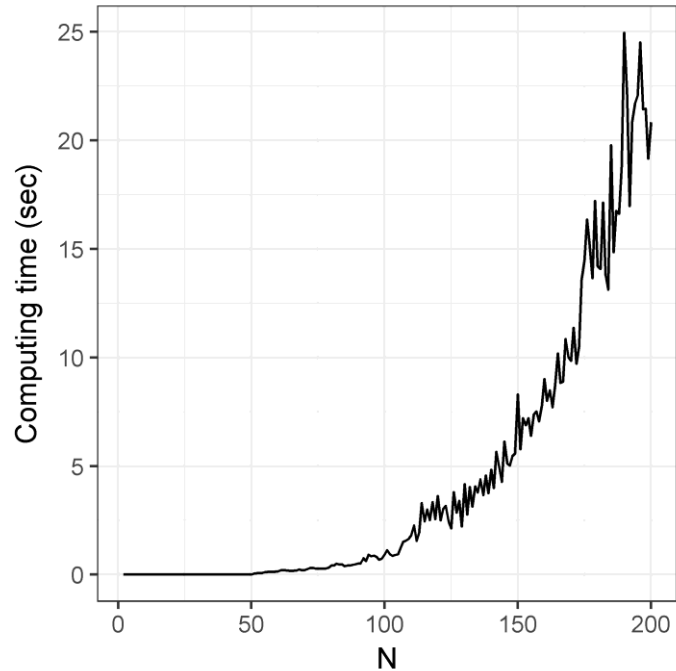
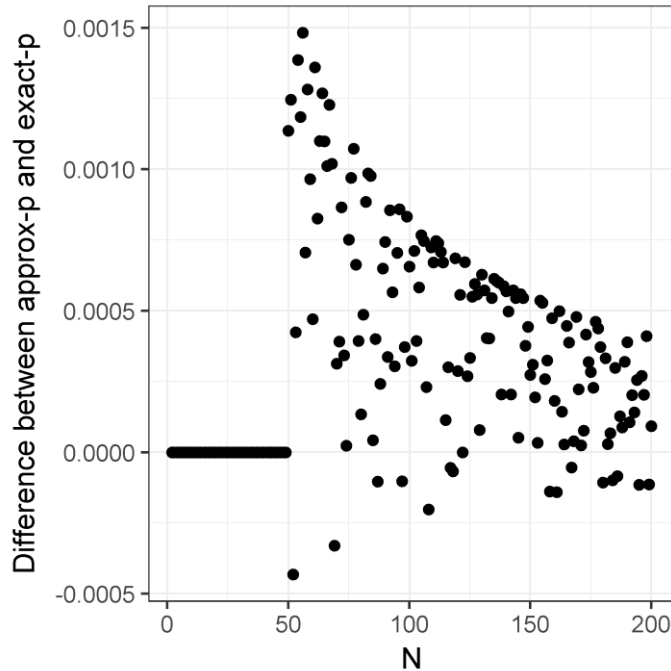


RenR 480/711

Non-parametric statistics

Permutational Tests

Wilcoxon test – approximated versus exact p-values



- No differences for less than 50 samples (exact method used)
- Neglectable differences for more than 50 samples
- Computing time increases exponentially

Non-parametric tests

Assumptions:

Non-parametric tests do not assume:

- Normality
- Equal variances
- No large outliers

Important is, however: (as for all statistical tests)

- Independence of samples
- Replication
- Randomization

Permutational tests

Example

ID	FARM	VARIETY	YIELD	Distance within	Distance between
1	Farm1	A	720	} 20 } 30 } 50	} 203
2	Farm1	A	740		
3	Farm1	A	690		
5	Farm1	B	515	} 35 } 30 } 85	} 199
6	Farm1	B	480		
7	Farm1	B	545		
9	Farm1	C	540	} 38 } 30 } 8	} 4
10	Farm1	C	502		
11	Farm1	C	510		

$$SS \text{ Distance}_{within} = \frac{1}{n} \sum_i^n \text{Groups} \sum_i^n (\text{Distance}_i^2)$$

$$SS \text{ Distance}_{within} = \frac{1}{3} (20^2 + 30^2 + 50^2) +$$

$$\frac{1}{3} (35^2 + 30^2 + 85^2) + \frac{1}{3} (38^2 + 30^2 + 8^2)$$

$$SS \text{ Distance}_{within} = 4186$$

$$SS \text{ Distance}_{between} = \sum_i^n (\text{Distance}_i^2)$$

$$SS \text{ Distance}_{between} = 203^2 + 199^2 + 4^2$$

$$SS \text{ Distance}_{between} = 81094$$

$$D = \frac{\text{signal}}{\text{noise}} = \frac{\frac{SS \text{ distance}_{between}}{n \text{ of groups} - 1}}{\frac{SS \text{ distance}_{within}}{n \text{ of observations} - n \text{ of groups}}}$$

$$D = \frac{\frac{81094}{3-1}}{\frac{4186}{9-3}} = \underline{58.369}$$

Permutational tests

Permutation #1

Shuffling of the labels in column VARIETY

ID	FARM	VARIETY	YIELD	Distance within	Distance between
1	Farm1	A	720	} 20 } 30 } 50	} 203 } 199 } 4
2	Farm1	C	740		
3	Farm1	C	690		
5	Farm1	B	515	} 33 } 20 } 85	
6	Farm1	C	480		
7	Farm1	B	545	} 38 } 30 } 8	
9	Farm1	B	540		
10	Farm1	A	502		
11	Farm1	A	510		

**Different distances within
and between**

$$SS \text{ Distance}_{within} = \frac{1}{n} \sum_i^n \text{Groups} \sum_i^n (\text{Distance}_i^2)$$

$$SS \text{ Distance}_{within} = \frac{1}{3} (20^2 + 30^2 + 50^2) + \frac{1}{3} (35^2 + 30^2 + 85^2) + \frac{1}{3} (38^2 + 30^2 + 8^2)$$

$$SS \text{ Distance}_{within} = 4186$$

$$SS \text{ Distance}_{between} = \sum_i^n (\text{Distance}_i^2)$$

$$SS \text{ Distance}_{between} = 203^2 + 199^2 + 4^2$$

$$SS \text{ Distance}_{between} = 81094$$

Different D

$$D = \frac{\text{signal}}{\text{noise}} = \frac{\frac{SS \text{ distance}_{between}}{n \text{ of groups} - 1}}{\frac{SS \text{ distance}_{within}}{n \text{ of observations} - n \text{ of groups}}}$$

$$D = \frac{\frac{81094}{3-1}}{\frac{4186}{9-3}} = \underline{58.369}$$

Permutational tests

Test statistic based on distances

Calculation steps:

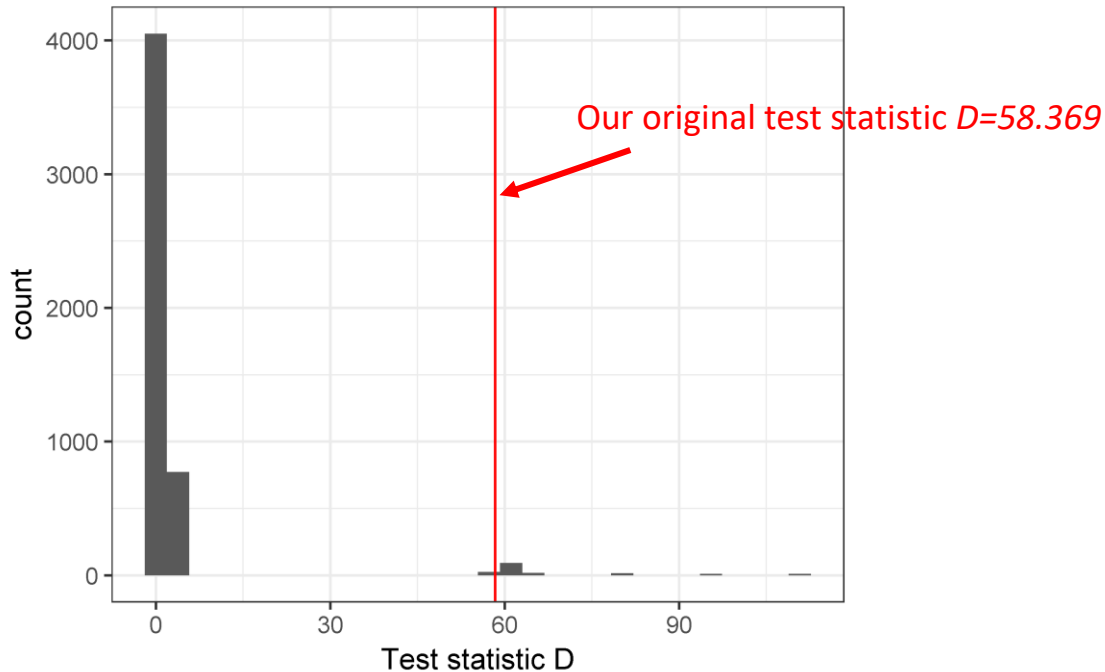
1. Calculate distances between and within groups
2. Calculate sum of squares based on distances
3. Calculate a test statistic based on your data:

$$\text{Delta} = \frac{\text{signal}}{\text{noise}} = \frac{\text{distance}_{\text{between}}}{\text{distance}_{\text{within}}}$$

4. Shuffle (permute) the variable names and calculate the test statistic
5. Build a distribution by repeating 5000 times (your choice)
6. Compare your test statistic to this distribution

Permutational tests

Repeat 5000 times to build a distribution



How many times did we get a value of D larger than our test statistic?

Count = 174 times

What is the probability of getting a value of D larger than our test statistic?

174 out of 5000 times
= $174/5000$
= 0.0348 → p-value

The shape of the distribution does not matter!