B	C	D	E	C	C	E	A
C	A	C	B	B	E	C	E	A	D	B	E	D	D	A

Two identical duads per row. No identical triads in any row.