

I. Introduction to Two Factor ANOVA

- A. Factorial analysis of variance
- B. No good general nonparametric tests
- C. Experimental set-up:
 - factor A, w/ a levels
 - factor B, w/ b levels
 - n = number of replicates for each combination of factors
equal replication = balanced experimental design
 - total # measurements = abn

D. Hypotheses:

- H_0 : No effect of factor A on response variable
- H_A : Factor A does have an effect on response variable

- H_0 : No effect of factor B on response variable
- H_A : Factor B does have an effect on response variable

- H_0 : No effect of interaction between factors A & B on response variable
- H_A : Interaction between factors A & B does have an effect on response variable

E. Notation

1. individual measurements: X_{ijl} = l^{th} measurement in j^{th} level of B & i^{th} level of A
 1st subscript = factor A 2nd subscript = factor B 3rd subscript = replicate
2. means: 4 kinds of means:
 - cell means (cell ij): \bar{X}_{ij}
 - level means of factor A: $\bar{X}_{i.}$, e.g., $\bar{X}_{2.}$
 - level means of factor B: $\bar{X}_{.j}$, e.g., $\bar{X}_{.1}$
 - grand mean: \bar{X}

3. Summation: $\sum_i X_i$ $\sum_i \sum_j \sum_l X_{ijl} = \sum_{i=1}^a \left[\sum_{j=1}^b \left(\sum_{l=1}^n X_{ijl} \right) \right]$

II. Linear Model for Two-Factor ANOVA

$X_{ijl} = \mu + \alpha_i + \beta_j + (\alpha\beta)_{ij} + \varepsilon_{ijl}$
 where: $\varepsilon_{ijl} \sim N(0, \sigma^2)$ and independent of each other
 $H_0: \alpha_i = 0$
 $H_0: \beta_j = 0$
 $H_0: (\alpha\beta)_{ij} = 0, \forall ij$

III. Calculations:

A. Sums of Squares & Degrees of Freedom

| | | |
|----------------|---|---------------------|
| <u>total</u> : | total SS = $\sum_{i=1}^a \sum_{j=1}^b \sum_{l=1}^n (X_{ijl} - \bar{X})^2$ | total DF = $N - 1$ |
| <u>cells</u> : | cells SS = $\sum_{i=1}^a \sum_{j=1}^b n(\bar{X}_{ij} - \bar{X})^2$ | cells DF = $ab - 1$ |

III. Calculations (continued):

within-cells (error):
$$\text{error SS} = \sum_{i=1}^a \sum_{j=1}^b \left[\sum_{l=1}^n (X_{ijl} - \bar{X}_{ij})^2 \right]$$

$$\text{error DF} = ab(n-1) = \text{total DF} - \text{cells DF}$$

factor A:
$$\text{factor A SS} = bn \sum_{i=1}^a (\bar{X}_{i.} - \bar{X})^2$$
 factor A DF = $a - 1$

factor B:
$$\text{factor B SS} = an \sum_{j=1}^b (\bar{X}_{.j} - \bar{X})^2$$
 factor B DF = $b - 1$

interaction between A & B:

$$A \times B \text{ interaction SS} = \text{cells SS} - \text{factor A SS} - \text{factor B SS}$$

$$A \times B \text{ interaction DF} = \text{cells DF} - \text{factor A DF} - \text{factor B DF}$$

or:
$$A \times B \text{ interaction DF} = (\text{factor A DF})(\text{factor B DF}) = (a - 1)(b - 1)$$

B. Mean Square = SS / DF

C. Machine formulas: see Zar, table 12.2

IV. Testing Hypotheses & Models of Two-Factor ANOVA

A. Model I ANOVA: both factors fixed

- test each of 3 null hypotheses (A, B, interaction) independently:
- significant interaction => difference among levels of a factor not constant w/ other factor
=> do not interpret factor effect if \exists significant interaction effect
- Hypothesis testing w/ both factors fixed:
all tests against within-cells MS (or error MS)

- Factor A:
$$\frac{\text{factor A MS}}{\text{error MS}} \sim F_{(a-1), ab(n-1)}$$

- Factor B:
$$\frac{\text{factor B MS}}{\text{error MS}} \sim F_{(b-1), ab(n-1)}$$

- Interaction:
$$\frac{A \times B \text{ MS}}{\text{error MS}} \sim F_{(a-1)(b-1), ab(n-1)}$$

B. Model II ANOVA: both factors random:

- test Factor A & B against interaction MS,
- test interaction against within-cells MS (error MS)

- Factor A:
$$\frac{\text{factor A MS}}{A \times B \text{ MS}} \sim F_{(a-1), (a-1)(b-1)}$$

- Factor B:
$$\frac{\text{factor B MS}}{A \times B \text{ MS}} \sim F_{(b-1), (a-1)(b-1)}$$

- Interaction:
$$\frac{A \times B \text{ MS}}{\text{error MS}} \sim F_{(a-1)(b-1), ab(n-1)}$$

C. Model III ANOVA (or mixed model ANOVA): one factor fixed, other random
 → e.g., for A fixed, B random:

- test fixed factor (A) against interaction MS,
- test random factor (B) and interaction against within-cells MS (error MS)

- Factor A: $\frac{\text{factor } A \text{ MS}}{A \times B \text{ MS}} \sim F_{(a-1), (a-1)(b-1)}$

- Factor B: $\frac{\text{factor } B \text{ MS}}{\text{error MS}} \sim F_{(b-1), ab(n-1)}$

- Interaction: $\frac{A \times B \text{ MS}}{\text{error MS}} \sim F_{(a-1)(b-1), ab(n-1)}$

V. Multiple Comparisons Testing

A. If two factor ANOVA => significant differences among levels of factor,
 use multiple comparison test, Zar chapter 11 (e.g., Tukey test)

$s^2 =$ within-cells MS

$v =$ within-cells DF

$n =$ total # data per level, e.g., for factor A, $n = bn$

B. If significant interaction between factors,

DO NOT compare means of levels of a factor

instead, do multiple comparison test among cell means

VI. Confidence Limits of Means

same procedure as for single-factor ANOVA