



### MAXIMUM SPACING ESTIMATION

A NEW METHOD IN FITDISTRPLUS

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#### INTRODUCTION

### The fitdistrplus project

- started in 2009: stable version 1.0-9 on CRAN (first release),
- extensively enhanced between 2009-2018: 17 versions on CRAN,
- published 2015: publication in JSS [?],
- currently, 2019: last stable version 1.0-14.

#### Presented at

- useR 2009 in Rennes, useR 2011 in Warwick,
- Rencontres R 2013 in Lyon, Rencontres R 2018 in Rennes.

Today, we present the implementation of a new estimation method: maximum spacing estimation (MSE)

- This method was introduced by Cheng and Amin (1986) and Ranneby (1984) independently.
- Currently, only the BMT package provides MSE for the Bezier-Montenegro-Torres distribution.

### MAXIMUM SPACING ESTIMATION (MSE)

Consider a sample of observations  $(x_1, \ldots, x_n)$ .

Order statistics are denoted by  $(x_{(1)} < \cdots < x_{(j)} < \cdots < x_{(n)})$ .

Spacings on the distribution function  $F(;\theta)$  are defined as

$$D_i(\theta) = F(x_{(i)}; \theta) - F(x_{(i-1)}; \theta), i = 1, n+1$$

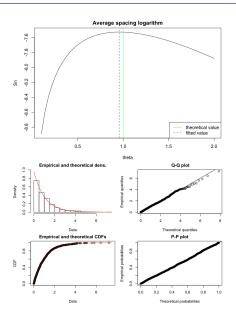
where  $x_{(0)} = -\infty$  and  $x_{(n+1)} = +\infty$ .

MSE consists in maximizing the average of the spacing logarithm

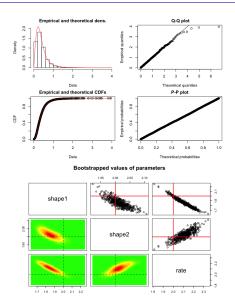
$$S_n(\theta) = \frac{1}{n+1} \sum_{i=1}^{n+1} \log D_i(\theta).$$

Under certain conditions, MSE has asymptotically a normal distribution as MLE.

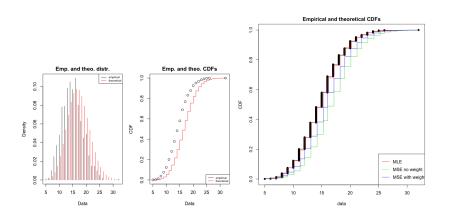
# EXAMPLE 1 – LIGHT-TAILED CONTINUOUS DISTRIBUTION



# EXAMPLE 2 – HEAVY-TAILED CONTINUOUS DISTRIBUTION



# EXAMPLE 3 – DISCRETE DISTRIBUTION



### CONCLUSION AND PERSPECTIVES

### We investigate in details survival, fitdistrplus, flexsurv packages for

- fitting parametric models,
- assessing goodness of fits,
- using bootstrap to quantify uncertainty.

Similar results obtained on a Canadian dataset.

#### Competitors

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https://cran.r-project.org/web/packages/MPS/index.html
https://cran.r-project.org/web/packages/BMT/index.html
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