

## Variance Balance Cross-Over Designs

Variance balance cross-over designs are designs where all treatment contrasts have the same precision and all carry-over contrasts have the same precision. There are a large number of designs that meet these criteria. Patterson and Lucas catalogued many of these designs in 1962. The "Cross-Over Experiment" textbook by Ratkowsky, Evans, and Allredge, 1993 present all of the Patterson-Lucas designs in Appendix 5.A. They also include efficiencies of the designs.

### Example of Variance Balance Cross-Over Design

The following study used a digram-balanced Latin squares design. This design is designated PL2 in the "Cross-Over Experiment" textbook. Cochran and Cox originally presented this design in 1957.

| Square  |   | 1        |          |          | 2        |          |          |
|---------|---|----------|----------|----------|----------|----------|----------|
| Patient |   | A        | B        | C        | D        | E        | F        |
| Period  | 1 | Standard | Placebo  | Test     | Standard | Placebo  | Test     |
|         | 2 | Placebo  | Test     | Standard | Test     | Standard | Placebo  |
|         | 3 | Test     | Standard | Placebo  | Placebo  | Test     | Standard |

This study was designed to compare the effects on heart rate of three treatments (placebo, standard, and test). Each sequence was randomly assigned to four patients each. Heart rate was measured one hour after each treatment. The model for this study is the following:

$$y_{ijk} = \mu + \gamma_i + \xi_{i(k)} + \pi_j + \tau_{t(ij)} + \delta_j \lambda_{r(ij)} + e_{ijk}$$

$\mu$  = mean

$\gamma_i$  = sequence effect for sequence i

$\xi_{i(k)}$  = random subject effect nested within sequence

$\pi_j$  = period effect for period j

$\tau_{t(ij)}$  = direct treatment effect for treatment t

$\lambda_{r(ij)}$  = the first-order "carryover" effect due to treatment r, where r is the treatment applied the previous period

$\delta_j$  = an indicator variable: 0 if it is the first period

1 if the period is greater than 1

There are a couple of different ways that the carryover effect can be coded in a dataset. The first way is having only one carryover class variable. For example, for the first two patients in this study, the data with the carryover coded this way would look like with the first period carry coded to N. In addition, there is the delta indicator variable, coded as described above. Note that the period variable is coded 2, 3, 4, rather than 1, 2, 3. This is because the period refers to the original visit schedule and the first visit was a pre-treatment, baseline visit.

| Obs | patient | sequence | period | basehr | hr  | drug | CARRY | delta |
|-----|---------|----------|--------|--------|-----|------|-------|-------|
| 1   | 1       | B        | 2      | 86     | 86  | P    | N     | 0     |
| 2   | 1       | B        | 3      | 86     | 106 | T    | P     | 1     |
| 3   | 1       | B        | 4      | 62     | 79  | S    | T     | 1     |
| 4   | 2       | F        | 2      | 48     | 66  | T    | N     | 0     |
| 5   | 2       | F        | 3      | 58     | 56  | P    | T     | 1     |
| 6   | 2       | F        | 4      | 74     | 79  | S    | P     | 1     |

You can also explicitly create covariates for the carryover effects of specific treatments. Because we have three treatments, we can set up covariates for two of them: CARRYT for the carryover effect of the test treatment and CARRYS for the carryover effect of the standard treatment. The linear model for this would be

$$y_{ijk} = \mu + \gamma_i + \xi_{i(k)} + \pi_j + \tau_{t(ij)} + \delta_j \lambda_{s(ij)} + \delta_j \lambda_{e(ij)} + e_{ijk}$$

which is the same model we had before, except that now, we are separating out the coefficients for the two covariates:  $\lambda_{s(ij)}$  is for the carryover effect for the standard treatment, while  $\lambda_{e(ij)}$  is for the carryover effect for the test treatment. The values that carryt and carrys take are either 0, 1, or -1, depending on the previous periods treatment. The three carryover effects have a sum to zero constraint.

$$0 = \lambda_p + \lambda_s + \lambda_e$$

If we move the placebo carryover effect to the other side of the equation and multiply both sides by -1, we get the following:

$$\lambda_p = -\lambda_s - \lambda_e$$

Therefore, the placebo carryover effect can be represented by -1 in the CARRYT and CARRYS values. The first patient received the placebo treatment the first period. For the first period, because there is no carryover, both covariates are set to 0. The second period, the patient receives the test treatment. Because placebo was given the first period, the CARRYS and CARRYT values will both be -1. For the third period, the CARRYT value is 1, because the test treatment was given the previous period. The second patient received the standard treatment the first period, placebo the second period and the test treatment the third period. For period 2, the CARRYS value is 1, while the CARRYT value is 0. Because placebo was given the second period, both the CARRYS and CARRYT values are -1 for the third period. Following is a printout of the first two patients.

| Obs | patient | sequence | period | basehr | hr | drug | carryt | carrys |
|-----|---------|----------|--------|--------|----|------|--------|--------|
| 1   | 1       | B        | 2      | 86     | 86 | P    | 0      | 0      |

|   |   |   |   |    |     |   |    |    |
|---|---|---|---|----|-----|---|----|----|
| 2 | 1 | B | 3 | 86 | 106 | T | -1 | -1 |
| 3 | 1 | B | 4 | 62 | 79  | S | 1  | 0  |
| 4 | 2 | F | 2 | 48 | 66  | T | 0  | 0  |
| 5 | 2 | F | 3 | 58 | 56  | P | 1  | 0  |
| 6 | 2 | F | 4 | 74 | 79  | S | -1 | -1 |

First the two datasets are read into SAS:

```
option ps=67 ls=67;
filename cc 'C:\users\kathy\statistics department\statistics 892- mixed
models\cochran-cox-crossover.dat';
filename cc2 'C:\users\kathy\statistics department\statistics 892-
mixed models\cochran-cox-CARRY.dat';
data hrtrate;
infile cc;
input patient sequence $ period basehr hr drug $ carryt carrys;
run;
data hrtrate2;
infile cc2;
input patient sequence $ period basehr hr drug $ CARRY $;
delta=(carry^='N');
if carry='N' then carryc='P';
else carryc=carry;
run;
```

Data **hrtrate** is the dataset we will use for the two covariate analysis and **hrtrate2** is the dataset we will use for the carryover as a classification effect analysis. Note that for the **hrtrate2** dataset, we are creating the indicator variable delta, which is 0 when it is the first period (carry='N') and 1 otherwise. Note that we are creating a new variable carryc which is arbitrarily set to 'P' if carry='N' and set to the carry value otherwise. Otherwise, because 'N' appears only in Period 2, we would run into problems of non-estimability. We could have recoded 'N' to any of the other treatment codes and ended up with the same results.

We'll run the analysis with the carryover effect treated as a classification (first dataset) and with the carryover effects as the two covariates (second dataset). Following is the SAS code. Note that just as the linear model specifies, there is a carryc\*delta term. Because the delta term is not a class variable, we have to use estimate statements in order to look at the differences in the carryover effects among the treatments.

```
*analysis using delta indicator variable for the carry effect;
proc mixed data=hrtrate2;
class patient sequence period carryc drug;
model hr = sequence period drug carryc*delta/solution ;
random patient(sequence);
estimate 'carry P-S' carryc*delta 1 -1 0;
estimate 'carry P-T' carryc*delta 1 0 -1;
estimate 'carry S-T' carryc*delta 0 1 -1;
lsmeans drug/pdiff;
run;
```

Following are the solutions for the fixed effects.

Solution for Fixed Effects

| Effect       | sequence | carryc | drug | period | Estimate | Standard Error |
|--------------|----------|--------|------|--------|----------|----------------|
| Intercept    |          |        |      |        | 81.0625  | 5.4737         |
| sequence     | A        |        |      |        | 1.7083   | 6.6802         |
| sequence     | B        |        |      |        | 1.5000   | 6.5915         |
| sequence     | C        |        |      |        | 3.0208   | 6.6802         |
| sequence     | D        |        |      |        | 8.8542   | 6.6802         |
| sequence     | E        |        |      |        | 7.5417   | 6.6802         |
| sequence     | F        |        |      |        | 0        | .              |
| period       |          |        |      | 2      | -2.8125  | 2.8702         |
| period       |          |        |      | 3      | 0.7500   | 2.1697         |
| period       |          |        |      | 4      | 0        | .              |
| drug         |          |        | P    |        | -5.9375  | 2.4258         |
| drug         |          |        | S    |        | -3.6250  | 2.4258         |
| drug         |          |        | T    |        | 0        | .              |
| delta*carryc |          | P      |      |        | 3.9375   | 3.2545         |
| delta*carryc |          | S      |      |        | -4.6250  | 3.2545         |
| delta*carryc |          | T      |      |        | 0        | .              |

Type 3 Tests of Fixed Effects

| Effect       | Num DF | Den DF | F Value | Pr > F |
|--------------|--------|--------|---------|--------|
| sequence     | 5      | 18     | 0.58    | 0.7165 |
| period       | 1      | 42     | 0.12    | 0.7313 |
| drug         | 2      | 42     | 3.04    | 0.0583 |
| delta*carryc | 2      | 42     | 3.47    | 0.0404 |

Note that there is a significant carryover effect and that the drug effect is approaching significance.

Estimates

| Label     | Estimate | Standard Error | DF | t Value | Pr >  t |
|-----------|----------|----------------|----|---------|---------|
| carry P-S | 8.5625   | 3.2545         | 42 | 2.63    | 0.0119  |
| carry P-T | 3.9375   | 3.2545         | 42 | 1.21    | 0.2331  |
| carry S-T | -4.6250  | 3.2545         | 42 | -1.42   | 0.1627  |

Least Squares Means

| Effect | drug | Estimate | Standard Error | DF | t Value | Pr >  t |
|--------|------|----------|----------------|----|---------|---------|
| drug   | P    | 78.0556  | 2.3626         | 42 | 33.04   | <.0001  |
| drug   | S    | 80.3681  | 2.3626         | 42 | 34.02   | <.0001  |
| drug   | T    | 83.9931  | 2.3626         | 42 | 35.55   | <.0001  |

Differences of Least Squares Means

| Effect | drug | _drug | Estimate | Standard Error | DF | t Value | Pr >  t |
|--------|------|-------|----------|----------------|----|---------|---------|
| drug   | P    | S     | -2.3125  | 2.4258         | 42 | -0.95   | 0.3459  |
| drug   | P    | T     | -5.9375  | 2.4258         | 42 | -2.45   | 0.0186  |
| drug   | S    | T     | -3.6250  | 2.4258         | 42 | -1.49   | 0.1426  |

The carryover effect of the standard treatment is significantly different from the carryover effect from the placebo treatment, where the heart rate in a period following a period with placebo treatment is significantly faster than the heart rate in a period following a period with the standard treatment.

We will now rerun the analysis using the two covariate model using the following SAS code

```
*analysis using the two carry variables with the 0 1, and -1 values;
proc mixed data=hrtrate;
class patient sequence period drug;
model hr = sequence period drug carrys carryt/solution;
random patient(sequence);
lsmeans drug/pdiff;
run;
```

Following are the solutions and least squares means.

Solution for Fixed Effects

| Effect    | sequence | drug | period | Estimate | Standard Error | DF |
|-----------|----------|------|--------|----------|----------------|----|
| Intercept |          |      |        | 80.8333  | 5.0254         | 18 |

|          |   |   |         |        |    |
|----------|---|---|---------|--------|----|
| sequence | A |   | 1.7083  | 6.6802 | 18 |
| sequence | B |   | 1.5000  | 6.5915 | 18 |
| sequence | C |   | 3.0208  | 6.6802 | 18 |
| sequence | D |   | 8.8542  | 6.6802 | 18 |
| sequence | E |   | 7.5417  | 6.6802 | 18 |
| sequence | F |   | 0       | .      | .  |
| period   |   | 2 | -2.5833 | 2.1697 | 42 |
| period   |   | 3 | 0.7500  | 2.1697 | 42 |
| period   |   | 4 | 0       | .      | .  |
| drug     | P |   | -5.9375 | 2.4258 | 42 |
| drug     | S |   | -3.6250 | 2.4258 | 42 |
| drug     | T |   | 0       | .      | .  |
| carry    |   |   | -4.3958 | 1.8790 | 42 |
| carryt   |   |   | 0.2292  | 1.8790 | 42 |

Note that these results are the same as the results from the previous analysis, except for the intercept and the carry and carryt. Because of the sum to zero constraint, the intercept for this model is shifted by the estimate of the carryt effect. We can verify this by adding the intercept and carryt estimates

$80.8333 + 0.2292 = 81.0625$  which is the estimate of the intercept for the first analysis.

We can calculate the differences in carryover effects using the sum to zero constraint for determining the carry effect and then taking the differences:

carry = -carry - carryt =  $-4.3958 - 0.2292 = 4.1666$   
 carry P-S =  $4.1666 - (-4.3958) = 8.5624$   
 carry P-T =  $4.1666 - 0.2292 = 3.9374$   
 carry S-T =  $-4.3958 - 0.2292 = -4.625$

These agree with the results from the previous analysis

| Estimates |          |                |    |         |         |
|-----------|----------|----------------|----|---------|---------|
| Label     | Estimate | Standard Error | DF | t Value | Pr >  t |
| carry P-S | 8.5625   | 3.2545         | 42 | 2.63    | 0.0119  |
| carry P-T | 3.9375   | 3.2545         | 42 | 1.21    | 0.2331  |
| carry S-T | -4.6250  | 3.2545         | 42 | -1.42   | 0.1627  |

| Least Squares Means |      |          |                |    |         |         |
|---------------------|------|----------|----------------|----|---------|---------|
| Effect              | drug | Estimate | Standard Error | DF | t Value | Pr >  t |
| drug                | P    | 78.0556  | 2.3626         | 42 | 33.04   | <.0001  |
| drug                | S    | 80.3681  | 2.3626         | 42 | 34.02   | <.0001  |
| drug                | T    | 83.9931  | 2.3626         | 42 | 35.55   | <.0001  |

Differences of Least Squares Means

| Effect | drug | _drug | Estimate | Standard Error | DF | t Value | Pr >  t |
|--------|------|-------|----------|----------------|----|---------|---------|
| drug   | P    | S     | -2.3125  | 2.4258         | 42 | -0.95   | 0.3459  |
| drug   | P    | T     | -5.9375  | 2.4258         | 42 | -2.45   | 0.0186  |
| drug   | S    | T     | -3.6250  | 2.4258         | 42 | -1.49   | 0.1426  |

Type 3 Tests of Fixed Effects

| Effect   | Num DF | Den DF | F Value | Pr > F |
|----------|--------|--------|---------|--------|
| sequence | 5      | 18     | 0.58    | 0.7165 |
| period   | 2      | 42     | 1.30    | 0.2835 |
| drug     | 2      | 42     | 3.04    | 0.0583 |
| carrys   | 1      | 42     | 5.47    | 0.0241 |
| carryt   | 1      | 42     | 0.01    | 0.9035 |

The least square means for the treatment effects and the tests of the fixed effects of sequence, period and drug are also the same as the previous analysis.