National Institute of Allergy and Infectious Diseases

Practical Training on GraphPad Prism for Statistical Testing

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Reach out to our team: <u>bioinformatics@niaid.nih.gov</u>



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Outline

Dependent variable is Continuous

- Unpaired t-test vs paired t-test vs Mann-Whitney test
- One-way ANOVA vs Repeated measures one-way ANOVA vs Kruskal-Wallis and Friedman tests
 - Multiple comparison

Dependent variable is Categorical

Chi-square test vs Fisher exact test





T-test and related nonparametric - Overall

T tests, and related nonparametric tests compare **two sets** of measurements (data expressed using an interval or ratio scale).

- Paired or not paired?
- Parametric or nonparametric?
- Equal standard deviation or not?

Checklist: <u>unpaired t-test</u>, <u>paired t-test</u>, <u>Mann-Whitney test</u> Kolmogorov-Smirnov test, Wilcoxon matched pairs test...





Unpaired or paired?

| Treatment A | | | Treatment B | | | | | |
|-------------|------|-------|-------------|---|----|------|-------|----|
| ID | preA | postA | ΔΑ | _ | ID | preB | postB | ΔΒ |
| 1 | 63 | 77 | 14 | | 11 | 81 | 101 | 20 |
| 2 | 69 | 88 | 19 | | 12 | 87 | 103 | 16 |
| 3 | 76 | 90 | 14 | | 13 | 77 | 107 | 30 |
| 4 | 78 | 95 | 17 | | 14 | 80 | 114 | 34 |
| 5 | 80 | 96 | 16 | | 15 | 76 | 116 | 40 |
| 6 | 89 | 96 | 7 | | 16 | 86 | 116 | 30 |
| 7 | 90 | 102 | 12 | | 17 | 98 | 116 | 18 |
| 8 | 92 | 104 | 12 | | 18 | 87 | 120 | 33 |
| 9 | 103 | 110 | 7 | | 19 | 105 | 120 | 15 |
| 10 | 112 | 115 | 3 | | 20 | 69 | 127 | 58 |

ID: individual identification, preA, preB: before the treatment A or B, postA, postB: after the treatment A or B, ΔA , ΔB : difference between before and after the treatment A or B.

 If we want to compare ΔA and ΔB, is this unpaired or paired experimental design?

Unpaired.





Example Source

Unpaired and paired? Cont

| Treatment A | | | Treatment B | | | | | |
|-------------|------|-------|-------------|----------|----|------|-------|----|
| ID | preA | postA | ΔΑ | | ID | preB | postB | ΔΒ |
| 1 | 63 | 77 | 14 | | 1 | 73 | 103 | 30 |
| 2 | 69 | 88 | 19 | | 2 | 74 | 104 | 30 |
| 3 | 76 | 90 | 14 | | 3 | 76 | 107 | 31 |
| 4 | 78 | 95 | 17 | | 4 | 84 | 108 | 24 |
| 5 | 80 | 96 | 16 | wash out | 5 | 84 | 110 | 26 |
| 6 | 89 | 96 | 7 | | 6 | 86 | 110 | 24 |
| 7 | 90 | 102 | 12 | | 7 | 92 | 113 | 21 |
| 8 | 92 | 104 | 12 | | 8 | 95 | 114 | 19 |
| 9 | 103 | 110 | 7 | | 9 | 103 | 118 | 15 |
| 10 | 112 | 115 | 3 | | 10 | 115 | 120 | 5 |

ID: individual identification, preA, preB: before the treatment A or B, postA, postB: after the treatment A or B, Δ A, Δ B: difference between before and after the treatment A or B.

 If we want to compare ΔA and ΔB, is this unpaired or paired experimental design?

Paired.



[Read more] Experimental design: unpaired or paired



Parametric or nonparametric?

If the data in both groups follow Gaussian distribution: use parametric test.

Parametric test:

The **unpaired t test** compares the means of two **unmatched** groups, assuming that the values follow a Gaussian distribution.

The **paired t test** compares the means of two **matched** groups, assuming that the distribution of the before-after differences follows a Gaussian distribution.



Parametric or nonparametric? Cont

If the data does not follow Gaussian distribution?

- 1. Data transformation
- 2. Use t-test anyway, given that t-test is robust when sample size is large.
- 3. Use nonparametric test.

The Mann-Whitney and the Kolmogorov-Smirnov compares the distributions of two unmatched groups. [Nonparametric]

The Wilcoxon matched pairs test compares two paired groups. [Nonparametric]

Nonparametric tests does not require Gaussian but have less power. Deciding when to use a nonparametric test is not straightforward.



[Read more] Assume Gaussian distribution? Choose test?



Let's practice in Prism

- Use sample data provided by Prism for hands on
- Perform unpaired, paired t-test and related nonparametric tests.

Interpreting result:

<u>Unpaired t-test</u>, <u>paired t-test</u>, <u>Mann-Whitney test</u>, <u>Kolmogorov-Smirnov test</u>, <u>Wilcoxon matched pair test</u>.





One-way ANOVA and related nonparametric test

One-way ANOVA and related nonparametric test compare three or more sets of measurements (data expressed using an interval or ratio scale).

- Paired or not paired (Matching/Repeat Measure)?
- Parametric or nonparametric?
- Equal standard deviation or not? Sphericity?

Checklist: <u>ordinary one-way ANOVA</u>, <u>RM one-way ANOVA</u>, <u>Kruskal-Wallis test</u>, <u>Friedman test</u>...





Unpaired or paired?

A study is designed to test whether there is a difference in mean daily calcium intake in adults with normal bone density, adults with osteopenia (a low bone density which may lead to osteoporosis) and adults with osteoporosis.

| Normal Bone Density | Osteopenia | Osteoporosis |
|---------------------|------------|--------------|
| 1200 | 1000 | 890 |
| 1000 | 1100 | 650 |
| 980 | 700 | 1100 |
| 900 | 800 | 900 |
| 750 | 500 | 400 |
| 800 | 700 | 350 |

Unpaired

Example Source





Unpaired or paired? Cont

The four columns represent four sequential treatments. Each row represents a different subject (or a different set of matched data).

| | | Group A | Group B | Group C | Group D |
|---|----|---------|-------------|-------------|-------------|
| | | Control | Treatment 1 | Treatment 2 | Treatment 3 |
| | 0 | Υ | Υ | Υ | Υ |
| 1 | GS | 54 | 43 | 78 | 111 |
| 2 | JM | 23 | 34 | 37 | 41 |
| 3 | НМ | 45 | 65 | 99 | 78 |
| 4 | DR | 31 | 33 | 36 | 35 |
| 5 | PS | 15 | 25 | 30 | 26 |

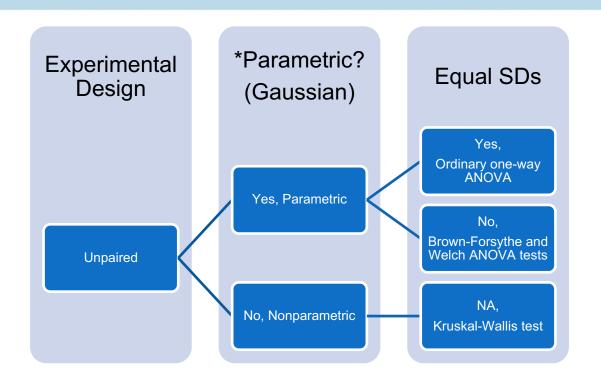
Paired (Repeat Measures)



Example source: Prism 8



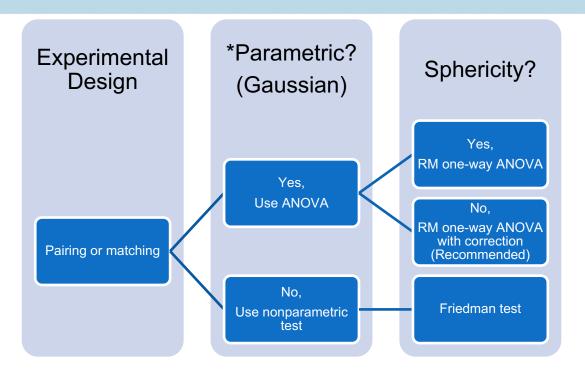
Ordinary one-way ANOVA and related nonparametric test





^{*} Deciding when to use a nonparametric test is not straightforward.

Repeated Measure One-way ANOVA and related nonparametric test



Read more: 12



** Under this experimental design, if there is missing values, mixed effects model will be performed instead of ANOVA. Result only meaningful if the values are missing for random reasons.

Multiple Comparison

Prism provide an option of doing multiple comparison option when customizing your ANOVA analysis. It is usually noted as a post doc test in ANOVA, but however they could be performed independently.

[**Definition**] Multiple comparisons arises when a statistical analysis involves multiple simultaneous statistical tests, each of which has a potential to produce a "discovery."

[Methods] Multiple comparisons corrected by statistical hypothesis testing; controlling the false discovery rate, don't correct. If using a familywise definition of alpha, the significance level doesn't apply to each comparison, but rather to the entire family of comparisons. In general, this makes it harder to reach significance.



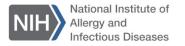
Read more: Methods

Let's practice in Prism

- Use bone density and calcium intake data to perform ordinary one-way ANOVA
- Use the sample data provided by Prism to perform RM one-way ANOVA

Interpreting result:

Ordinary one-way ANOVA, RM one-way ANOVA, mixed model one-way, Kruskal-Wallis test, Friedman test.





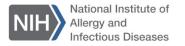
Challenging question

Exercise Intervention data: A 6-month exercise-training intervention where six subjects had their fitness level measured on three occasions: pre-, 3 months, and post-intervention. Their data is shown below along with some initial calculations:

| Subjects | Pre- | 3 Months | 6 Months |
|----------|------|----------|----------|
| 1 | 45 | 50 | 55 |
| 2 | 42 | 42 | 45 |
| 3 | 36 | 41 | 43 |
| 4 | 39 | 35 | 40 |
| 5 | 51 | 55 | 59 |
| 6 | 44 | 49 | 56 |

Questions:

- 1) Is there any difference in fitness level on these three occasions?
- 2) If differences exist, compare group differences in 3 months intervention and 6 months intervention with the pre- group.

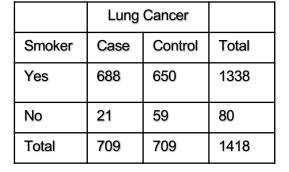


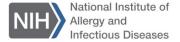
Test for data with categorical data

| Patient ID | Smoking status | Lung cancer |
|------------|----------------|-------------|
| 1 | Yes | Case |
| 2 | No | Control |
| 3 | Yes | Case |
| 4 | No | Control |
| 5 | Yes | Control |
| 6 | No | Control |
| 7 | No | Control |
| 8 | No | Case |
| 9 | Yes | Control |
| | | |

What is the appropriate test for seeing whether smoking is associated with lung cancer in a case-control study?









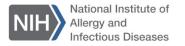
Chi-square test and Fisher's exact test

Chi-square test and fisher's exact test are commonly used to access associations between two categorical variables, assuming individual observations are independent.

 H_0 : Two variables are independent. H_a : They are not independent.

In Prism, the input data should be "contingency" form. Prism could not cross tabulate data.

Chi-square test is usually used with large or well balanced sample. Fisher's exact test uses with small data and it calculates exact p-value.





Chi-square test OR Fisher's exact test?

Why not always Fisher's exact test?

Fisher's test is based on assuming that the row and column totals are fixed by the experiment, which is not satisfied in the design of a retrospective case-control study and a cross-sectional experiment.

In Prism, if you enter huge numbers (the sum is greater than 1,000,000), it will perform the chi-square test even if you chose Fisher's test.





Let's practice in Prism

- Use sample data provided by Prism
- Perform Chi-square test and Fisher's exact test to evaluate association.

Interpreting result:

Chi-square test and Fisher's exact test



More tests for categorical data

Cochran-Armitage trend test is used for study association between a variable with two categories and an ordinal variable with k categories (e.g. dose-response studies).

McNemar's test is used for comparing categorical responses for two samples that are statistically dependent.

Cochran-Mantel-Haenszel test for the analysis of stratified or matched categorical data.

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In the end

Statistics is a lot of fun! Continue to attend our workshop in future!

We try to improve! Please finish the survey and let us know your thoughts!

Check out our Github page, more related material has been uploaded.

