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Kruskal-Wallis Test in R

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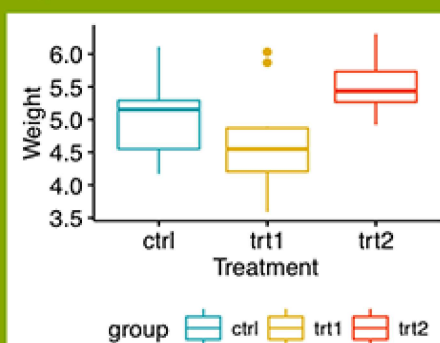
What is Kruskal-Wallis test?

Kruskal-Wallis test by rank is a **non-parametric alternative** to **one-way ANOVA test**, which extends the **two-samples Wilcoxon test** in the situation where there are more than two groups. It's recommended when the assumptions of one-way ANOVA test are not met. This tutorial describes how to compute Kruskal-Wallis test in **R** software.

Kruskal-Wallis Test in R

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

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



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Related Book:



Practical Statistics in R for
Comparing Groups: Numerical
Variables

Visualize your data and compute Kruskal-Wallis test in R

Import your data into R

1. **Prepare your data** as specified here: [Best practices for preparing your data set for R](#)
2. **Save your data** in an external .txt tab or .csv files
3. **Import your data into R** as follow:

```
# If .txt tab file, use this
my_data <- read.delim(file.choose())
# Or, if .csv file, use this
my_data <- read.csv(file.choose())
```

Here, we'll use the built-in R data set named *PlantGrowth*. It contains the weight of plants obtained under a control and two different treatment conditions.

```
my_data <- PlantGrowth
```

Check your data

```
# print the head of the file
head(my_data)
```

```
  weight group
1  4.17  ctrl
2  5.58  ctrl
3  5.18  ctrl
4  6.11  ctrl
5  4.50  ctrl
6  4.61  ctrl
```



In R terminology, the column "group" is called factor and the different categories ("ctr", "trt1", "trt2") are named factor levels. **The levels are ordered alphabetically.**

```
# Show the group levels
levels(my_data$group)
```

```
[1] "ctrl" "trt1" "trt2"
```

If the levels are not automatically in the correct order, re-order them as follow:

```
my_data$group <- ordered(my_data$group,
                        levels = c("ctrl", "trt1", "trt2"))
```



It's possible to compute summary statistics by groups. The `dplyr` package can be used.

- To install **dplyr** package, type this:

```
install.packages("dplyr")
```

- Compute summary statistics by groups:

```
library(dplyr)
group_by(my_data, group) %>%
  summarise(
    count = n(),
    mean = mean(weight, na.rm = TRUE),
    sd = sd(weight, na.rm = TRUE),
    median = median(weight, na.rm = TRUE),
    IQR = IQR(weight, na.rm = TRUE)
  )
```

Source: local data frame [3 x 6]

	group (fctr)	count (int)	mean (dbl)	sd (dbl)	median (dbl)	IQR (dbl)
1	ctrl	10	5.032	0.5830914	5.155	0.7425
2	trt1	10	4.661	0.7936757	4.550	0.6625
3	trt2	10	5.526	0.4425733	5.435	0.4675

Visualize the data using box plots

- To use R base graphs read this: [R base graphs](#). Here, we'll use the **ggpubr** R package for an easy ggplot2-based data visualization.
- Install the latest version of ggpubr from GitHub as follow (recommended):

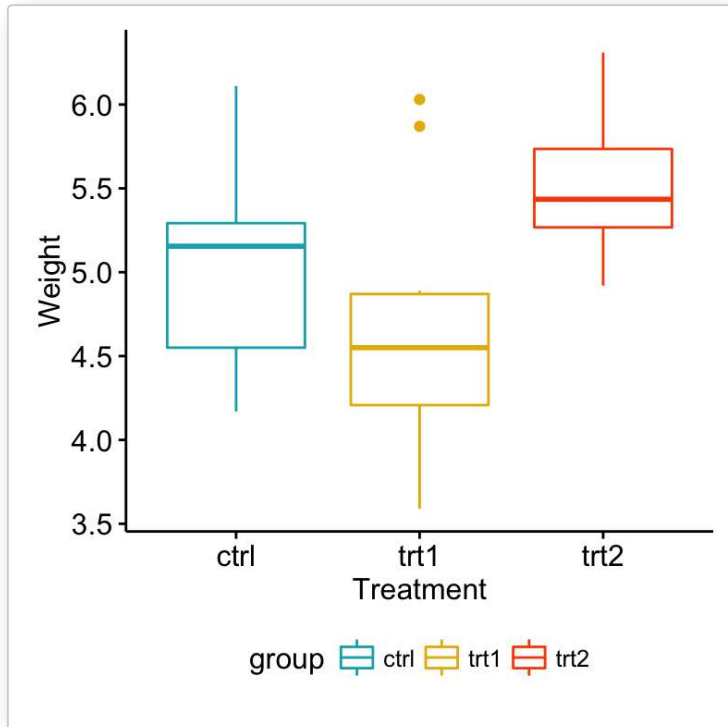
```
# Install
if(!require(devtools)) install.packages("devtools")
devtools::install_github("kassambara/ggpubr")
```

- Or, install from CRAN as follow:

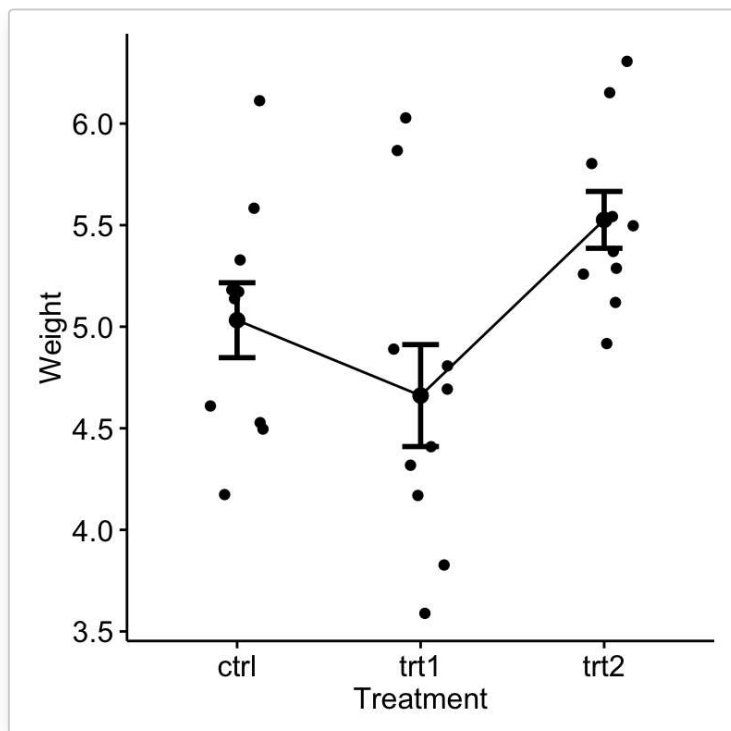
```
install.packages("ggpubr")
```

- Visualize your data with ggpubr:

```
# Box plots
# ++++++
# Plot weight by group and color by group
library("ggpubr")
ggboxplot(my_data, x = "group", y = "weight",
          color = "group", palette = c("#00AFBB", "#E7B800", "#FC4E07"),
          order = c("ctrl", "trt1", "trt2"),
          ylab = "Weight", xlab = "Treatment")
```



```
# Mean plots
# ++++++
# Plot weight by group
# Add error bars: mean_se
# (other values include: mean_sd, mean_ci, median_iqr, ....)
library("ggpubr")
ggline(my_data, x = "group", y = "weight",
       add = c("mean_se", "jitter"),
       order = c("ctrl", "trt1", "trt2"),
       ylab = "Weight", xlab = "Treatment")
```



Compute Kruskal-Wallis test

? We want to know if there is any significant difference between the average weights of plants in the 3 experimental conditions.

The test can be performed using the function **kruskal.test()** as follow:

```
kruskal.test(weight ~ group, data = my_data)
```

```
Kruskal-Wallis rank sum test
data: weight by group
Kruskal-Wallis chi-squared = 7.9882, df = 2, p-value = 0.01842
```

Interpret

As the p-value is less than the significance level 0.05, we can conclude that there are significant differences between the treatment groups.

Multiple pairwise-comparison between groups

From the output of the Kruskal-Wallis test, we know that there is a significant difference between groups, but we don't know which pairs of groups are different.

It's possible to use the function **pairwise.wilcox.test()** to calculate pairwise comparisons between group levels with corrections for multiple testing.

```
pairwise.wilcox.test(PlantGrowth$weight, PlantGrowth$group,  
  p.adjust.method = "BH")
```

```
Pairwise comparisons using Wilcoxon rank sum test  
data: PlantGrowth$weight and PlantGrowth$group  
   ctrl  trt1  
trt1 0.199 -  
trt2 0.095 0.027  
P value adjustment method: BH
```

✓ The pairwise comparison shows that, only trt1 and trt2 are significantly different ($p < 0.05$).

See also

- 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](#)

Infos

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

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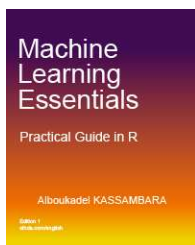
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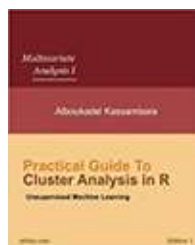
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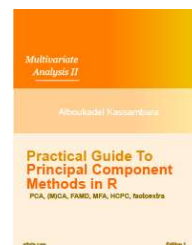
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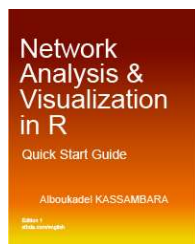
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Books - Data Science

Our Books

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- [Practical Guide To Principal Component Methods in R](#) by A. Kassambara (Datanovia)
- [Machine Learning Essentials: Practical Guide in R](#) by A. Kassambara (Datanovia)
- [R Graphics Essentials for Great Data Visualization](#) by A. Kassambara (Datanovia)
- [GGPlot2 Essentials for Great Data Visualization in R](#) by A. Kassambara (Datanovia)
- [Network Analysis and Visualization in R](#) by A. Kassambara (Datanovia)
- [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
- [An Introduction to Statistical Learning: with Applications in R](#) by Gareth James et al.
- [Deep Learning with R](#) by François Chollet & J.J. Allaire
- [Deep Learning with Python](#) by François Chollet

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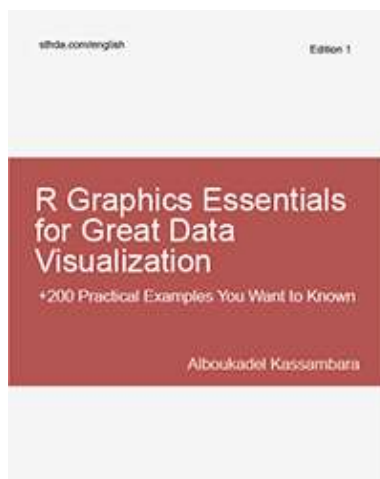
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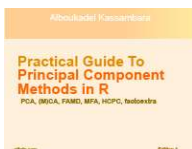
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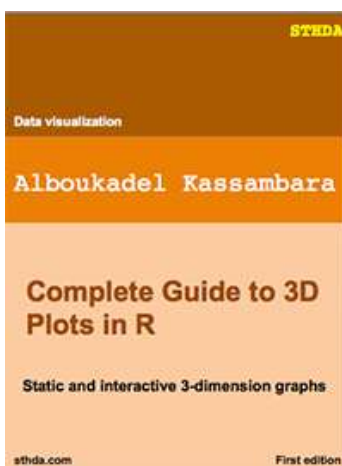
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