

# ANALYSIS OF PROCESSES CAPABILITY USING THE SKEWED NORMAL DISTRIBUTION

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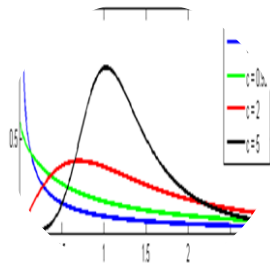
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Research Practise 1

EAFIT University

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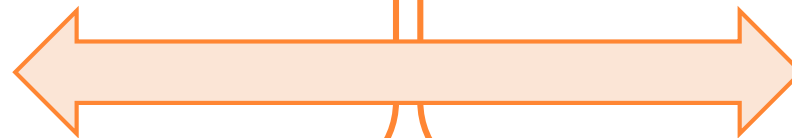
# Process capability indices requires normality



In practice there are interest variables that do not follow a normal distribution.

$$C_p = \frac{USL - LSL}{6\sigma}$$

Traditional process capability indices are sensitive to non-normality of data.



# Methods to estimate process capability indices associated with non-normal data

## Clements's percentile method:

It calculates the indices using a family of Pearson curves [1].

## Box-Cox transformation method:

It consists of an initial data transformation followed by the application of conventional methods to resulting data considered as normal [2].

[1] Clements, J. A. (1989). "Process capability indices for non-normal calculations". *Quality Progress*, 22, 49-55.

[2] Ahmad, S., Abdollahian, M. and Zeepongsekul, P. (2008). "Process capability estimation for non – normal quality characteristics: A comparison of Clements, Burr and Box – Cox Methods". *ANZIAM Journal*, 49, 642–665.

# Clements's percentile method

Index [1]	Normal	Non-Normal
Potential process capability index.	$C_p = \frac{USL - LSL}{6\sigma}$	$C_p = \frac{USL - LSL}{P_{0.99865} - P_{0.00135}}$
Capability index for the lower specification level.	$C_{pl} = \frac{\mu - LSL}{3\sigma}$	$C_{pl} = \frac{P_{0.5} - LSL}{P_{0.5} - P_{0.00135}}$
Capability index for the upper specification level.	$C_{pu} = \frac{USL - \mu}{3\sigma}$	$C_{pu} = \frac{USL - P_{0.5}}{P_{0.99865} - P_{0.5}}$
Real process capability index.	$C_{pk} = \min\{C_{pl}, C_{pu}\}$	$C_{pk} = \min\{C_{pl}, C_{pu}\}$

- Where:
- $\mu$ : real mean
  - $\sigma^2$ : real variance
  - $USL$  and  $LSL$ : upper and lower specification limits
  - $P_q$ :  $q$  percentile, with  $0 < q < 1$

[1] Clements, J. A. (1989). "Process capability indices for non-normal calculations". Quality Progress, 22, 49-55.

# Skewed Normal distribution

The probability density function associated to a random variable with a Skewed Normal distribution is as follows [3]:

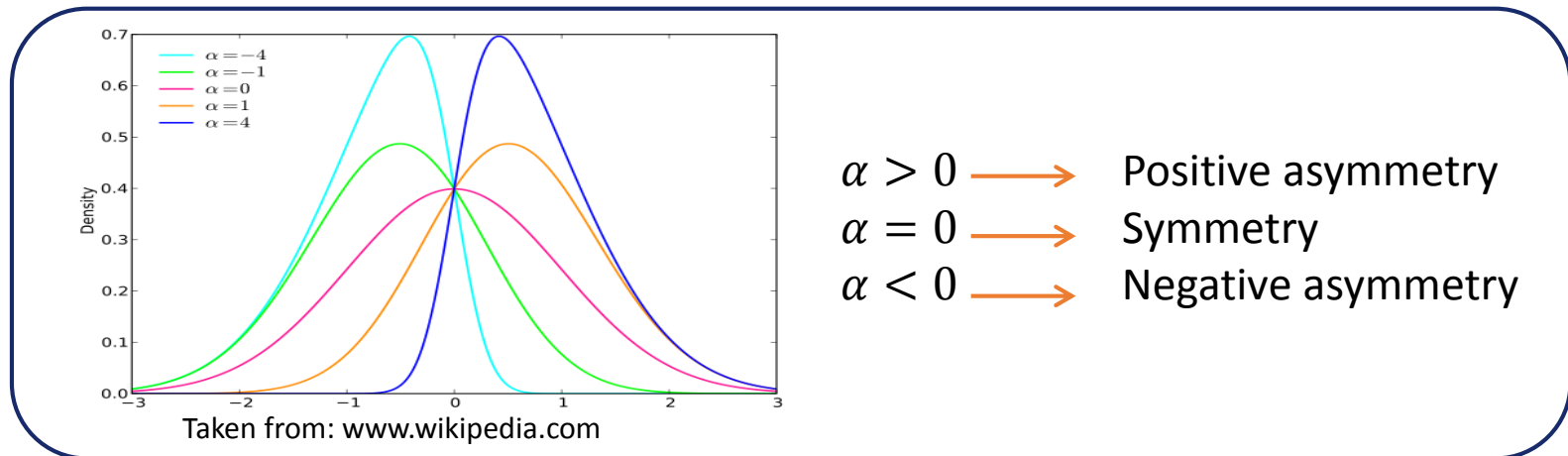
$$f(x) = \frac{1}{\omega\pi} e^{-\frac{(x-\xi)^2}{2\omega^2}} \int_{-\infty}^{\alpha\left(\frac{x-\xi}{\omega}\right)} e^{-\frac{t^2}{2}} dt$$

Where:

$\xi$  is a position parameter  $\longleftrightarrow \mu$

$\omega$  is a scaling parameter  $\longleftrightarrow \sigma$

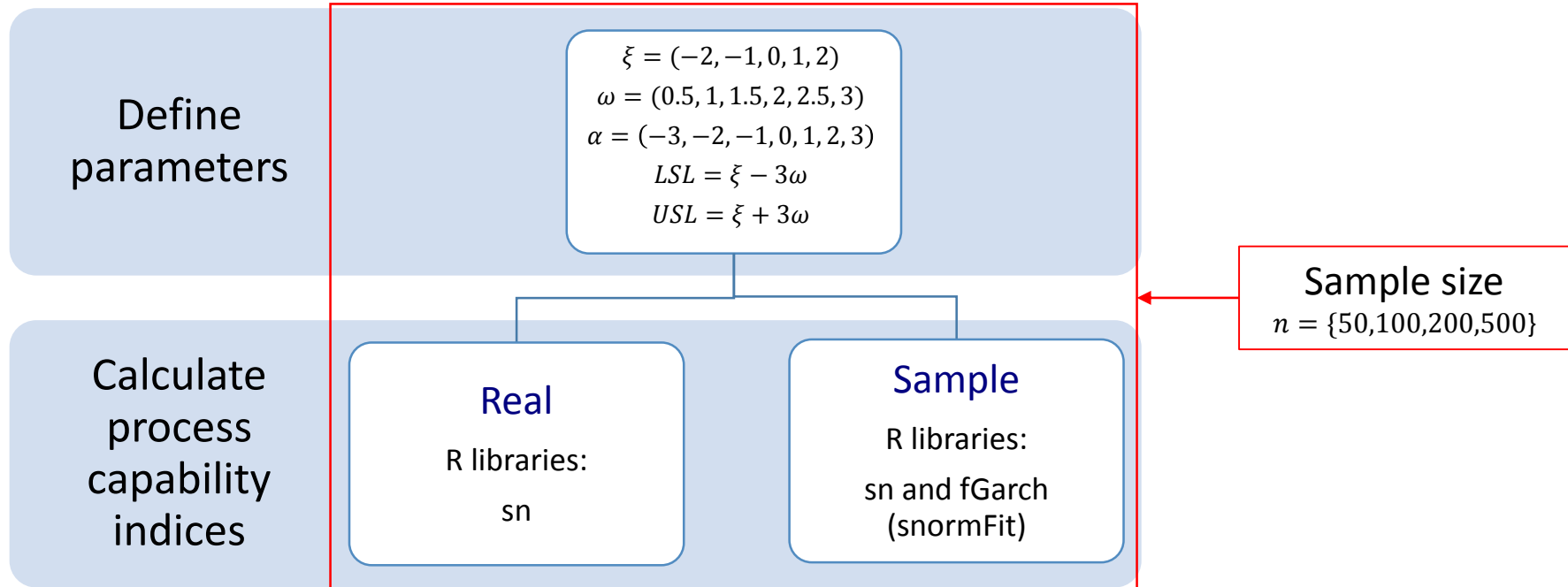
$\alpha$  is a shape parameter



$\alpha > 0$   $\longrightarrow$  Positive asymmetry  
 $\alpha = 0$   $\longrightarrow$  Symmetry  
 $\alpha < 0$   $\longrightarrow$  Negative asymmetry

[3] Figueiredo, F. and Gomes, I. (2011) "The skew-normal distribution in SPC". National Funds through Fundação para a Ciência e a Tecnologia.

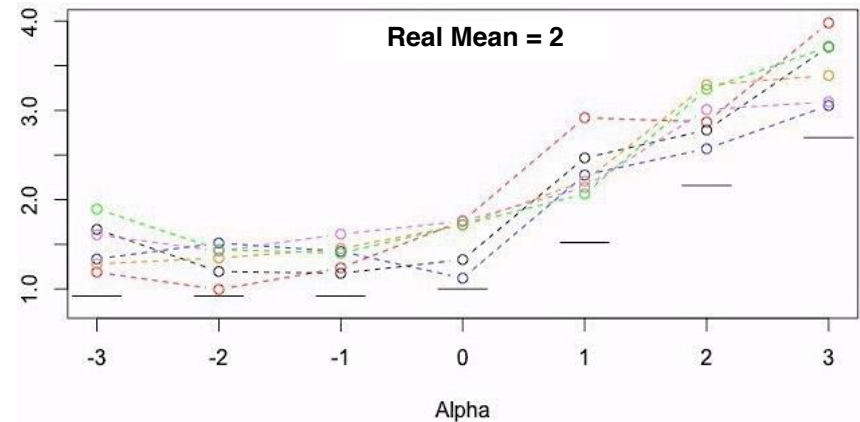
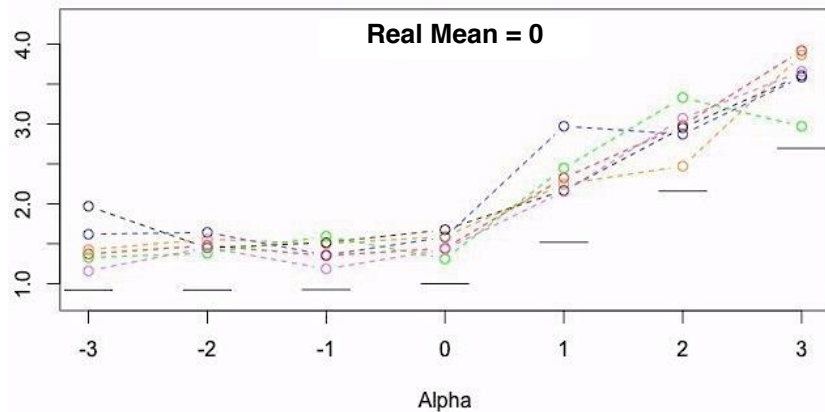
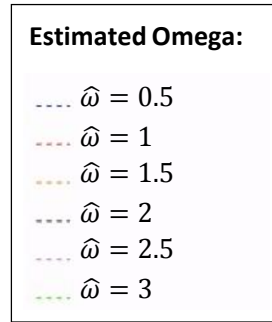
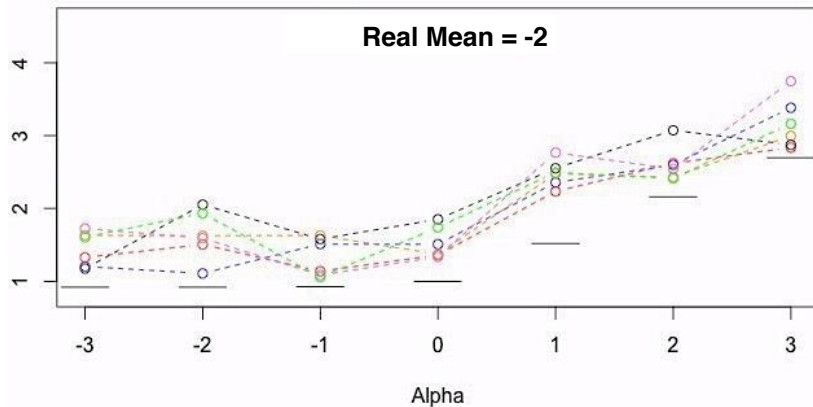
# Method adaptation in R



Number of studied scenarios = 840

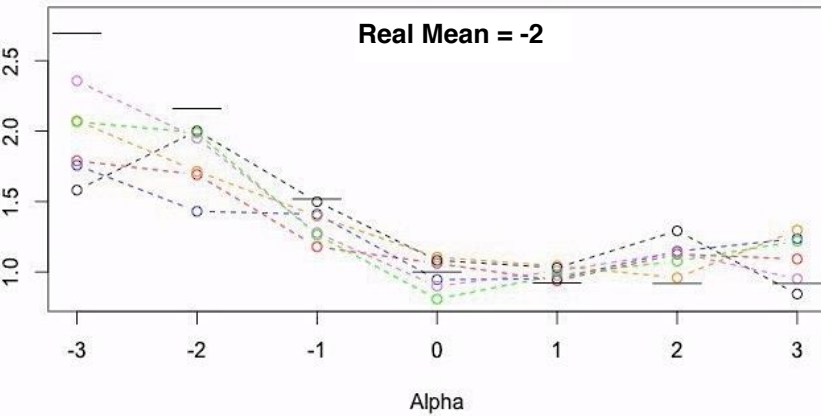
# The shape parameter ( $\alpha$ ) sets a trend in estimates of process capability indices

Index  $C_{pl}$  for sample size 50



# The shape parameter ( $\alpha$ ) sets a trend in estimates of process capability indices

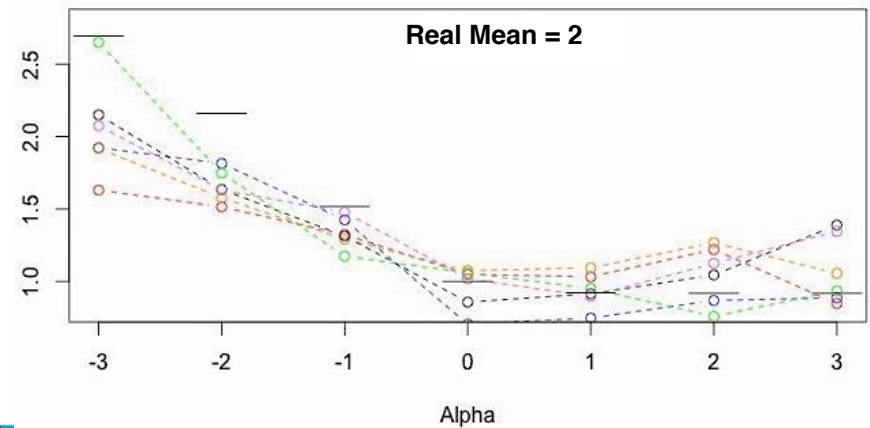
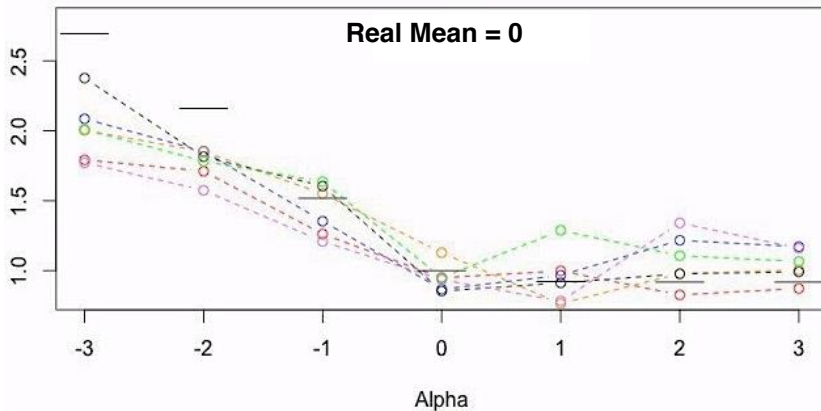
Index  $C_{pu}$  for sample size 50



Estimated Omega:

- $\hat{\omega} = 0.5$
- $\hat{\omega} = 1$
- $\hat{\omega} = 1.5$
- $\hat{\omega} = 2$
- $\hat{\omega} = 2.5$
- $\hat{\omega} = 3$

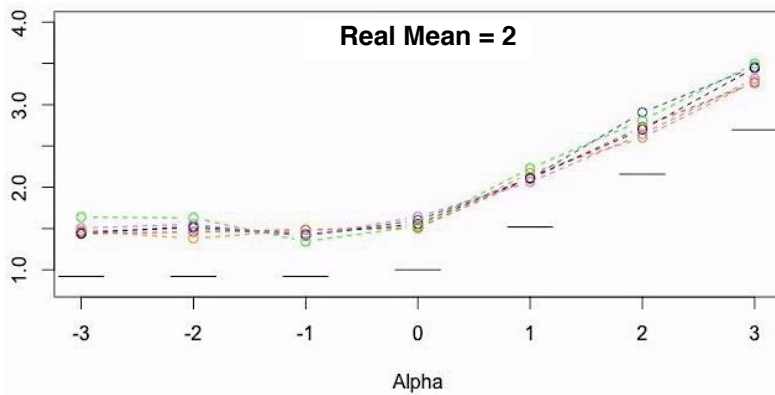
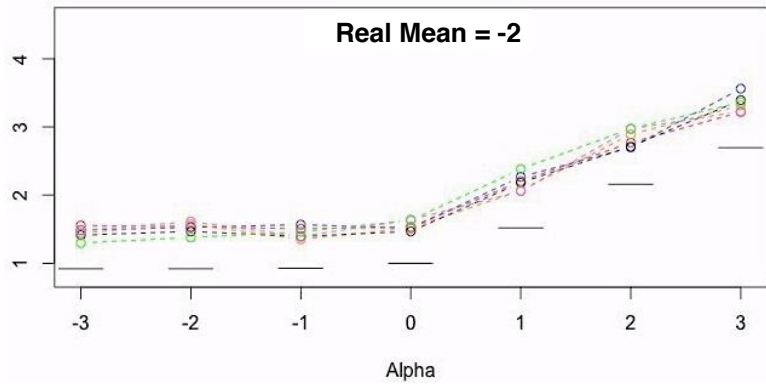
The trend is independent of the values of the parameters of position and scale.





# The trend continues for different sample sizes

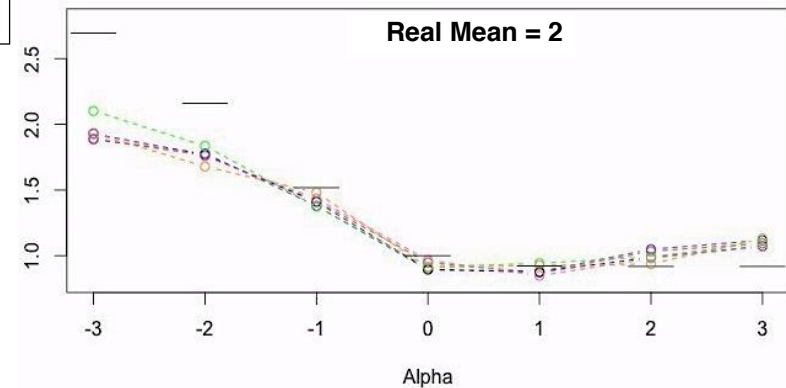
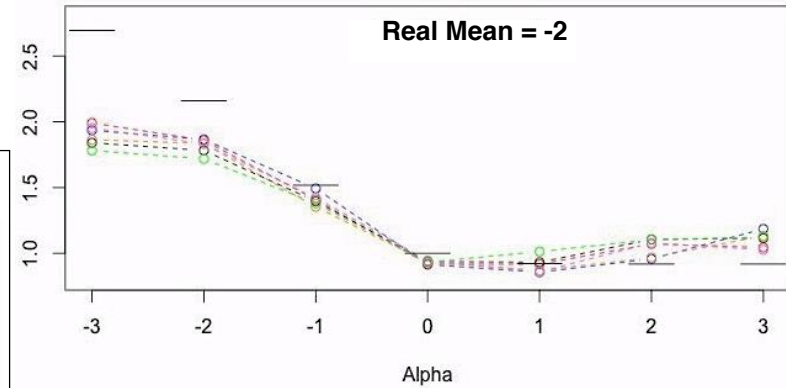
$C_{pl}$



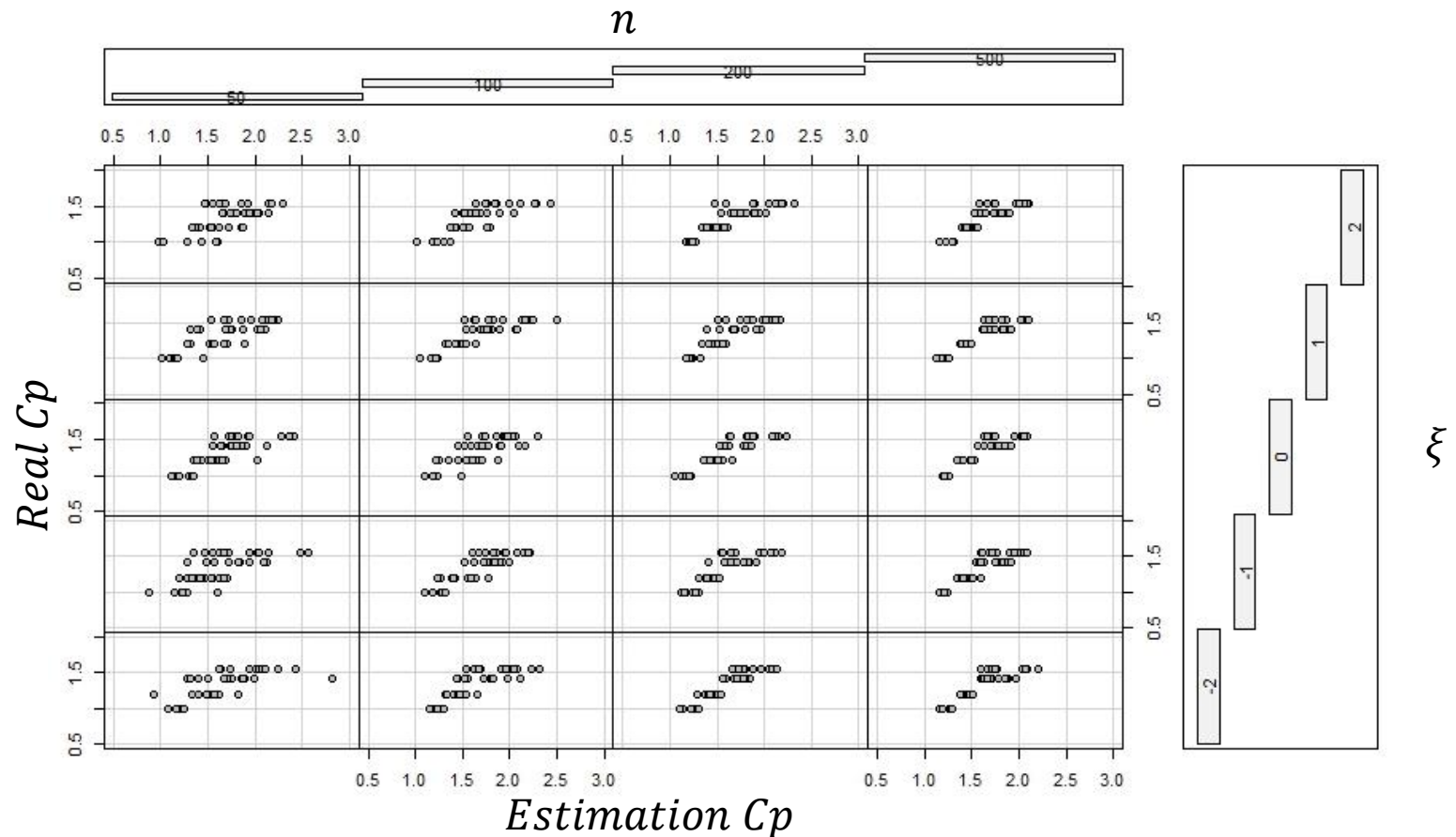
Estimated Omega:

- $\hat{\omega} = 0.5$
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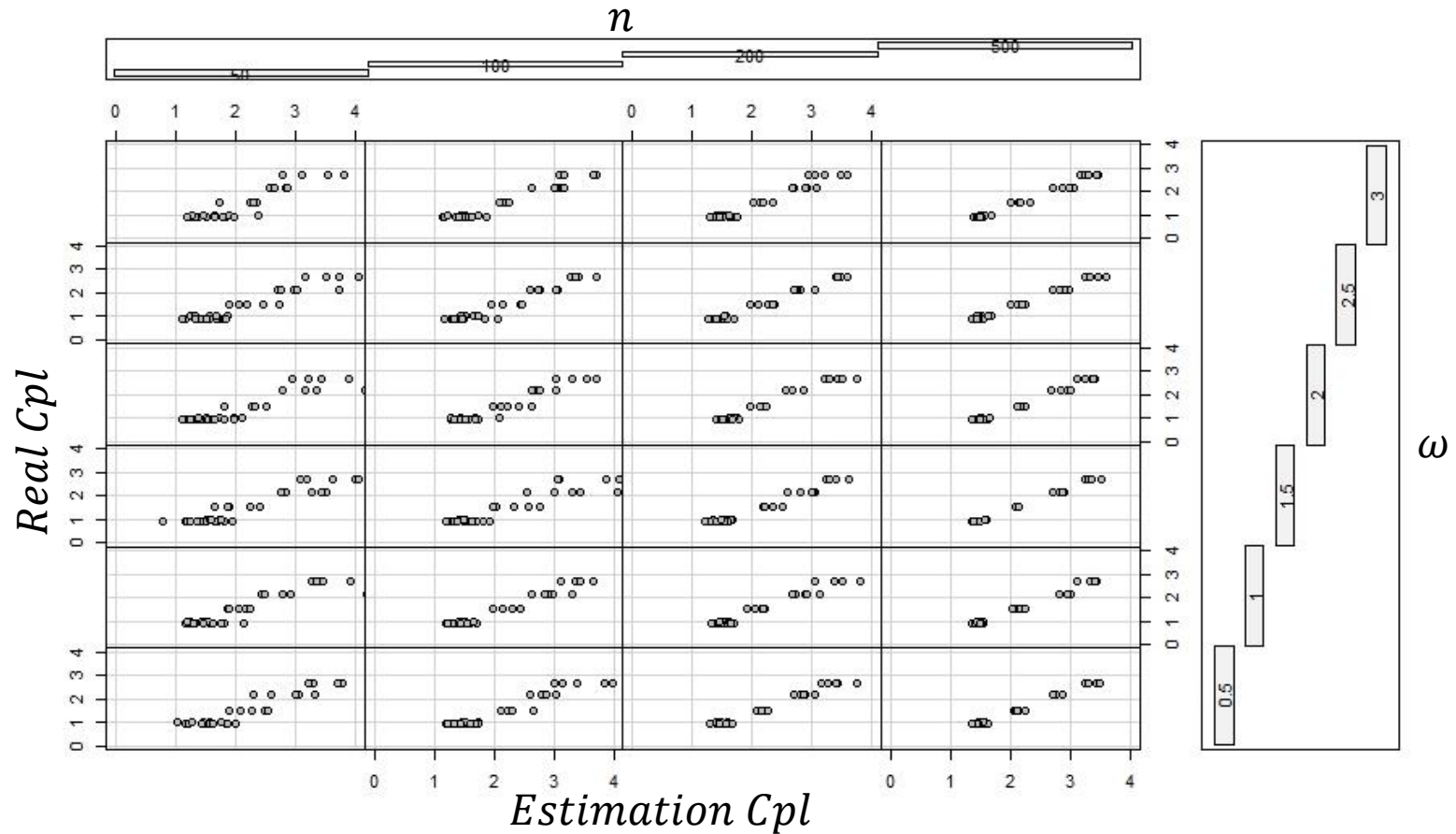
$C_{pu}$



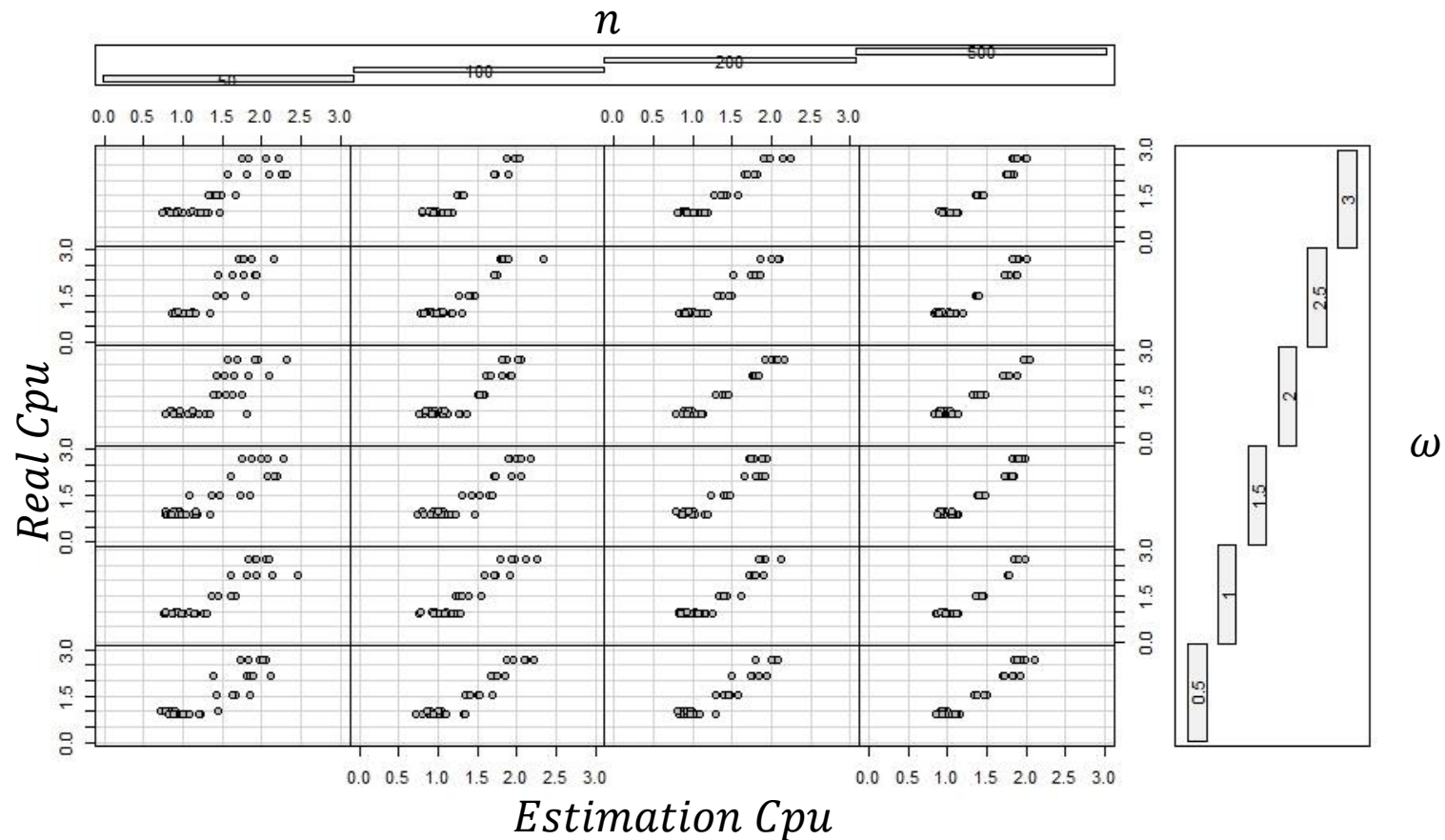
# Consistent estimators are obtained for any value of $\xi$



This consistency is more obvious to the position parameter  $\omega$

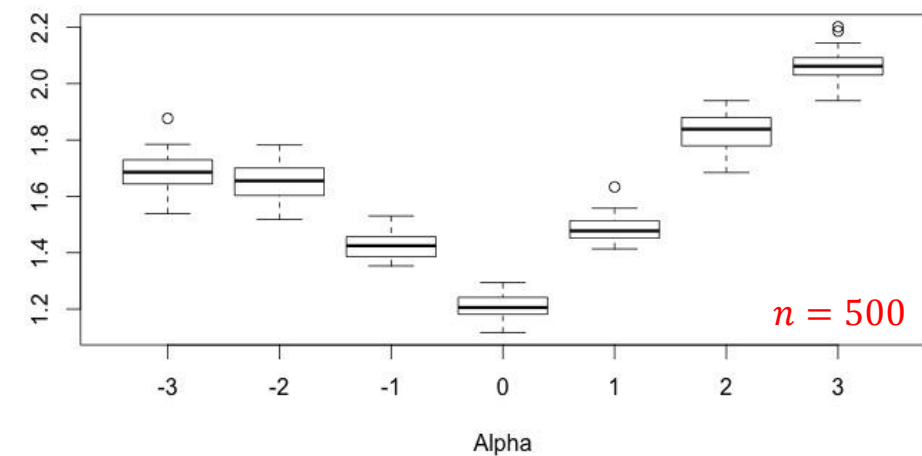
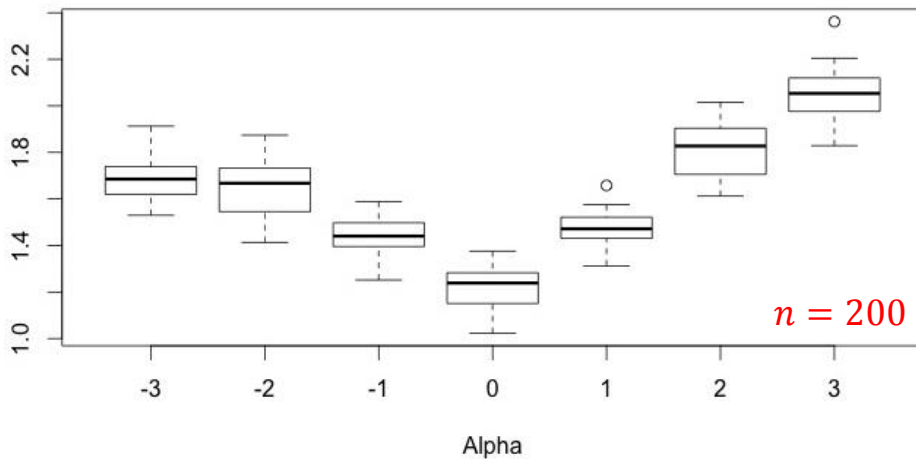
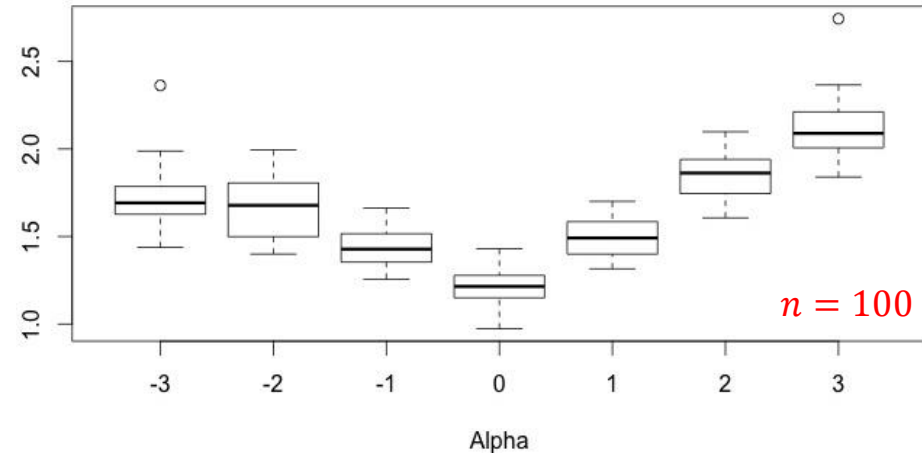
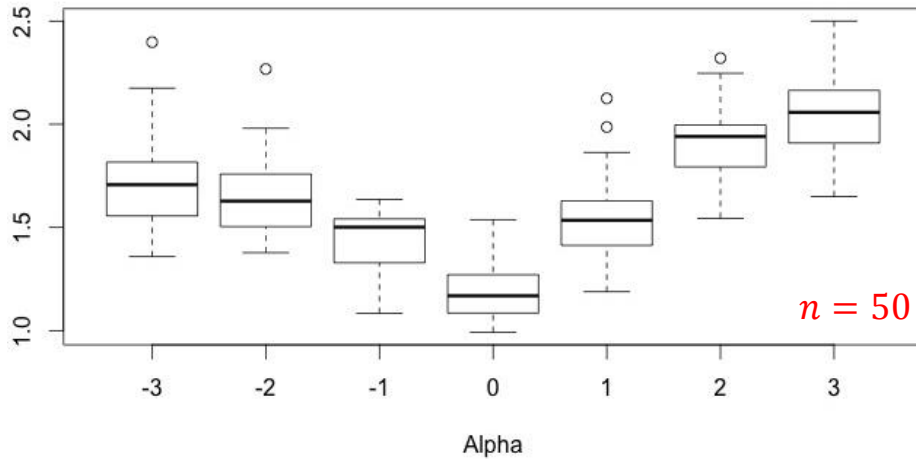


# The consistency of $\xi$ and $\omega$ is satisfied for any index



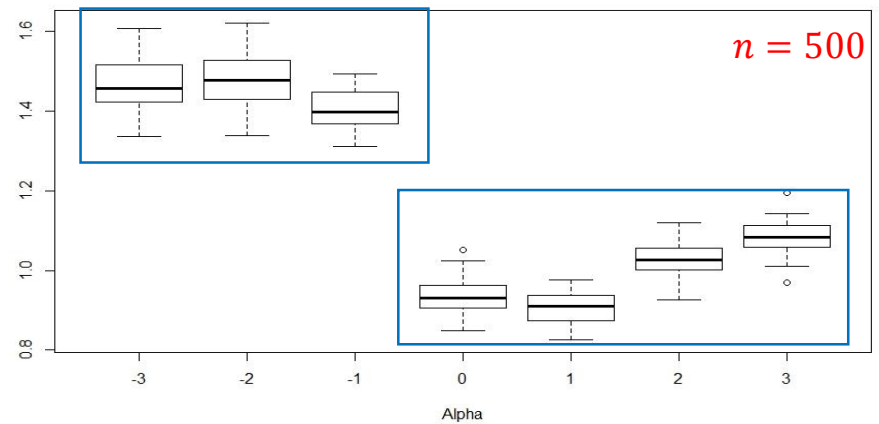
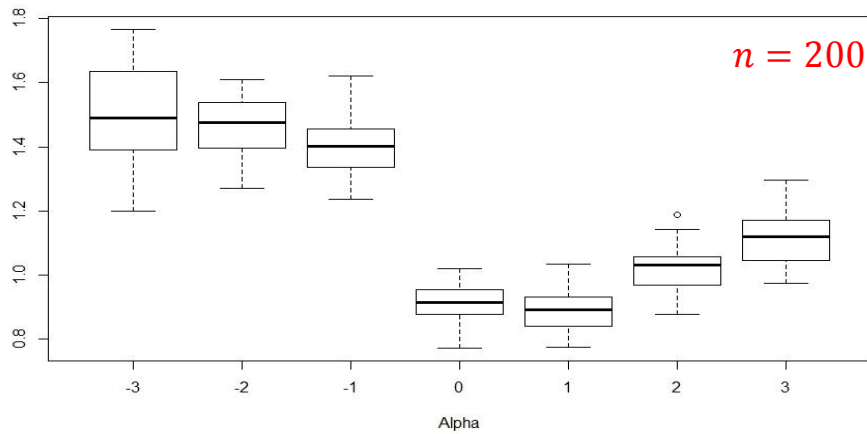
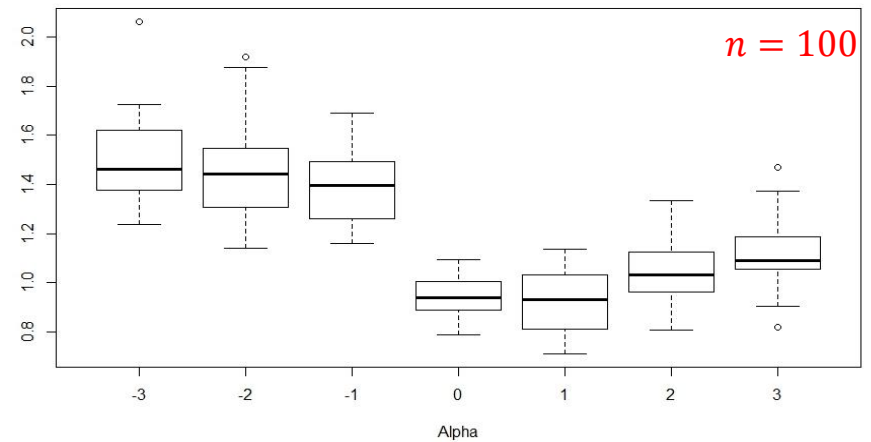
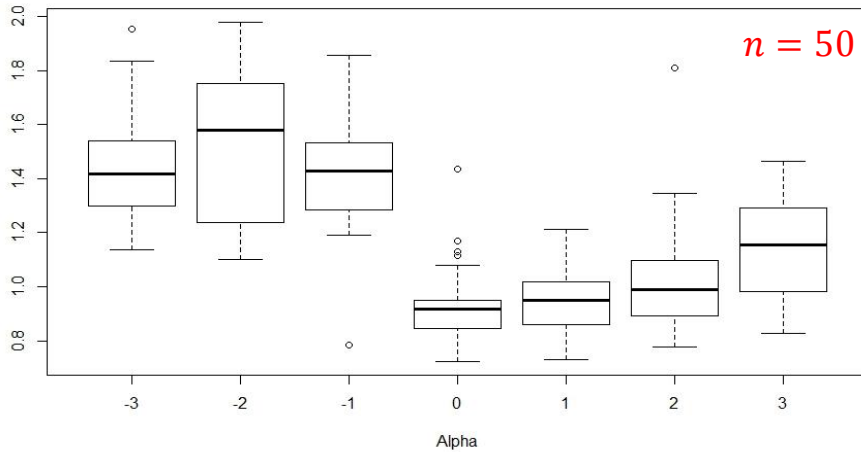
# Limits for $C_p$ based on the shape parameter $\alpha$

There is some symmetric in the index values.



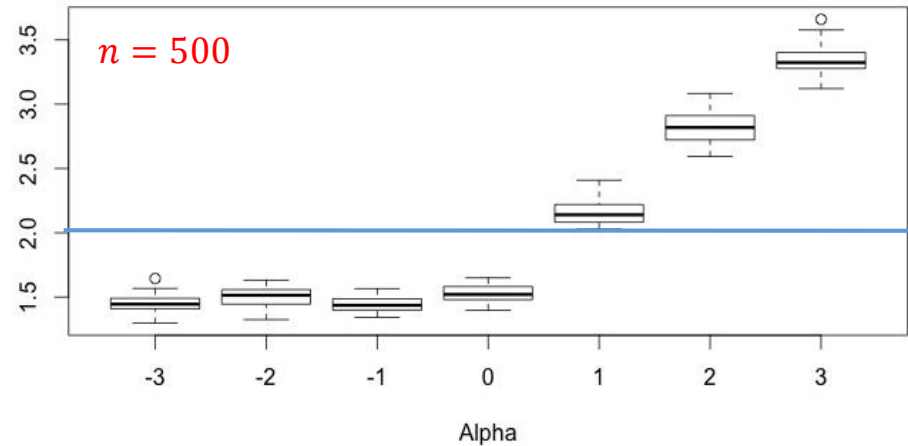
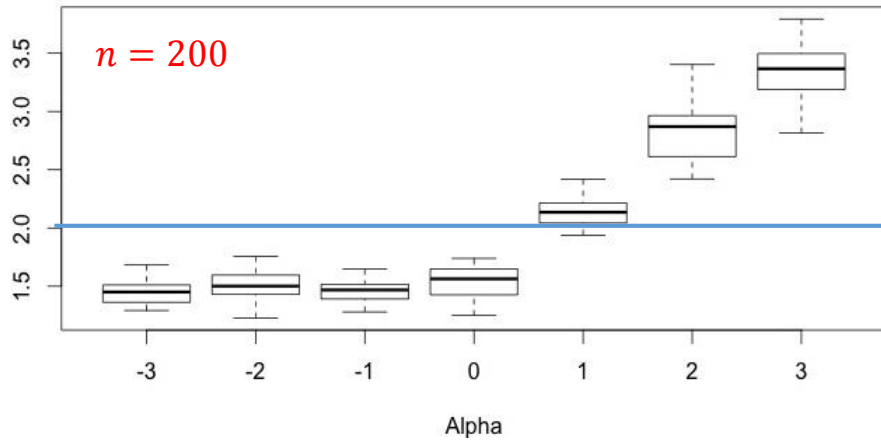
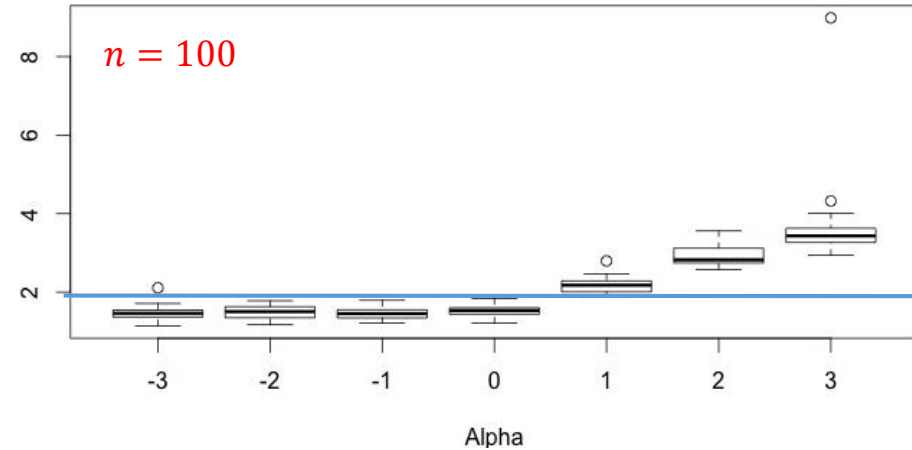
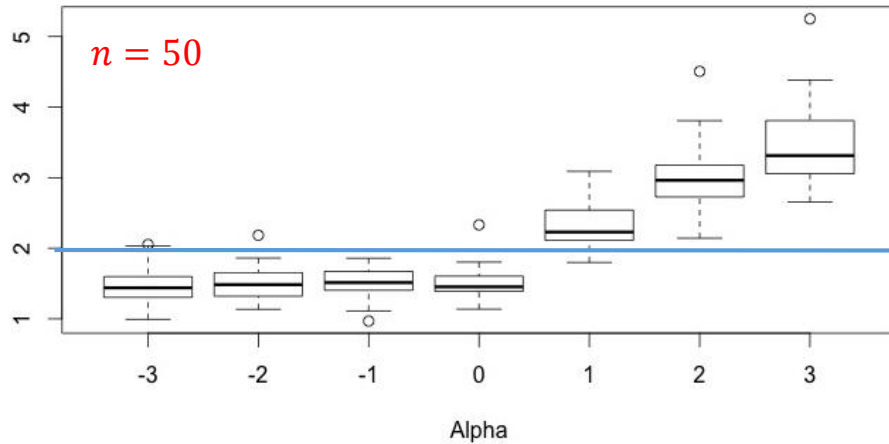
# Limits for $C_{pk}$ based on the shape parameter $\alpha$

Two sets of values are established.



# Limits for $C_{pl}$ based on the shape parameter $\alpha$

There is a cutoff point



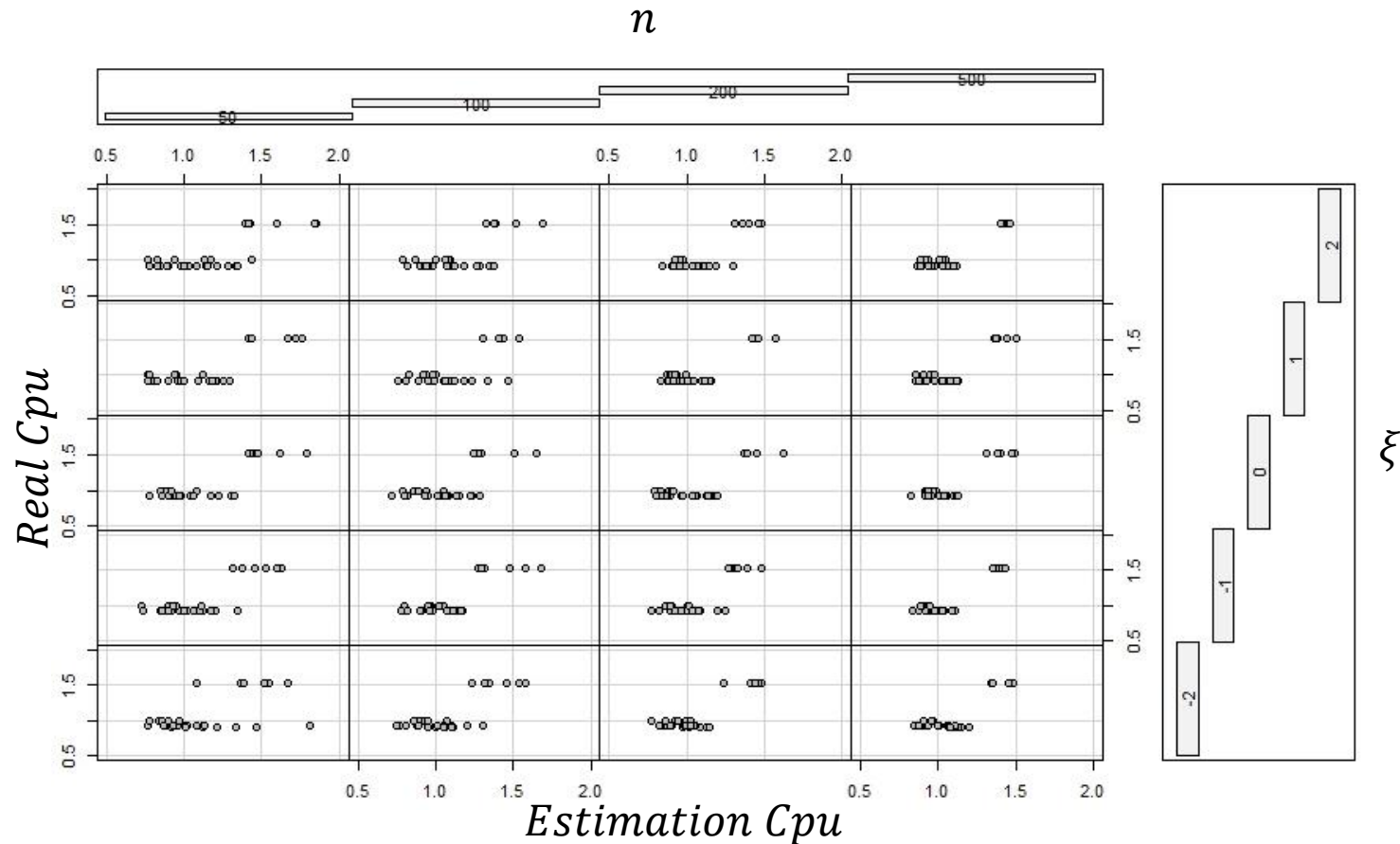
# Objectives fulfillment

Objectives	Percentage
Identify methods to estimate process capability indices associated with non-normal data.	100%
Select one of these methods and adapt it to the Skewed Normal distribution.	100%
Develop the proposed methodology in a programming language.	80%
Compare the proposed methodology performance against conventionally used methods reported in literature.	10%

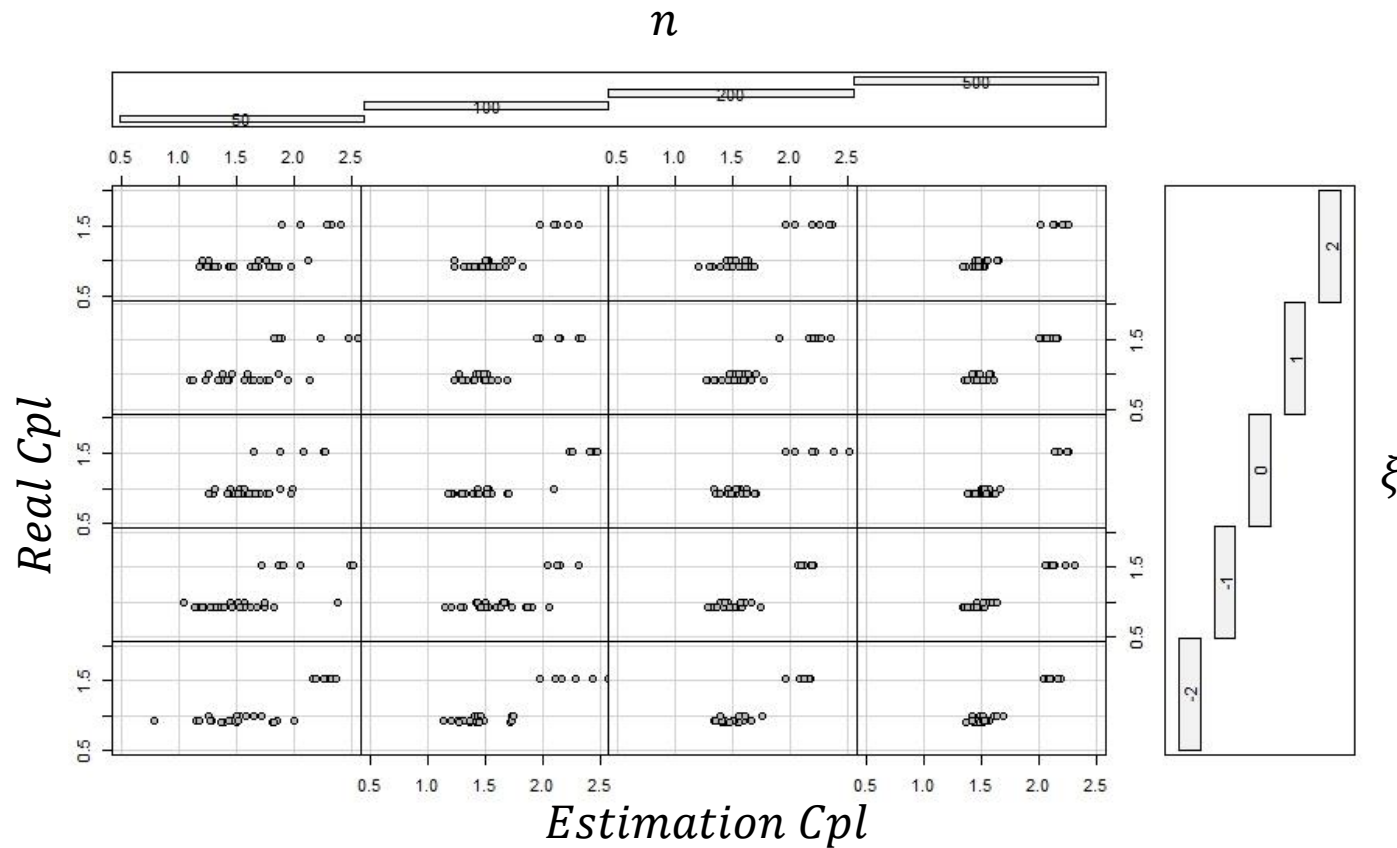


**THANKS FOR YOUR  
ATTENTION**

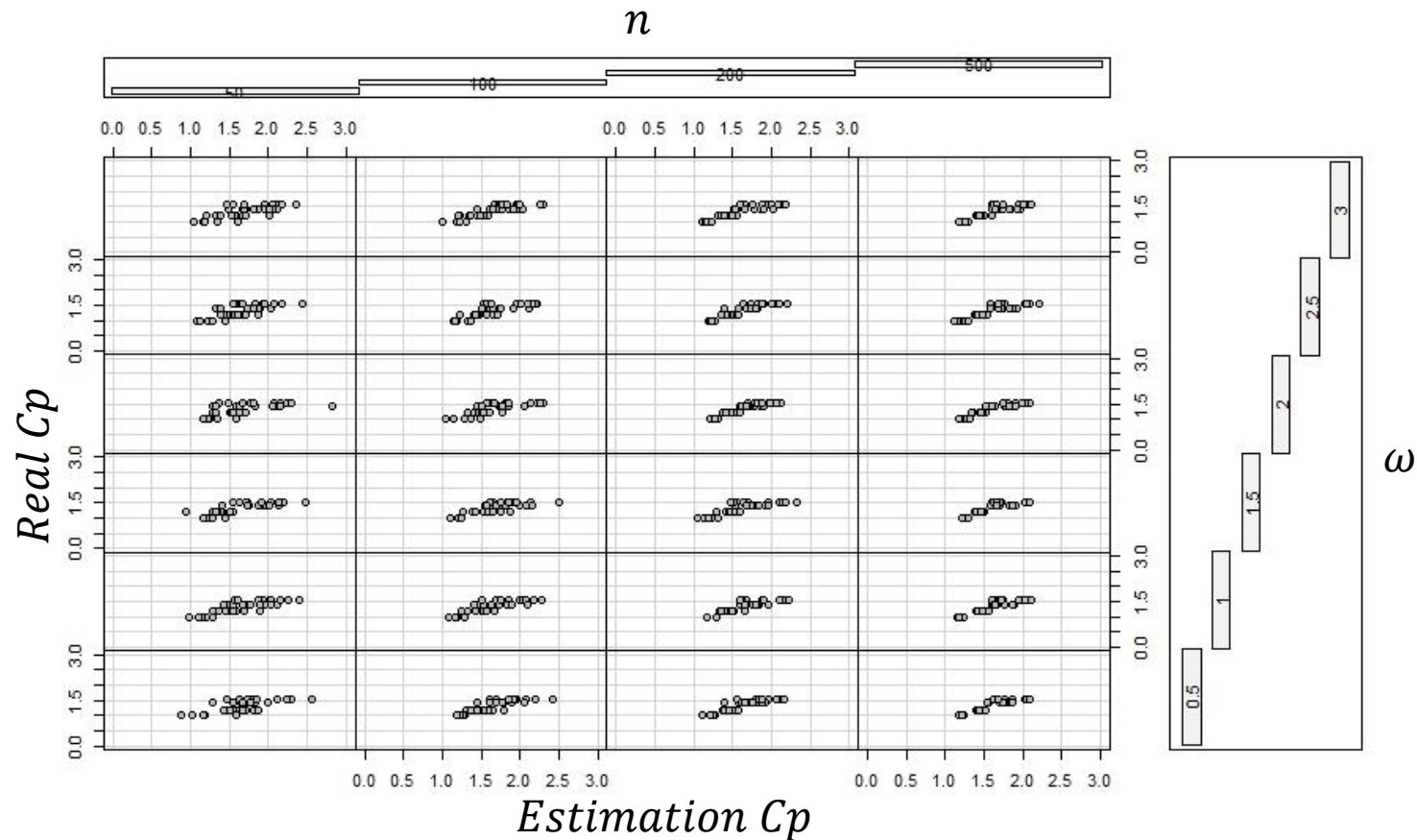
# Consistent estimators are obtained for any value of $\xi$



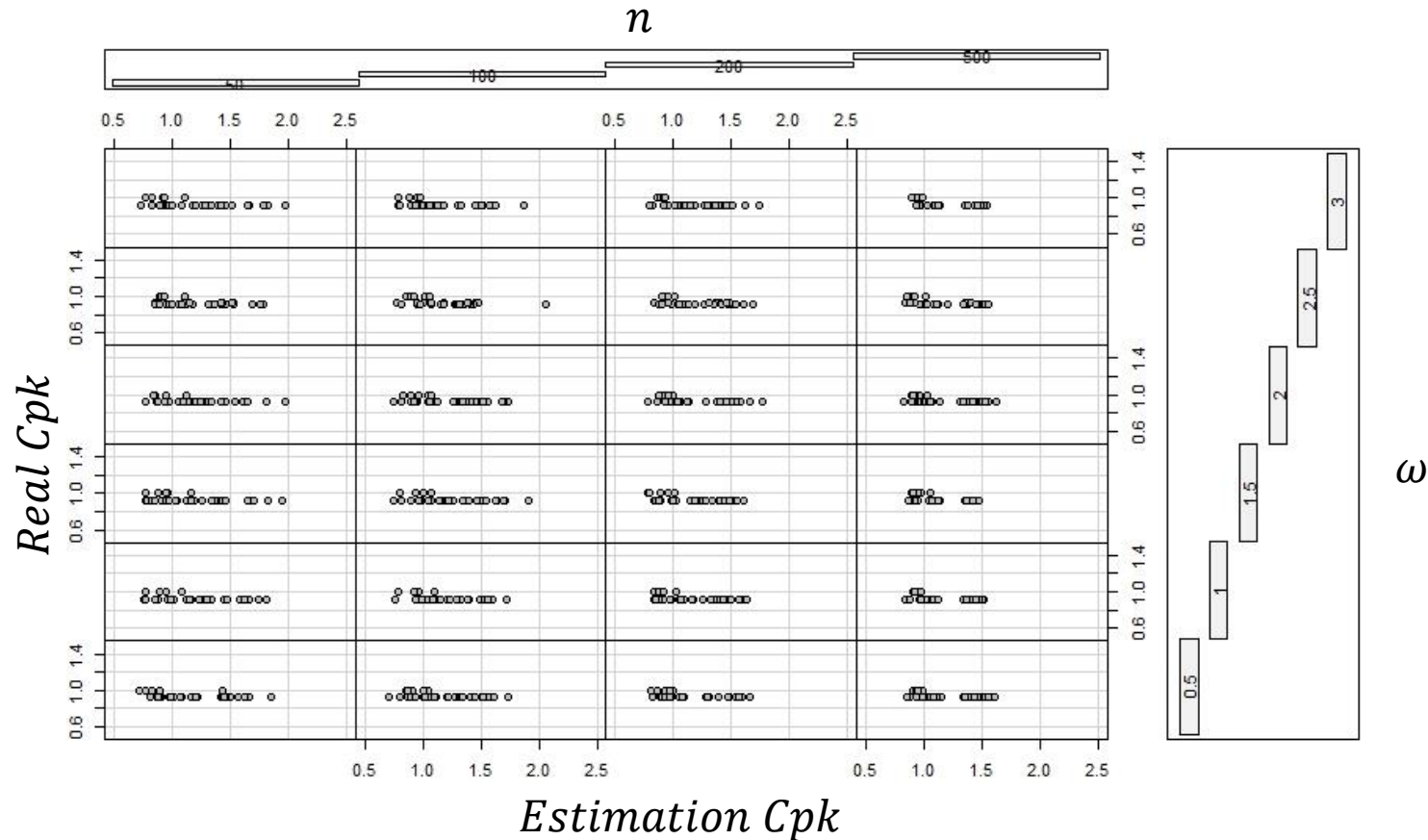
# Consistent estimators are obtained for any value of $\xi$



# Consistent estimators are obtained for any value of $\omega$



# Consistent estimators are obtained for any value of $\omega$



# The snormFit function produces inaccurate estimates of $\alpha$

