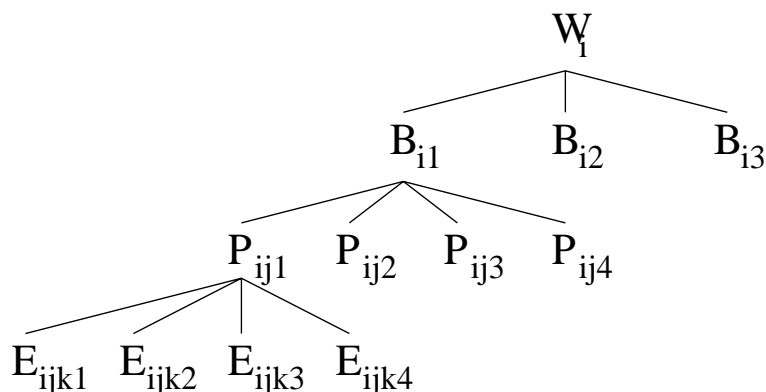


Solution to exercise 41, new version (2007)

Each week (W) 3 batches (B) are selected and from each batch samples are taken from 4 productions (P) (each batch gives rise to several productions). The conductivity is measured on 4 tiles (E) from each production. The structure of the data is thus (in principle):



in that each week has 3 batches, each batch has 4 productions and each production has 4 tiles, that is a complete hierarchical structure which can be modelled using the terms:

$$B(W) \text{ , } P(WB) \text{ and } E(WBP)$$

Question 1

We are interested in identifying sources of variation and it is therefore reasonable to model all effects as random. The statistical model is then:

$$Y_{ijkl} = \mu + W_i + B(W)_{j(i)} + P(WB)_{k(ij)} + E_{l(ijk)},$$

where μ is the general level and

$$\begin{aligned} W_i &\in N(0, \sigma_W^2); & B(W)_{j(i)} &\in N(0, \sigma_{B(W)}^2); \\ P(WB)_{k(ij)} &\in N(0, \sigma_{P(WB)}^2); & E_{l(ijk)} &\in N(0, \sigma_E^2) \end{aligned}$$

For brevity the term $E(WBP)_{l(ijk)}$ is written as $E_{l(ijk)}$.

EMS-table for ANOVA

	i	j	k	l	σ_W^2	$\sigma_{B(W)}^2$	$\sigma_{P(WB)}^2$	σ_E^2
	3	3	4	4				
W_i	1	3	4	4	48	16	4	1
$B(W)_{j(i)}$	1	1	4	4		16	4	1
$P(WB)_{k(ij)}$	1	1	1	4			4	1
$E_{l(ijk)}$	1	1	1	1				1

The $P(WB)$ effect is tested against the E effect. The $B(W)$ effect is tested against the $P(WB)$ effect. The W effect is tested against the $B(W)$ effect.

If reasonable (after testing) sums of squares from not significant effects can be pooled which will lead to stronger tests.

If, for example, the $P(WB)$ effect is not significant its SSQ can be pooled with the residual SSQ and subsequently the $B(W)$ term can be tested against the new residual SSQ.

Question 2

The sums of squares for our model can be derived from the sums of squares for a completely crossed splitting of the variation:

$$\begin{aligned}
SSQ_W &= 411.3, f = 2 \\
SSQ_{B(W)} &= SSQ_B + SSQ_{WB} = 211.1, f = 6 \\
SSQ_{P(WB)} &= SSQ_P + SSQ_{BP} + SSQ_{WP} + SSQ_{WBP} = 545.9, f = 27 \\
SSQ_{E(WBP)} &= SSQ_E + SSQ_{EW} + SSQ_{EB} + SSQ_{EWB} + SSQ_{EP} + \\
&\quad SSQ_{EWP} + SSQ_{EBP} + SSQ_{EWBP} = 180.1, f = 108.
\end{aligned}$$

The ANOVA table thus becomes:

Variation	SSQ	f	EMS
W	411.3	2	$48\sigma_W^2 + 16\sigma_{B(W)}^2 + 4\sigma_{P(WB)}^2 + \sigma_E^2$
$B(W)$	211.1	6	$16\sigma_{B(W)}^2 + 4\sigma_{P(WB)}^2 + \sigma_E^2$
$P(WB)$	545.9	27	$4\sigma_{P(WB)}^2 + \sigma_E^2$
Residual E	180.1	108	σ_E^2
Total	1348.4	143	

$$H_0^{(1)} : \sigma_{P(WB)}^2 = 0 \text{ against } H_1^{(1)} : \sigma_{P(WB)}^2 \neq 0$$

$$F = \frac{545.9/27}{180.1/108} = 12.1,$$

which is compared with an $F(27, 108)$ -distribution. It is strongly significant.

$H_0^{(2)} : \sigma_{B(W)}^2 = 0$ against $H_1^{(2)} : \sigma_{B(W)}^2 \neq 0$

$$F = \frac{211.1/6}{545.9/27} = 1.7 \sim F(6, 27)_{0.16} \Rightarrow H_0^{(2)}.$$

New pooled $SSQ_{P(WB)} = 191.3 + 535.7 = 757.0$, $f = 33$.

$H_0^{(3)} : \sigma_W^2 = 0$ against $H_1^{(3)} : \sigma_W^2 \neq 0$

$$F = \frac{411.3/2}{757.0/33} = 9.0 > F(2, 33)_{0.001} \Rightarrow H_1^{(3)}$$

Thus the identified model is:

$$Y_{ijkl} = \mu + W_i + P(WB)_{k(ij)} + E_{l(ijk)}$$

which includes a variation between weeks and between productions, while batches do not seem to be very different.

Question 3

The estimates corresponding to the final model are:

$$\begin{aligned} \hat{\mu} &= \bar{x} \\ \hat{\sigma}_E^2 &= \frac{180.1}{108} = 1.667 = 1.29^2 \\ \hat{\sigma}_{P(WB)}^2 &= \frac{1}{4} \left(\frac{757.0}{33} - \frac{180.1}{108} \right) = 5.318 = 2.31^2 \\ \hat{\sigma}_W^2 &= \frac{1}{48} \left(\frac{411.3}{2} - \frac{757.0}{33} \right) = 3.806 = 1.95^2 \end{aligned}$$

One could removed the batches from the model and conclude:

$$Y_{ijkl} = \mu + W_i + P(W)_{k(i)} + E_{l(ik)}$$

where now k is production number within one week and then

$$\begin{aligned} \hat{\mu} &= \bar{x} \\ \hat{\sigma}_E^2 &= \frac{180.1}{108} = 1.667 = 1.29^2 \\ \hat{\sigma}_{P(W)}^2 &= \frac{1}{4} \left(\frac{757.0}{33} - \frac{180.1}{108} \right) = 5.318 = 2.31^2 \\ \hat{\sigma}_W^2 &= \frac{1}{48} \left(\frac{411.3}{2} - \frac{757.0}{33} \right) = 3.806 = 1.95^2 \end{aligned}$$

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