

## Comparing Means in R

 Tools

Previously, we described the [essentials of R programming](#) and provided quick start guides for [importing data](#) into **R**. Additionally, we described how to compute [descriptive or summary statistics](#) and [correlation analysis](#) using R software.

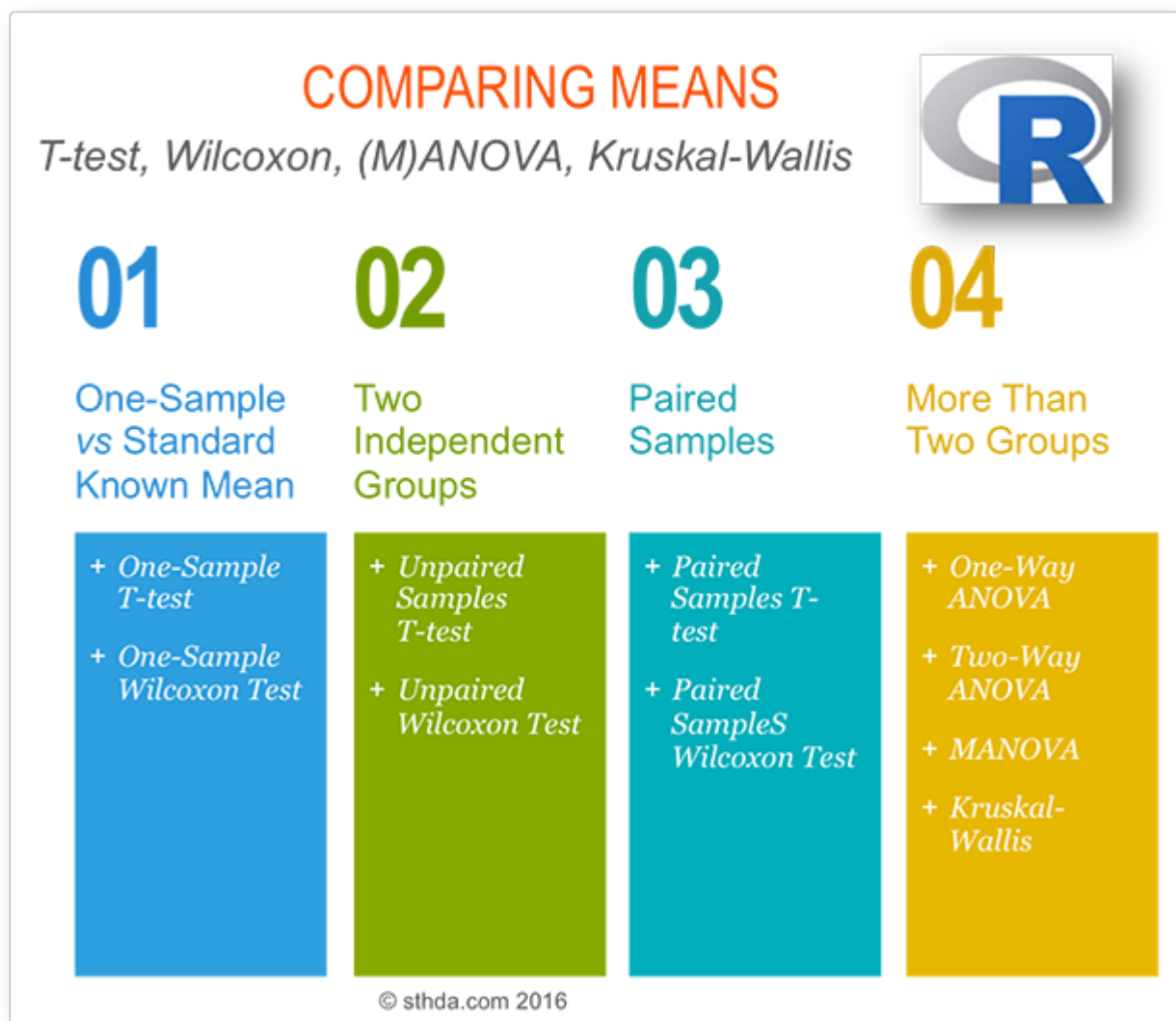
This chapter contains articles describing **statistical tests** to use for **comparing means**. These tests include:

- **T-test**
- **Wilcoxon test**
- **ANOVA test** and
- **Kruskal-Wallis test**

## 1 How this chapter is organized?

- Comparing one-sample mean to a standard known mean:
  - [One-Sample T-test \(parametric\)](#)
  - [One-Sample Wilcoxon Test \(non-parametric\)](#)
- Comparing the means of two independent groups:

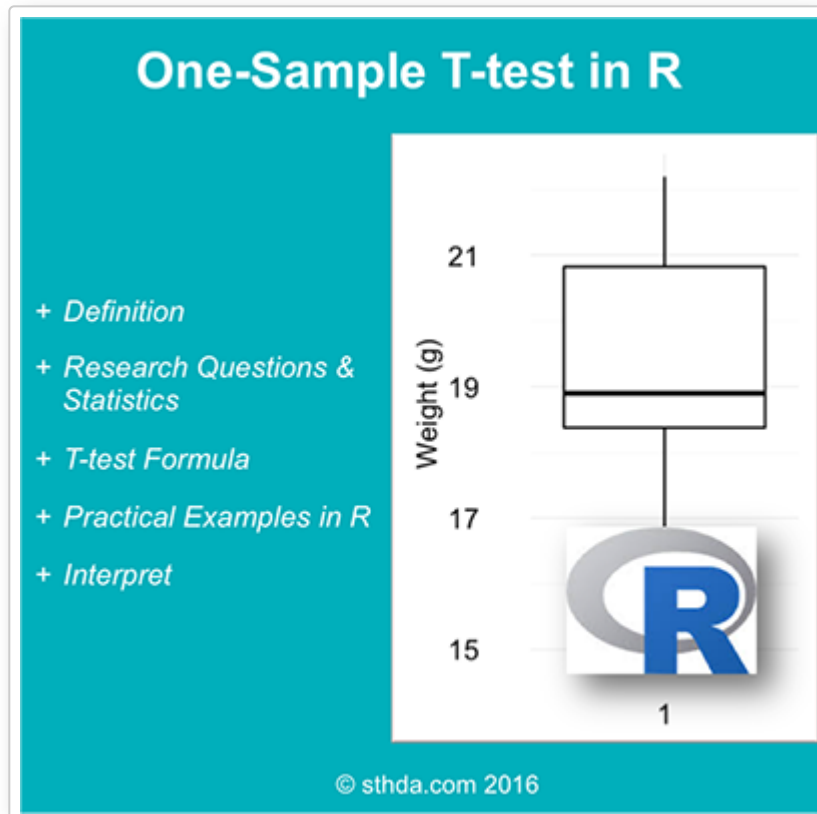
- Unpaired Two Samples T-test (parametric)
- Unpaired Two-Samples Wilcoxon Test (non-parametric)
- Comparing the means of paired samples:
  - Paired Samples T-test (parametric)
  - Paired Samples Wilcoxon Test (non-parametric)
- Comparing the means of more than two groups
  - Analysis of variance (ANOVA, parametric):
    - One-Way ANOVA Test in R
    - Two-Way ANOVA Test in R
    - MANOVA Test in R: Multivariate Analysis of Variance
  - Kruskal-Wallis Test in R (non parametric alternative to one-way ANOVA)



## 2 Comparing one-sample mean to a standard known mean

### 2.1 One-sample T-test (parametric)

- What is one-sample t-test?
- Research questions and statistical hypotheses
- Formula of one-sample t-test
- Visualize your data and compute one-sample t-test in R
  - R function to compute one-sample t-test
  - Visualize your data using box plots
  - Preliminary test to check one-sample t-test assumptions
  - Compute one-sample t-test
  - Interpretation of the result



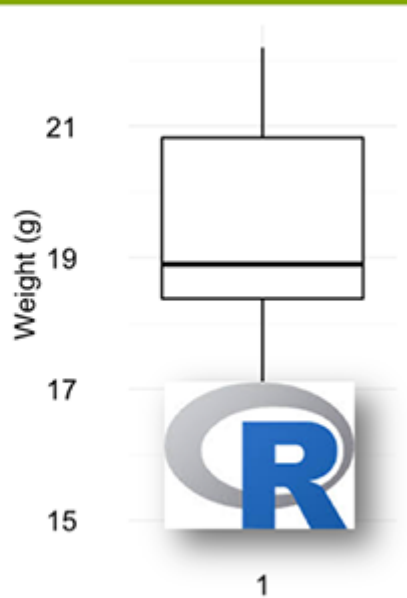
✓ Read more: —> [One-Sample T-test](#).

## 2.2 One-sample Wilcoxon test (non-parametric)

- What's one-sample Wilcoxon signed rank test?
- Research questions and statistical hypotheses
- Visualize your data and compute one-sample Wilcoxon test in R
  - R function to compute one-sample Wilcoxon test
  - Visualize your data using box plots
  - Compute one-sample Wilcoxon test

## One-Sample Wilcoxon Test in R

- + Definition
- + Research Questions & Statistics
- + Practical Examples in R
- + Interpret



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Read more: —> [One-Sample Wilcoxon Test \(non-parametric\)](#).

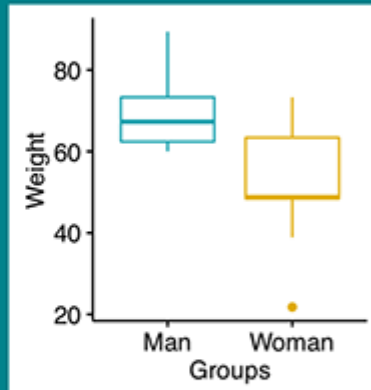
## 3 Comparing the means of two independent groups

### 3.1 Unpaired two samples t-test (parametric)

- What is unpaired two-samples t-test?
- Research questions and statistical hypotheses
- Formula of unpaired two-samples t-test
- Visualize your data and compute unpaired two-samples t-test in R
  - R function to compute unpaired two-samples t-test
  - Visualize your data using box plots
  - Preliminary test to check independent t-test assumptions
  - Compute unpaired two-samples t-test
- Interpretation of the result

## Unpaired Two-Samples T-test in R

- + *Definition*
- + *Research Questions & Statistics*
- + *T-test Formula*
- + *Practical Examples in R*
- + *Interpret*



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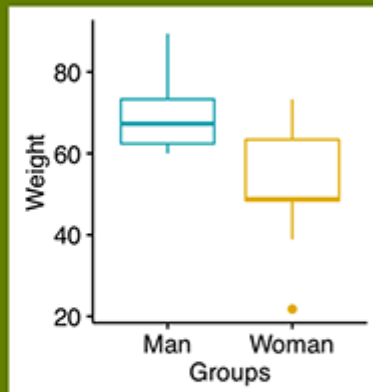
Read more: —> [Unpaired Two Samples T-test \(parametric\)](#).

### 3.2 Unpaired two-samples Wilcoxon test (non-parametric)

- R function to compute Wilcoxon test
- Visualize your data using box plots
- Compute unpaired two-samples Wilcoxon test

## Unpaired Two-Samples Wilcoxon test in R

- + *Definition*
- + *Research Questions & Statistics*
- + *Practical Examples in R*
- + *Interpret*



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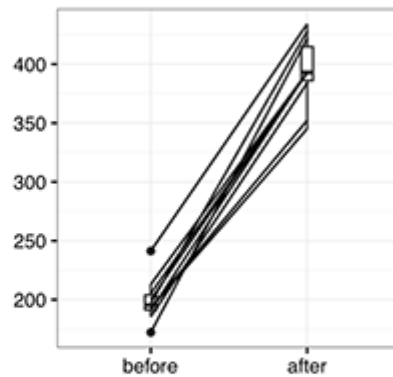
Read more: —> [Unpaired Two-Samples Wilcoxon Test \(non-parametric\)](#).

## 4 Comparing the means of paired samples

### 4.1 Paired samples t-test (parametric)

## Paired Samples T-test in R

- + *Definition*
- + *Research Questions & Statistics*
- + *T-test Formula*
- + *Practical Examples in R*
- + *Interpretation*



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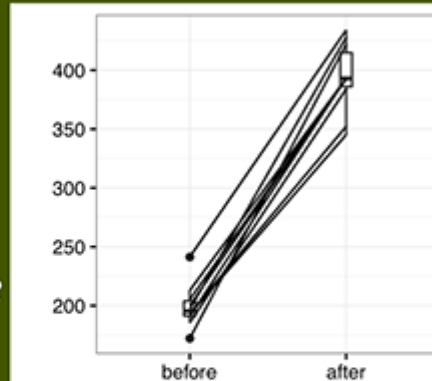


Read more: —> [Paired Samples T-test \(parametric\)](#).

### 4.2 Paired samples Wilcoxon test (non-parametric)

## Paired Samples Wilcoxon Test in R

- + Definition
- + Research Questions & Statistics
- + Practical Examples in R
- + Interpretation



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Read more: —> [Paired Samples Wilcoxon Test \(non-parametric\)](#).

## 5 Comparing the means of more than two groups

### 5.1 One-way ANOVA test

An extension of [independent two-samples t-test](#) for comparing means in a situation where there are more than two groups.

- What is one-way ANOVA test?
- Assumptions of ANOVA test
- How one-way ANOVA test works?
- Visualize your data and compute one-way ANOVA in R
  - Visualize your data
  - Compute one-way ANOVA test
  - Interpret the result of one-way ANOVA tests
  - Multiple pairwise-comparison between the means of groups
    - Tukey multiple pairwise-comparisons
    - Multiple comparisons using multcomp package
    - Pairwise t-test
  - Check ANOVA assumptions: test validity?
    - Check the homogeneity of variance assumption
    - Relaxing the homogeneity of variance assumption
    - Check the normality assumption



- Non-parametric alternative to one-way ANOVA test

## One-Way ANOVA Test in R

*Compare more than two groups*

- + Definition
- + ANOVA Assumptions
- + Compute ANOVA in R
- + Interpret
- + Post Hoc Test
- + Check Assumptions
- + Non-Parametric Alternative

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✓ Read more: —> [One-Way ANOVA Test in R.](#)

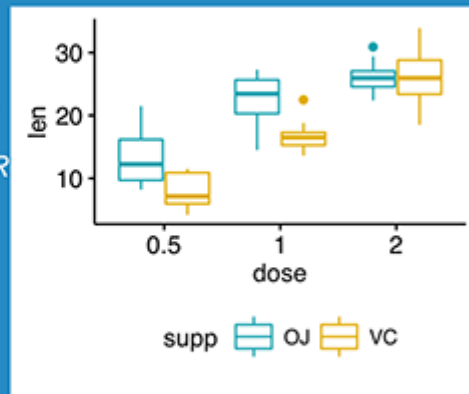
## 5.2 Two-Way ANOVA test

- What is two-way ANOVA test?
- Two-way ANOVA test hypotheses
- Assumptions of two-way ANOVA test
- Compute two-way ANOVA test in R: balanced designs
  - Visualize your data
  - Compute two-way ANOVA test
  - Interpret the results
  - Compute some summary statistics
  - Multiple pairwise-comparison between the means of groups
    - Tukey multiple pairwise-comparisons
    - Multiple comparisons using multcomp package
    - Pairwise t-test
  - Check ANOVA assumptions: test validity?
    - Check the homogeneity of variance assumption
  - Check the normality assumption
- Compute two-way ANOVA test in R for unbalanced designs

# Two-Way ANOVA Test in R

*Effect of two grouping variables*

- + Definition
- + ANOVA Assumptions
- + Compute ANOVA in R
- + Interpret
- + Post Hoc Test
- + Check Assumptions



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✓ Read more: [—> Two-Way ANOVA Test in R.](#)

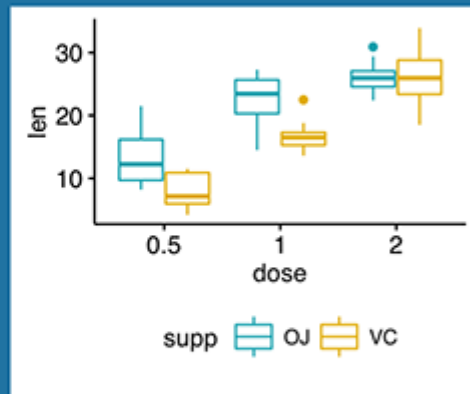
## 6 MANOVA test: Multivariate analysis of variance

- What is MANOVA test?
- Assumptions of MANOVA
- Interpretation of MANOVA
- Compute MANOVA in R

# MANOVA Test in R

*Multivariate Analysis of Variance*

- + Definition
- + Assumptions
- + Interpretation
- + Compute MANOVA in R



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Read more: —> [MANOVA Test in R: Multivariate Analysis of Variance.](#)

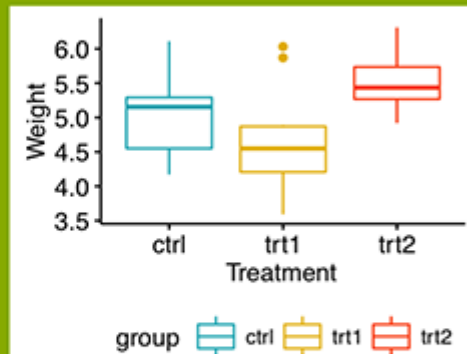
## 7 Kruskal-Wallis test

- What is Kruskal-Wallis test?
- Visualize your data and compute Kruskal-Wallis test in R
  - Visualize the data using box plots
  - Compute Kruskal-Wallis test
  - Multiple pairwise-comparison between groups

# Kruskal-Wallis Test in R

*Compare more than two groups  
(non-parametric)*

- + Definition
- + Compute in R
- + Interpret
- + Post Hoc Test



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Read more: —> [Kruskal-Wallis Test in R \(non parametric alternative to one-way ANOVA\)](#).

## 8 See also

- [R Basics](#)
- [Import and Export Data using R](#)
- [Preparing and Reshaping Data in R for Easier Analyses](#)
- [Data Manipulation in R](#)
- [Data visualization](#)
- [Descriptive Statistics and Graphics](#)
- [Correlation Analyses in R](#)

## 9 Infos



This analysis has been performed using **R statistical software** (ver. 3.2.4).



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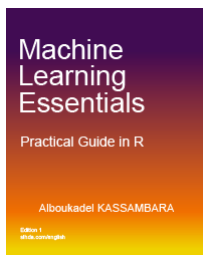
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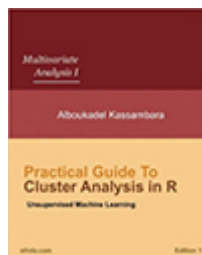
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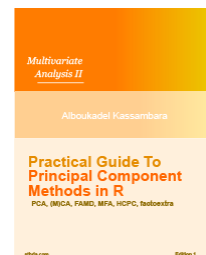
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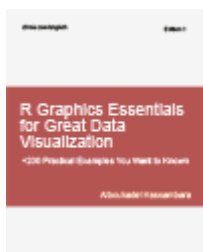
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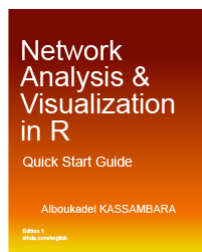
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- [Course: Machine Learning: Master the Fundamentals](#) by Stanford
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- [Specialization: Genomic Data Science](#) by Johns Hopkins University

## Popular Courses Launched in 2020

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- [AI for Medicine](#) by deeplearning.ai
- [Epidemiology in Public Health Practice](#) by Johns Hopkins University
- [AWS Fundamentals](#) by Amazon Web Services

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- [Python for Everybody](#) by University of Michigan
- [IBM Data Science Professional Certificate](#) by IBM
- [Business Foundations](#) by University of Pennsylvania
- [Introduction to Psychology](#) by Yale University
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- [Practical Statistics in R for Comparing Groups: Numerical Variables](#) by A. Kassambara (Datanovia)
- [Inter-Rater Reliability Essentials: Practical Guide in R](#) by A. Kassambara (Datanovia)

### Others

- [R for Data Science: Import, Tidy, Transform, Visualize, and Model Data](#) by Hadley Wickham & Garrett Grolemund
- [Hands-On Machine Learning with Scikit-Learn, Keras, and TensorFlow: Concepts, Tools, and Techniques to Build Intelligent Systems](#) by Aurelien Géron
- [Practical Statistics for Data Scientists: 50 Essential Concepts](#) by Peter Bruce & Andrew Bruce
- [Hands-On Programming with R: Write Your Own Functions And Simulations](#) by Garrett Grolemund & Hadley Wickham
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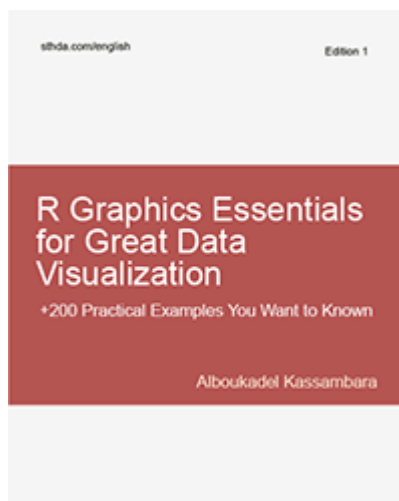


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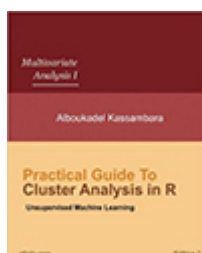
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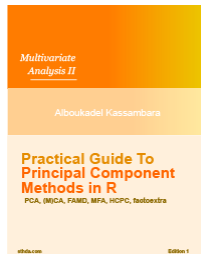


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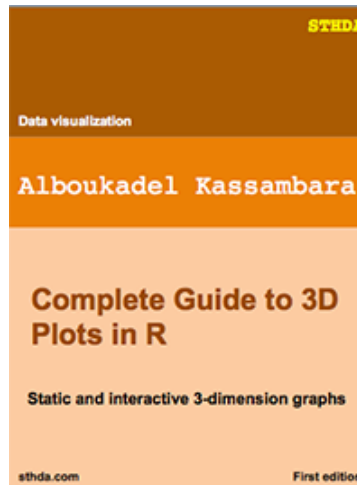


Practical Guide to Cluster Analysis in R

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## Practical Guide to Principal Component Methods in R



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