



# Estatística Computacional Computational Statistics Statistical Computing



Prof. Lorí Viali, Dr.  
viali@mat.ufrgs.br  
http://www.mat.ufrgs.br/~viali/



Prof. Lorí Viali, Dr. - UFRGS - Departamento de Matemática e Estatística - http://www.mat.ufrgs.br/~viali/



A tecnologia computacional atual tornou possível grandes avanços na análise de dados, nas várias áreas do conhecimento. Este impacto é mais evidente quando se observa a forma fácil e rápida com que os computadores podem analisar grandes quantidades de dados complexos.

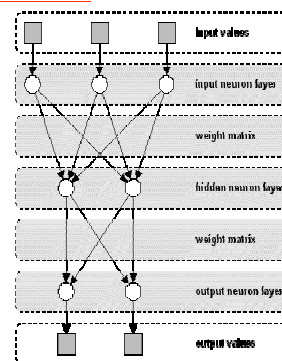
As técnicas multivariadas foram desenvolvidas antes do surgimento dos computadores. Entretanto permaneceram praticamente desconhecidas fora da área da pesquisa. Foi só depois do surgimento dos computadores que elas começaram a ser conhecidas.



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Graças aos computadores novas áreas de aplicação e pesquisa se desenvolveram e estão se desenvolvendo como a mineração de dados, as redes neurais, a reamostragem, o reconhecimento de padrões, entre outras.



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## Exercício

Listar pelo menos cinco áreas da Estatística Computacional



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Thomas Bayes  
1702 - 1761



Áreas como a Estatística Bayesiana ganharam novo impulso, graças aos computadores e a MCMC (Markov Chain Monte Carlo).



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*Métodos de Regularização (smoothing) como o Kernel, Séries Ortogonais, Função Splíne, Regressão Não Paramétrica e Regressão Localmente Ponderada.*



*Métodos de Resampling (estimação) como o Bootstrapping e o Jackknife;*

*MCMC: Gibbs sampler, algoritmo de Metropolis-Hastings, Simulated Annealing.*



*A Estatística Computacional é uma interface entre a Estatística, a Computação e a Análise Numérica. O objetivo é desenvolver algoritmos numéricos que sejam eficientes e estáveis, para serem utilizados em cálculos estatísticos, metodologias para bases de dados estatísticas e aplicativos (pacotes).*

*James E. Gentle (Professor de Estatística Computacional da Universidade George Mason)*



*Computational Statistics is the area of specialization within statistics that includes statistical visualization and other computationally-intensive methods of statistics. Computational statistics is built on the mathematical theory and methods of statistics, and includes visualization, statistical computing, and Monte Carlo methods. The emphasis in computational statistics is often on exploratory methods.*

*<http://mason.gmu.edu/~jgentle/>*



### **Exercício:**

*Encontrar outras definições para a Estatística Computacional.*



*Os avanços no hardware e no software alteraram de forma significativa o trabalho das pessoas e em especial a dos Estatísticos. Analistas de Dados e Estatísticos Aplicados dependem dos computadores para armazenar e analisar dados e para produzir relatórios descrevendo as análises feitas.*



*Estadísticos Matemáticos e Probabilistas utilizam o computador para computação simbólica, para a avaliação de expressões, para a execução de simulações e para a produção de artigos e relatórios.*



*Alguns efeitos sobre a Estatística ou Estatísticos tem sido sutil como a mudança da utilização de “valores críticos” para os “valores-p”, enquanto outros tem sido mais fundamentais como o uso de modelos multivariados ou não lineares sobre o modelo linear univariado, que era utilizado como uma aproximação, uma vez que os multivariados não eram viáveis (James E. Gentle).*



### *Exercício:*

*Leitura do Artigo: a Estatística está*



## *Associações*



### *ISI (INTERNATIONAL STATISTICAL INSTITUTE)*



*The International Statistical Institute (ISI) is one of the oldest international scientific associations functioning in the modern world. The Institute is an autonomous society which seeks to develop and improve statistical methods and their application through the promotion of international activity and co-operation.*



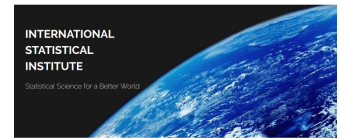
### *Multilingual Glossary of Statistical Terms*



*Johan Dragt of the ISI Senior Executive Corps volunteered as a project leader and has since 1993 compiled a large amount of information in 19 languages for the project. He has constructed a database that contains not only over 3,000 statistical terms, as well as short descriptive texts, including formulae.*



The present version of the multilingual statistical glossary is a first start for Internet usage and is intended to demonstrate the versatility of the information gathered and also provides a means for correcting and expanding the translations provided here with the help of the users of the glossary.



Bernoulli Society

International Association of Survey Statisticians

International Association for Statistical Computing - IASC

International Association for Official Statistics

International Association for Statistical Education



The International Association for Statistical Computing (IASC) was founded during the 41st Session of the ISI in 1977, as a Section of the ISI.



The objectives of the Association are to foster world-wide interest in effective statistical computing and to exchange technical knowledge through international contacts and meetings between statisticians, computing professionals, organizations, institutions, governments and the general public.



The IASC publishes the *Journal Computational Statistics & Data Analysis* and organizes its own Conferences (IASC World Conferences, COMPSTAT in Europe, ARS Conferences on Statistical Computing in Asia) and Summer Schools as well as sections of the ISI Conferences.



The ASA Section on Statistical Computing was established on January 1, 1972. The mission is to promote the application of computer to statistical problems. We encourage the joint application of statistical techniques and computer technology in other fields, and act as a focal point for computer-oriented activities within the ASA. The importance of these activities is becoming even more critical with the advance of information technologies that challenge us with new problems and enormous data sets.



The section is interested in all aspects of the use of computers and computing in modern statistical analysis. Computational issues are an essential part of modern statistics, data analysis and data mining. Competent statisticians and practitioners must not just understand the principles on which statistical methods work but also be able to implement them on computers in ways that are transparent, require minimal user intervention and scale well with large data sets.



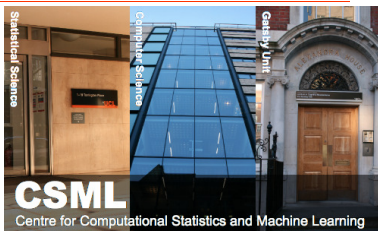
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The Japanese Society of Computational Statistics (JCS) is a scientific and educational society founded in 1986 to broaden and extend excellence of computational statistics, which plays a significant role in the information age, through academic activities for various fields in statistical science and computational science.



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The Centre for Computational Statistics and Machine Learning (CSML) spans three departments at University College London, Computer Science, Statistical Science, and the Gatsby Computational Neuroscience Unit.



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## Conferências

22nd International Conference on COMPUTATIONAL STATISTICS (COMPSTAT 2016)  
23-26 August 2016, Auditorio Principe Felipe, Oviedo, Spain

### Aims and Scope

The conference aims at bringing together researchers and practitioners to discuss recent developments in computational methods, methodology for data analysis and applications in statistics. All topics within the broad interface of Computing & Statistics will be considered for oral and poster presentation. Topics includes, but are not limited to:

- biostatistics & biocomputing
- categorical data analysis
- clustering & classification
- computer-aided data analysis
- computational Bayesian methods
- computational econometrics
- data visualization
- extreme value theory & applications
- functional data analysis
- high-dimensional data analysis
- kernel & Monte Carlo methods
- machine learning
- mixture models
- multivariate data analysis
- nonparametric statistics
- numerical methods in statistics
- optimization heuristics in statistical modeling
- parametric & semi parametric models
- robust statistics
- sampling methods
- signal processing
- spatial statistics
- symbolic data analysis
- time series analysis



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I LACSC  
July 22-24, 2016 - Gramado, State of Rio Grande do Sul, Brazil



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**Pacific Conference on Statistical Computing and  
Data Mining**  
Palm Springs, California - May 6 - May 8



**Big Data | Statistics | Algorithms | Resampling  
Methods | Regression Trees | Computer Science |  
Programming | Open-source**



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**CCSDA 2016 : 18th International Conference on  
Computational Statistics and Data Analysis**  
Paris, France - July 25 - 26, 2016



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The ICCSDA 2016: 18th International Conference on Computational Statistics and Data Analysis aims to bring together leading academic scientists, researchers and research scholars to exchange and share their experiences and research results about all aspects of Computational Statistics and Data Analysis. It also provides the premier interdisciplinary forum for researchers, practitioners and educators to present and discuss the most recent innovations, trends, and concerns, practical challenges encountered and the solutions adopted in the field of Computational Statistics and Data Analysis.



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- |  |  |
|--|--|
| Advances in Mixture Models                             | Computational Statistics Teaching                          |
| Analysis of Symbolic and Structured Data               | Computer-intensive methods for dependent data              |
| Applications in Macro-Economics, Finance and Marketing | Data Analysis Techniques for Evaluating Trading Strategies |
| Association Rules                                      | Data assimilation and its application                      |
| Bayesian Computation methods                           | Data Mining  |
| Biostatistics and Bio-computing                        | Data Streams and Massive data                              |
| Business Intelligence                                  | Design of Experiments                                      |
| Categorical Data Analysis                              | Dimensionality Reduction                                   |
| Classification and Discrimination                      | Econometrics and Statistical Finance                       |
| Clinical Trials  | Environmental Statistics and Climate Change                |
| Clustering   | Financial econometrics                                     |
| Computational Bayesian Methods                         | Flexible function estimation in high dimensional problems  |
| Computational Econometrics                             | Functional Data Analysis                                   |
| Computational Methods for Industry                     | Functional Genomics: Computational and Statistical Aspects |
| Computational Methods in Official Statistics           |  |



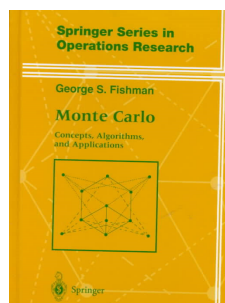
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LIVROS



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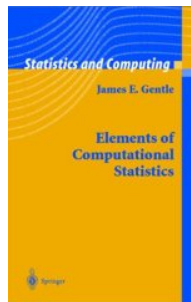
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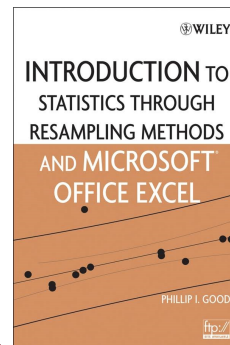


GENTLE, James E.  
**Elements of Computational Statistics.**  
 London: Springer, 2002.  
 440 p.



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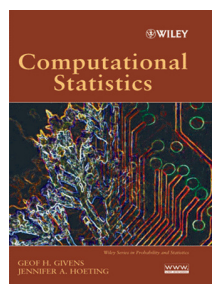
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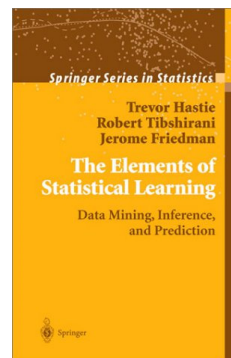
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GIVENS, Geof H., HOETING, Jennifer A.  
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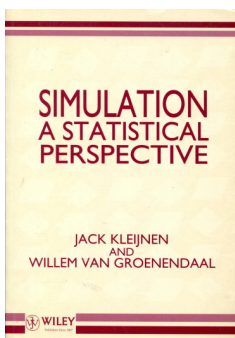
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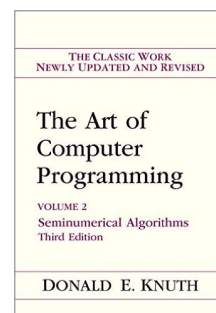
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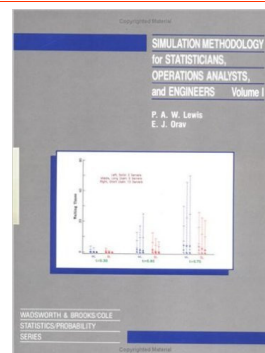
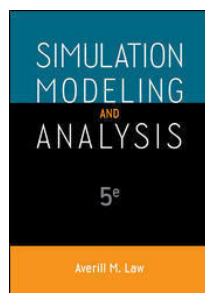


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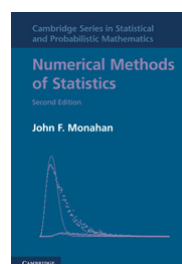
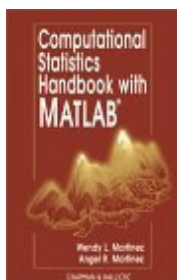
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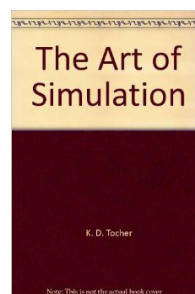
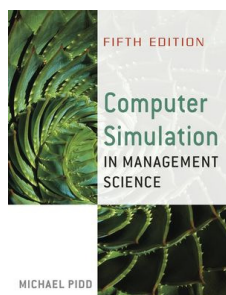
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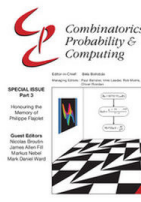


## Periódicos (Journals)

*Combinatorics, Probability & Computing*

*Communications in Statistics – Simulation and Computation*

*Computational Statistics*



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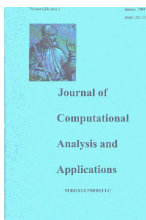
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*Computational Statistics & Data Analysis*

*Journal of Computational Analysis and Applications*

*Journal of Informetrics*



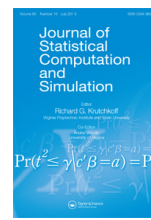
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*Journal of Computational and Graphical Statistics*

*Journal of Statistical Computation and Simulation*

*Journal of Statistical Software*

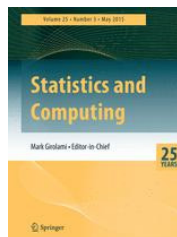


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*SIAM Journal on Scientific Computing*

*Statistics and Computing*



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## Pessoas

## James Gentle University Professor of Computational Statistics



<http://mason.gmu.edu/~jgentle/>



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## Livros de James Gentle



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## Dr. Hossein Arsham University of Baltimore Baltimore, Maryland, USA



<http://home.ubalt.edu/ntsbarsh/>



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## Simulações



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Let's Make a Deal

ou

The Monty Hall Problem

ou

The Three Doors Puzzle



## Enunciado

<http://www.prof2000.pt/users/esmmat/portas.htm>

## Conexões

<http://math.rice.edu/~pcmi/mathlinks/montyurl.html>

## Solução

<http://marilynvoosavant.com/game-show-problem/>

## Simulação



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### 3D Normal Distribution in Virtual Reality

The left mouse button changes the point of view

The right mouse button stops and starts the rotation

The slider modifies the Correlation Coefficient "r"

<http://www.stat.unipg.it/iasc/JAVA/nor3d-en.html>

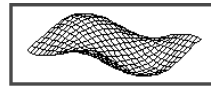


## Sites



### Center for Computational Statistics

<http://www.galaxy.gmu.edu/stats/center.html>

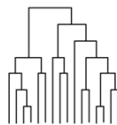


### Statistics, Statistical Computing, and Mathematics

<http://www.pibburns.com/statmath.htm>



### Computational Statistics in the Data Sciences Program



<http://www.scs.gmu.edu/~jgentle/compstat/index.html>



### The R Project for Statistical Computing

<https://www.r-project.org/>

