

# The work of Fernando de Helguero on non-normality arising from selection

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# Skew-symmetric/hidden-truncation models

- much recent work about distributions like

$$f(z) = \text{const} \times f_0(z) G(\lambda_0 + \lambda_1 z)$$

- strongly linked to a selection mechanism

$$Z = (Z_0 | X < \lambda_0 + \lambda_1 Z_0)$$

- main special case

$$f(z) = \text{const} \times \varphi(z) \Phi(\lambda_0 + \lambda_1 z)$$

- this mechanism features marginally in several older papers
- ... but obtained as a by-product in different type of problems
- Q: when did this construction appear first with the aim of *building an alternative to the Gaussian family*?

# Fernando de Helguero (1880-1908)



# Fernando de Helguero, in brief

- born in 1880 near Florence, Italy
- studied mathematics at Univ. Rome
- teacher of mathematics while student of natural sciences
- mathematics + biology  $\Rightarrow$  statistics and biometry
- smart, active, excellent publications, but. . .
- deceased at age 28 in earthquake

Here we focus on a specific and nearly unknown of his contributions

# Historical background

## *Distribution theory at in the beginning of 20th century*

Gaussian distribution was the 'normal' one,  
but wider families were called for

- Gram-Charlier and Edgeworth expansions
- mixture of normals, Pearson's work
- Pearson system of 12 families

The study of data distribution was a key target of statistics

# de Helguero's view

## FdH views on non-Gaussian data distributions

- principle: the role of statistics is not simply to fit data, but also to help understanding the underlying mechanism
- $\Rightarrow$  Edgeworth expansions and Pearson system ☹
- mixtures (of normals) are more helpful
- in 1908, at 4th ICM, FdH presents an innovative proposal

# de Helguero's formulation

- A real phenomenon would generate a Gaussian distribution

$$X \sim N(b, \sigma^2)$$

if some external 'cause' did not perturb it

- often a realistic perturbation mechanism is that a value  $x$  is censored with probability  $\varphi(x)$   
 $\Rightarrow$  a curve "perturbed by selection"

- hence the observable distribution is proportional to

$$\text{const} \times \frac{1}{\sqrt{2\pi}\sigma} \exp \left\{ -\frac{1}{2} \left( \frac{x-b}{\sigma} \right)^2 \right\} [1 - \varphi(x)]$$

- $\varphi(x)$  can take various forms, the simplest is linear:

$$\varphi(x) = A(x - b) + B$$

# Modern reading

$$\text{const} \times \frac{1}{\sqrt{2\pi}\sigma} \exp \left\{ -\frac{1}{2} \left( \frac{x-b}{\sigma} \right)^2 \right\} \underbrace{[1 - B - A(x-b)]}_{1-\varphi(x)}$$

- $1 - \varphi(x)$  is linear in the interval of main interest, constrained to be 0 to the left, 1 to the right (or vice versa)
- in current view,  $N(b, \sigma^2)$  with a uniform 'skewing factor'
- in this sense FdH anticipates the key ingredients of the current 'skew' literature

## de Helguero's formulation (ctd)

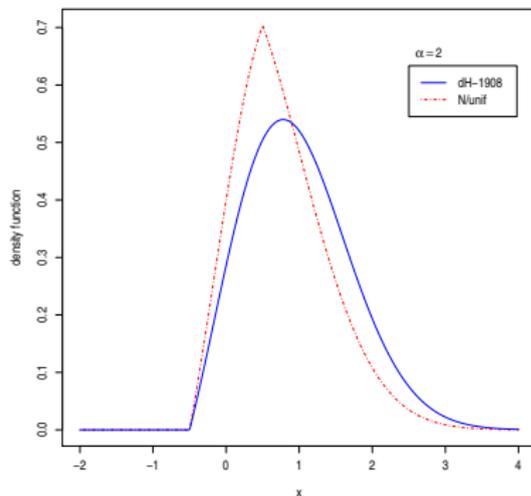
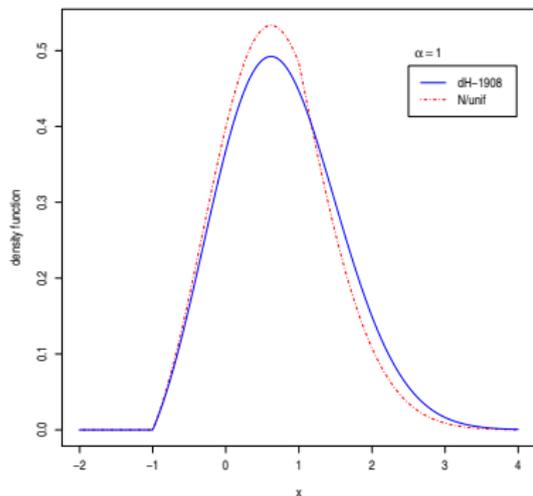
A further step:

- in addition to *thinning* by censoring, FdH includes the possibility of *thickening* a tail
- the same mathematical expression holds
- only the 0 constraint is retained for  $1 - \varphi(x)$ , it can exceed 1

Operative stage:

- FdH obtains expressions of moments up to order 3
- data fitting by method of moments
- develop special tables to solve non-linear equations
- various numerical illustrations with real data

# Some de Helguero's distributions



# Final comments

- FdH anticipated the key idea of current 'skew distributions'
- because of his premature passing his curves "perturbed by selection" went unnoticed
- if he had survived, he would have been a major role in the Italian statistical and biometrical world, not only for this specific theme.

## References

- de Helguero, F. (1909a). Sulla rappresentazione analitica delle curve abnormali. In G. Castelnuovo (Ed.), *Atti del IV Congresso Internazionale dei Matematici (Roma, 6–11 Aprile 1908)*. Available at <http://www.mathunion.org/ICM/ICM1908.3/Main/icm1908.3.0288.0299.ocr.pdf>
- de Helguero, F. (1909b). Sulla rappresentazione analitica delle curve statistiche. *Giornale degli Economisti*, XXXVIII, serie 2<sup>a</sup>, 241–265
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