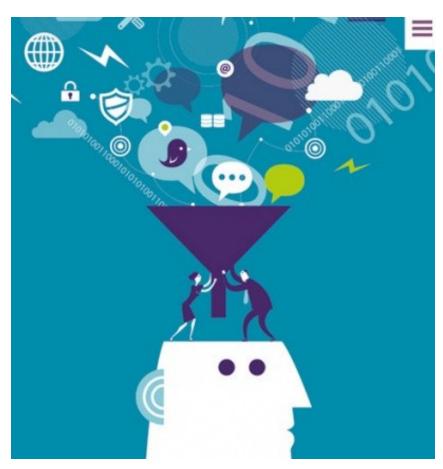


# Ciência de Dados Aplicada à Saúde Código: IAA019

# Introdução: Big Data e Inovação em Saúde

Mauro Castro





Thomson Reuters, 24 Jun 2015.

< https://blogs.thomsonreuters.com/ >

 Big Data e o gargalo da análise!

"Dataficação" de tudo!





- Marr B. *Forbes*, MAR 15, 2016.
- < http://www.forbes.com/ >

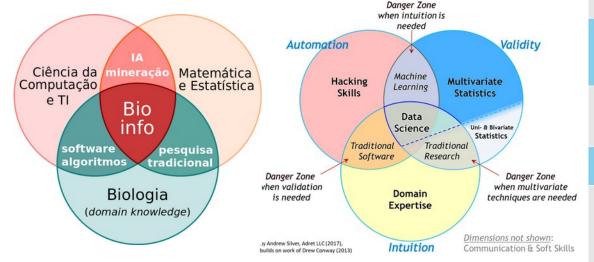
- O volume de dados continuará a crescer!
- A carência de pessoal vai expandir.
- Dados rápidos e acionáveis substituirão o Big Data.

### Why Data Scientists Aren't Data Engineers.

Walch, K. *Forbes*, Dec 1, 2019.

< http://www.forbes.com/ >





Cientista de Dados Engenheiro de Dados

### **Foco**

Cria e testa hipóteses; Analisa e traduz dados "limpos"! Desenha, constrói e organiza dados a serem processados!

### **Habilidades**

Estatista e matemática avançadas Programação avançada

ML/IA

Sistemas e pipelines

Análise Programação Big Data

# Linguagens de Programação e Ferramentas

R, SAS, Python

Java, Python, Scala...

### Formação Básica

Estatística Probabilidade Matemática Algoritmos

Programação Integração Arquitetura de sistemas

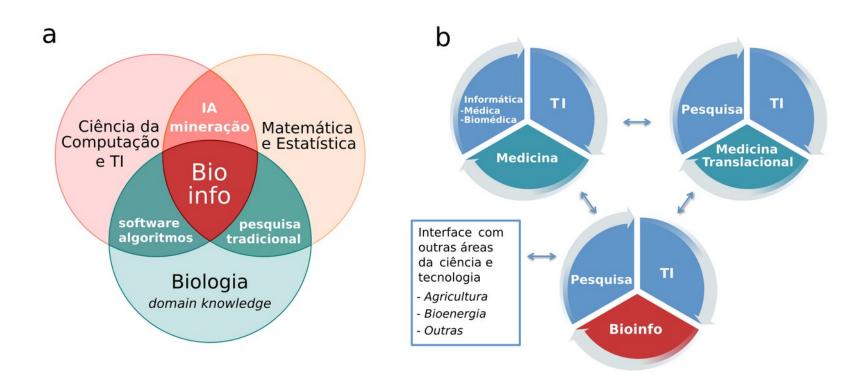
## Ciência de Dados e Bioinformática?





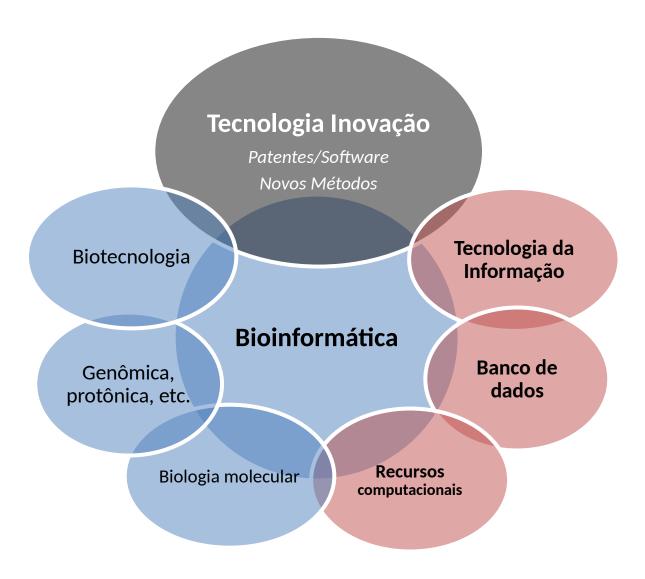


## O que é Bioinformática?



http://www.bioinfo.ufpr.br/guia-do-estudante.html

## O que é Bioinformática?



# Competências na área de ciência de dados para análise de dados biológicos

### **Biologia**

Genética
Bioquímica
Evolução
Biotecnologia
Biologia Celular
Biologia Molecular
Biofísica
Genômica
Transcriptômica
Proteômica
Biologia de Sistemas
Outras

### Ciência da Computação

Algoritmos e Programação Banco de Dados Inteligência Artificial Aprendizado de Máquina Outras

### Matemática/Estatística

Probabilidade Estatística Bioestatística Matemática biológica Outras

### Outras Ciências, e.g

Física Química

### Outros requisitos, e.g

Seminários Pesquisa Estágios

### Não-científicos, e.g

Ética Empreendedorismo Escrita/comunicação

Welch et al., PLOS Computational Biology, Vol. 10, Issue 3, 2014.



#### Message from ISCB

# Bioinformatics Curriculum Guidelines: Toward a Definition of Core Competencies

Lonnie Welch<sup>1</sup>\*, Fran Lewitter<sup>2</sup>, Russell Schwartz<sup>3</sup>, Cath Brooksbank<sup>4</sup>, Predrag Radivojac<sup>5</sup>, Bruno Gaeta<sup>6</sup>, Maria Victoria Schneider<sup>7</sup>

1 School of Electrical Engineering and Computer Science, Ohio University, Athens, Ohio, United States of America, 2 Bioinformatics and Research Computing, Whitehead Institute, Cambridge, Massachusetts, United States of America, 3 Department of Biological Sciences and School of Computer Science, Carnegie Mellon University, Pittsburgh, Pennsylvania, United States of America, 4 European Molecular Biology Laboratory, European Bioinformatics Institute, Wellcome Trust Genome Campus, Hinxton, Cambridge, United Kingdom, 5 School of Informatics and Computing, Indiana University, Bloomington, Indiana, United States of America, 6 School of Computer Science and Engineering, The University of New South Wales, Sydney, New South Wales, Australia, 7 The Genome Analysis Centre, Norwich Research Park, Norwich, United Kingdom



The skill sets required for success in the field of bioinformatics are considered by several authors: Altman [2] defines five broad areas of competency and lists key technologies; Ranganathan [3] presents highlights from the Workshops on Education life sciences curricula. Pevzner and Shamir [11] propose that undergraduate biology curricula should contain an additional course, "Algorithmic, Mathematical, and Statistical Concepts in Biology." Wingren and Botstein [12] present a graduate Computational Biology
Programming
Machine Learning
Data structure
Genetics

Biochemistry Molecular Biology

Math/Statistics
Probability
Biostatistics

**Other Sciences** 

#### **Bioinformatics User**



Leon

### **Bioinformatics Scientist**



Martha

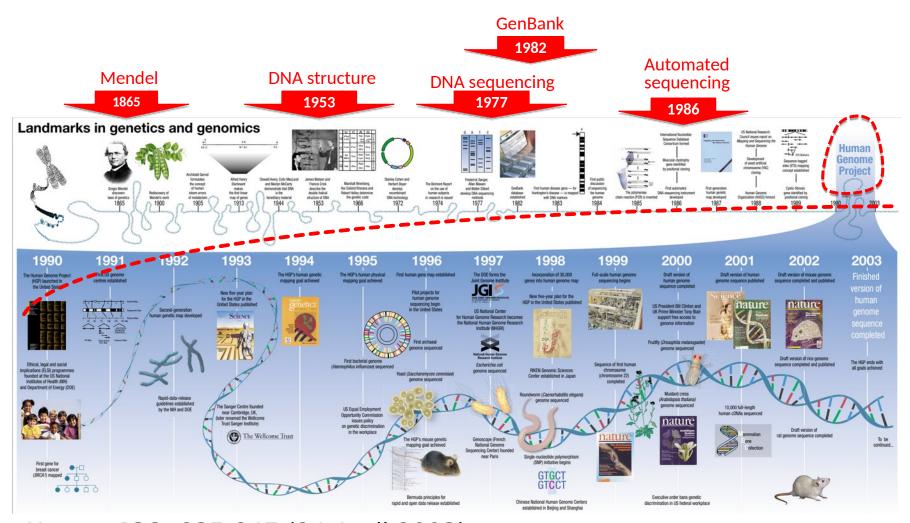
### **Bioinformatics Engineer**



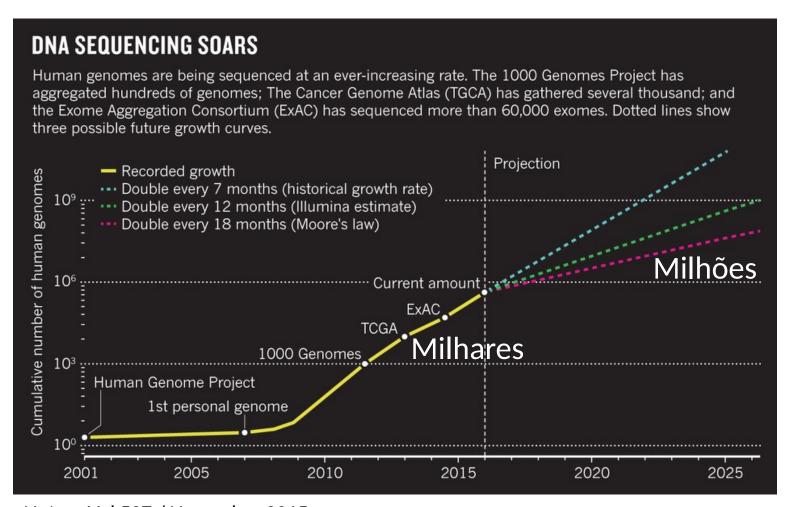
Ivan

Welch et al., PLOS Computational Biology, Vol. 10, Issue 3, 2014.

# A vision for the future of genomics research ...back then 2003!



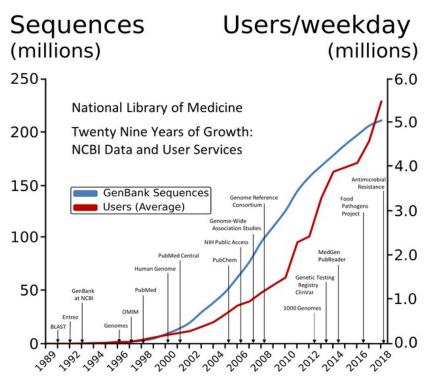




Nature Vol 527 / November 2015



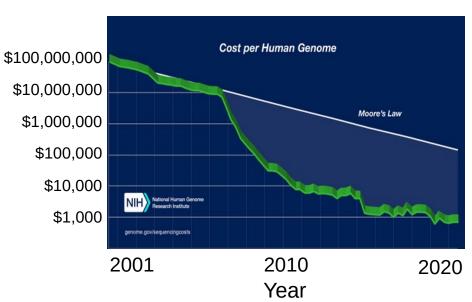
Big Data no GeneBank
 (1989 – 2019)



Year (adapted from the HHS/NIH)

<a href="https://www.nlm.nih.gov/about/2021CJ\_NLM.pdf">https://www.nlm.nih.gov/about/2021CJ\_NLM.pdf</a> Accessed [03 May 2021]

 Estimativa de custo por genoma (2001 – 2020)



Wetterstrand KA. DNA Sequencing Costs: Data from the NHGRI Genome Sequencing Program (GSP). <www.genome.gov/sequencingcostsdata> Accessed [03 May 2021].







#### RESEARCH ARTICLE

#### CANCER

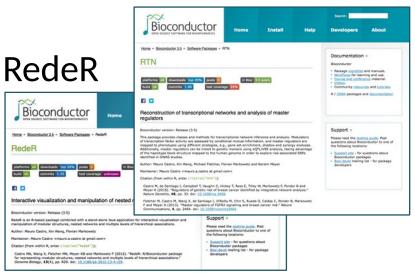
# The chromatin accessibility landscape of primary human cancers

M. Ryan Corces<sup>1\*</sup>, Jeffrey M. Granja<sup>1,2,3\*</sup>, Shadi Shams<sup>1</sup>, Bryan H. Louie<sup>1</sup>, Jose A. Seoane<sup>2,4,5</sup>, Wanding Zhou<sup>6</sup>, Tiago C. Silva<sup>7,8</sup>, Clarice Groeneveld<sup>9</sup>, Christopher K. Wong<sup>10</sup>, Seung Woo Cho<sup>1</sup>, Ansuman T. Satpathy<sup>1</sup>, Maxwell R. Mumbach<sup>1,2</sup>, Katherine A. Hoadley<sup>11</sup>, A. Gordon Robertson<sup>12</sup>, Nathan C. Sheffield<sup>13</sup>, Ina Felau<sup>14</sup>, Mauro A. A. Castro<sup>9</sup>, Benjamin P. Berman<sup>7</sup>, Louis M. Staudt<sup>14</sup>, Jean C. Zenklusen<sup>14</sup>, Peter W. Laird<sup>6</sup>, Christina Curtis<sup>2,4,5</sup>, The Cancer Genome Atlas Analysis Network<sup>†</sup>, William J. Greenleaf<sup>1,2,3,15,16</sup>; Howard Y. Chang<sup>1,2,17,18</sup>;

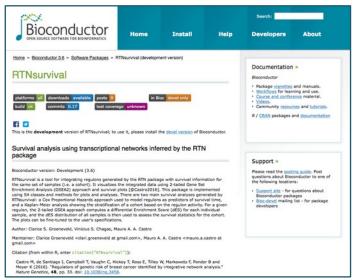
Corces et al. Science, 362(6413):eaav1898, 2018.



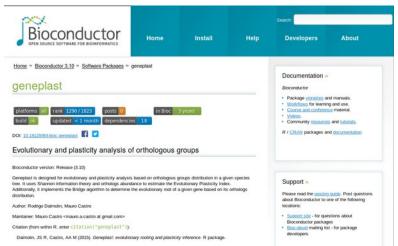
### **RTN**



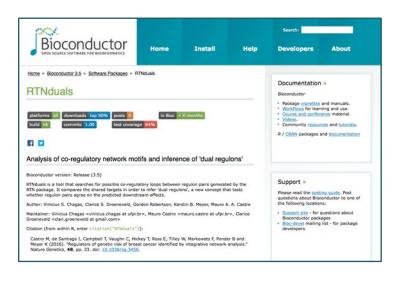
## **RTNsurvival**



## Geneplast

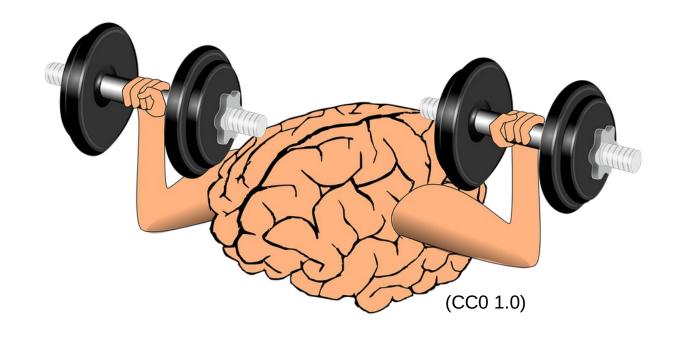


### **RTNduals**











https://imgflip.com/i/4yqmqt



# Obrigado!



Mauro Castro mauro.castro@ufpr.br