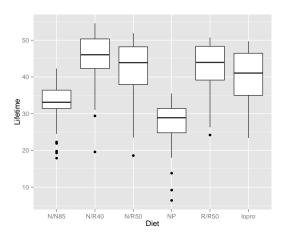
# STAT 401A - Statistical Methods for Research Workers One-way ANOVA (contrasts and multiple comparisons)

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# Mice lifetimes



# Simple hypothesis

Consider the one-way ANOVA model:  $Y_{ij} \sim N(\mu_j, \sigma^2)$  where  $j = 1, \dots, J$ .

Here are a few simple alternative hypotheses:

- Mean lifetimes for N/R50 and R/R50 diet are different.
- Mean lifetimes for N/R40 is different than for N/R50 and R/R50 combined.
- Mean lifetimes for high calorie (NP and N/N85) diets is different than for low calorie diets combined.

$$H_0: \gamma = 0$$
  $H_1: \gamma \neq 0:$  
$$\gamma_1 = \mu_{R/R50} - \mu_{N/R50}$$
 
$$\gamma_2 = \mu_{N/R40} - \frac{1}{2} (\mu_{N/R50} + \mu_{R/R50})$$
 
$$\gamma_3 = \frac{1}{4} (\mu_{N/R50} + \mu_{R/R50} + \mu_{N/R40} + \mu_{lopro}) - \frac{1}{2} (\mu_{NP} + \mu_{N/N85})$$

### Contrasts

#### Definition

A linear combination of group means has the form

$$\gamma = C_1 \mu_1 + C_2 \mu_2 + \ldots + C_J \mu_J$$

where  $\mathcal{C}_j$  are known coefficients and  $\mu_j$  are the unknown population means.

#### Definition

A linear combination with  $C_1 + C_2 + \cdots + C_J = 0$  is a contrast.

**Remark** Contrast interpretation is usually best if  $|C_1| + |C_2| + \cdots + |C_J| = 2$ , i.e. both the positive and negative coefficients sum to 1.

#### Inference on contrasts

$$\gamma = C_1 \mu_1 + C_2 \mu_2 + \dots + C_J \mu_J$$

Estimated by

$$g = C_1 \overline{Y}_1 + C_2 \overline{Y}_2 + \dots + C_J \overline{Y}_J$$

with standard error

$$SE(g) = s_p \sqrt{\frac{C_1^2}{n_1} + \frac{C_2^2}{n_2} + \dots + \frac{C_J^2}{n_J}}$$

t-statistic (compare to  $t_{n-J}$ ) and CI:

$$t = \frac{g}{SE(g)}$$
  $g \pm t_{n-J}(1 - \alpha/2)SE(g)$ 

## Contrasts for mice lifetime dataset

#### For these contrasts:

- Mean lifetimes for N/R50 and R/R50 diet are different.
- Mean lifetimes for N/R40 is different than for N/R50 and R/R50 combined.
- Mean lifetimes for high calorie (NP and N/N85) diets is different than for low calorie diets combined.

$$H_0: \gamma = 0$$
  $H_1: \gamma \neq 0:$ 

$$\begin{array}{ll} \gamma_1 &= \mu_{R/R50} - \mu_{N/R50} \\ \gamma_2 &= \mu_{N/R40} - \frac{1}{2} (\mu_{N/R50} + \mu_{R/R50}) \\ \gamma_3 &= \frac{1}{4} (\mu_{N/R50} + \mu_{R/R50} + \mu_{N/R40} + \mu_{lopro}) - \frac{1}{2} (\mu_{NP} + \mu_{N/N85}) \end{array}$$

| -                          | N/N85 | N/R40 | N/R50 | NP    | R/R50 | lopro |
|----------------------------|-------|-------|-------|-------|-------|-------|
| early rest - none @ 50kcal | 0.00  | 0.00  | -1.00 | 0.00  | 1.00  | 0.00  |
| 40kcal/week - 50kcal/week  | 0.00  | 1.00  | -0.50 | 0.00  | -0.50 | 0.00  |
| lo cal - hi cal            | -0.50 | 0.25  | 0.25  | -0.50 | 0.25  | 0.25  |

# Mice liftime examples

|   | Diet  | n  | mean  | sd   |
|---|-------|----|-------|------|
| 1 | N/N85 | 57 | 32.69 | 5.13 |
| 2 | N/R40 | 60 | 45.12 | 6.70 |
| 3 | N/R50 | 71 | 42.30 | 7.77 |
| 4 | NP    | 49 | 27.40 | 6.13 |
| 5 | R/R50 | 56 | 42.89 | 6.68 |
| 6 | lopro | 56 | 39.69 | 6.99 |
|   |       |    | ,     |      |

#### Contrasts:

|                            | g     | SE(g) | t     | р    | L     | U     |
|----------------------------|-------|-------|-------|------|-------|-------|
| early rest - none @ 50kcal | 0.59  | 1.19  | 0.49  | 0.62 | -1.76 | 2.94  |
| 40kcal/week - 50kcal/week  | 2.53  | 1.05  | 2.41  | 0.02 | 0.46  | 4.59  |
| lo cal - hi cal            | 12.45 | 0.78  | 15.96 | 0.00 | 10.92 | 13.98 |

SAS

```
DATA case0501:
  INFILE 'case0501.csv' DSD FIRSTOBS=2;
  INPUT lifetime diet $;
PROC MEANS DATA=case0501;
  CLASS diet;
  VAR lifetime;
  RUN:
```

The MEANS Procedure Analysis Variable : lifetime

| N<br>Obs | N                                 | Mean                                | Std Dev   | Minimum   | Maximum   |
|----------|-----------------------------------|-------------------------------------|---|---|---|
| 57       | <br>57                            | 32.6912281                          | 5.1252972   | 17.9000000  | 42.3000000  |
| 60       | 60                                | 45.1166667                          | 6.7034058   | 19.6000000  | 54.6000000  |
| 71       | 71                                | 42.2971831                          | 7.7681947   | 18.6000000  | 51.9000000  |
| 49       | 49                                | 27.4020408                          | 6.1337010   | 6.4000000   | 35.5000000  |
| 56       | 56                                | 42.8857143                          | 6.6831519   | 24.2000000  | 50.7000000  |
| 56       | 56                                | 39.6857143                          | 6.9916945   | 23.4000000  | 49.7000000  |
|          | 0bs<br>57<br>60<br>71<br>49<br>56 | 0bs N 57 57 60 60 71 71 49 49 56 56 | Obs         N         Mean           57         57         32.6912281           60         60         45.1166667           71         71         42.2971831           49         49         27.4020408           56         56         42.8857143 | Obs         N         Mean         Std Dev           57         57         32.6912281         5.1252972           60         60         45.1166667         6.7034058           71         71         42.2971831         7.7681947           49         49         27.4020408         6.1337010           56         56         42.8857143         6.6831519 | Obs         N         Mean         Std Dev         Minimum           57         57         32.6912281         5.1252972         17.9000000           60         60         45.1166667         6.7034058         19.600000           71         71         42.2971831         7.7681947         18.600000           49         49         27.4020408         6.1337010         6.4000000           56         56         42.8857143         6.6831519         24.2000000 |

SAS

```
PROC GLM;
 CLASS diet:
 MODEL lifetime = diet / CLPARM:
 ESTIMATE 'early rest - none @ 50kcal' diet 0 1 -1 0 0 0;
 ESTIMATE '40kcal/week - 50kcal/week' diet 0 2 -1 0 -1 0 / DIVISOR = 2;
 ESTIMATE 'lo cal - hi cal'
                                   diet -2 1 1 -2 1 1 / DIVISOR = 4;
 RUN;
 QUIT;
```

#### The GLM Procedure

|  |                 |             | Sum o      | f            |         |         |         |
|--|-----------------|-------------|------------|--------------|---------|---------|---------|
|  | Source          | DF          | Square     | s Mean So    | quare   | F Value | Pr > F  |
|  | Model           | 5           | 12733.9418 | 1 2546.7     | 78836   | 57.10   | <.0001  |
|  | Error           | 343         | 15297.4153 | 2 44.5       | 59888   |         |         |
|  | Corrected Total | 348         | 28031.3571 | 3            |         |         |         |
|  |                 |             |            | Standa       | rd      |         |         |
|  | Parameter       |             | Estimate   | Erro         | or t    | Value   | Pr >  t |
| early rest - none @ 50kcal<br>40kcal/week - 50kcal/week                |                 | 50kcal      | 0.5885312  | 1.1935500    | 07      | 0.49    | 0.6223  |
|  |                 | /week       | 2.5252180  | 1.0485490    | )4      | 2.41    | 0.0166  |
|  | lo cal - hi cal |             | 12.4496851 | 0.7800142    | 25      | 15.96   | <.0001  |
| Parameter<br>early rest - none<br>40kcal/week - 50k<br>lo cal - hi cal |                 | er          |            | 95% Confider | nce Lim | nits    |         |
|  |                 | @ 50kcal    | -1.7590676 | 2.93         | 61299   |         |         |
|  |                 | week - 50kc | cal/week   | 0.4628224    | 4.58    | 76136   |         |
|  |                 | - hi cal    |            | 10.9154718   | 13.98   | 38985   |         |

R

```
library(multcomp)
m = lm(Lifetime~Diet-1, case0501) # The -1 indicates no intercept (see Ch 7)
summary(m)
Call:
lm(formula = Lifetime ~ Diet - 1, data = case0501)
Residuals:
   Min
                           30
            10 Median
                                  Max
-25.517 -3.386 0.814 5.183 10.014
Coefficients:
         Estimate Std. Error t value Pr(>|t|)
DietN/N85 32.691
                      0.885
                               37.0
                                     <2e-16 ***
DietN/R40 45.117
                      0.862
                            52.3
                                     <2e-16 ***
DietN/R50 42.297
           42.297 0.793 53.4
27.402 0.954 28.7
                                     <2e-16 ***
                                    <2e-16 ***
DietNP
DietR/R50 42.886 0.892 48.1
                                     <2e-16 ***
Dietlopro 39.686
                      0.892 44.5 <2e-16 ***
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 6.68 on 343 degrees of freedom
Multiple R-squared: 0.972, Adjusted R-squared: 0.972
F-statistic: 2.01e+03 on 6 and 343 DF, p-value: <2e-16
K
                         N/N85 N/R40 N/R50 NP R/R50 lopro
```

early rest - none @ 50kcal 0.0 0.00 -1.00 0.0 1.00 0.00

40kcal/week - 50kcal/week

lo cal - hi cal

0.0 1.00 -0.50 0.0 -0.50 0.00 -0.5 0.25 0.25 -0.5 0.25 0.25

```
t = glht(m, linfct=K)
summarv(t)
Simultaneous Tests for General Linear Hypotheses
Fit: lm(formula = Lifetime ~ Diet - 1, data = case0501)
Linear Hypotheses:
                             Estimate Std. Error t value Pr(>|t|)
early rest - none @ 50kcal == 0 0.589
                                          1.194 0.49 0.946
40kcal/week - 50kcal/week == 0 2.525 1.049 2.41 0.049 *
lo cal - hi cal == 0
                    12.450
                                          0.780 15.96 <1e-04 ***
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
(Adjusted p values reported -- single-step method)
confint(t, calpha=univariate_calpha())
Simultaneous Confidence Intervals
Fit: lm(formula = Lifetime ~ Diet - 1, data = case0501)
Quantile = 1.967
95% confidence level
Linear Hypotheses:
                             Estimate lwr
                                            upr
early rest - none @ 50kcal == 0 0.589 -1.759 2.936
40kcal/week - 50kcal/week == 0 2.525 0.463 4.588
lo cal - hi cal == 0
                             12.450 10.915 13.984
```

# Summary

- Contrasts are linear combinations that sum to zero
- t-test tools are used to calculate pvalues and confidence intervals