

LGN 5822 - Biometrical Genetics

## L01a – Introduction

Michele Jorge Silva Siqueira

2023

## Outline

- Who am I?
- Course content
- Reproducibility
- Approach for the course
- Exams

Who am I?

Professor Ph.D Michele Jorge Silva Siqueira

Department of Genetics, ESALQ/USP

## Schedule

- 16/08 - Introduction to Biometrics and Matrix Algebra
- 23/08 – No class - Brazilian Congress of Plant Breeding
- 30/08 - Introduction to R
- 06/09 – No class
- 13/09 - Hypothesis Testing
- 20/09 - Linear Models
- 27/09 - Linear Mixed Models
- 04/10 - Principles of Experimental Design
- 11/10 – No class
- 18/10 - First Exam

# LGN 5822 - Biometrical Genetics

- 25/10 - Completely Randomized Design / Randomized Complete Block and Factorial Designs
- 01/11 - No class
- 08/11 - Latin Square and Split Plot Designs / Incomplete Block
- 15/11 - No class
- 22/11 – Lattice Designs / Augmented Designs
- 29/11 – Modeling of Genetic Correlations (Multi-Environment and Multi-Trait Analysis)
- 06/12 - Classroom Presentation: Practical Assignment – LGN5822

I will evaluate you:

- Exams;
- Weekly exercises with deadlines: Everything on the Forum (open to the web).

## Reproducibility

- We will use tools allowing reproducibility;
- We will share data, codes, etc (videos,...)
- Try R and RStudio.

## This course

Deductive approach: General rule → Specific examples → Practice

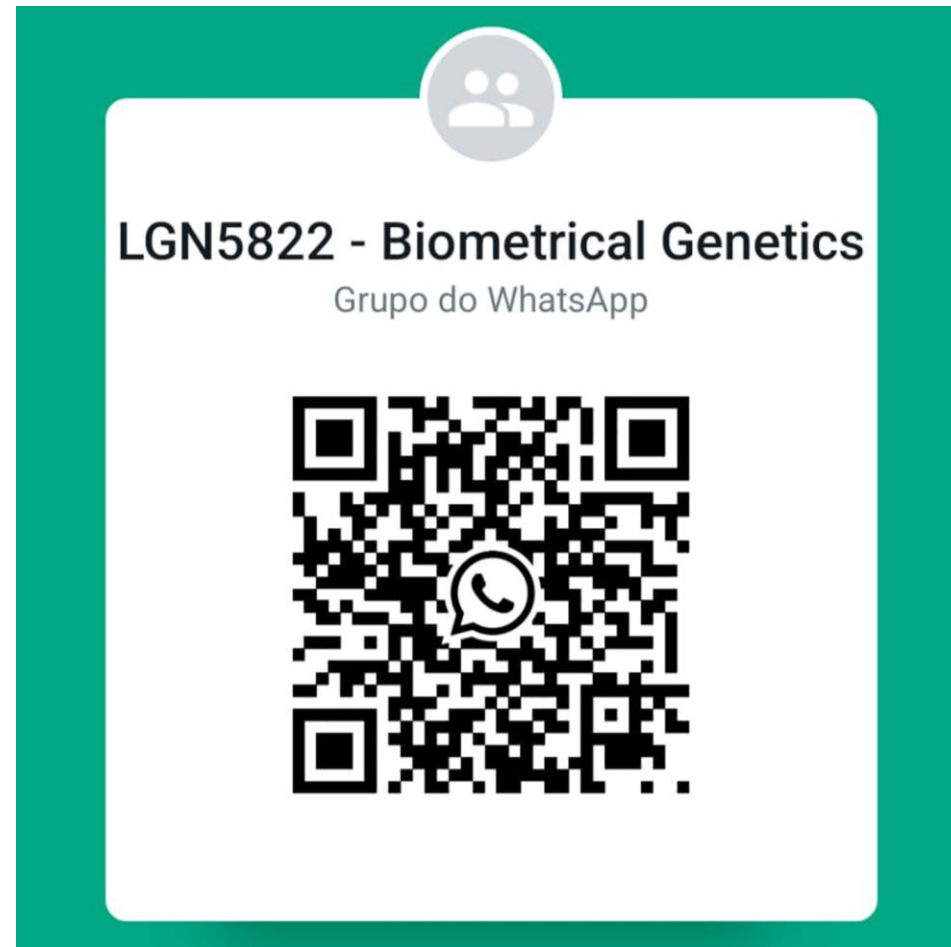
*"Learn continually - there's always "one more thing" to learn!"*

Steve Jobs



We will be in touch!

- WhatsApp group



<https://chat.whatsapp.com/JDRqoyuNHWw29hb3KbUtfT>

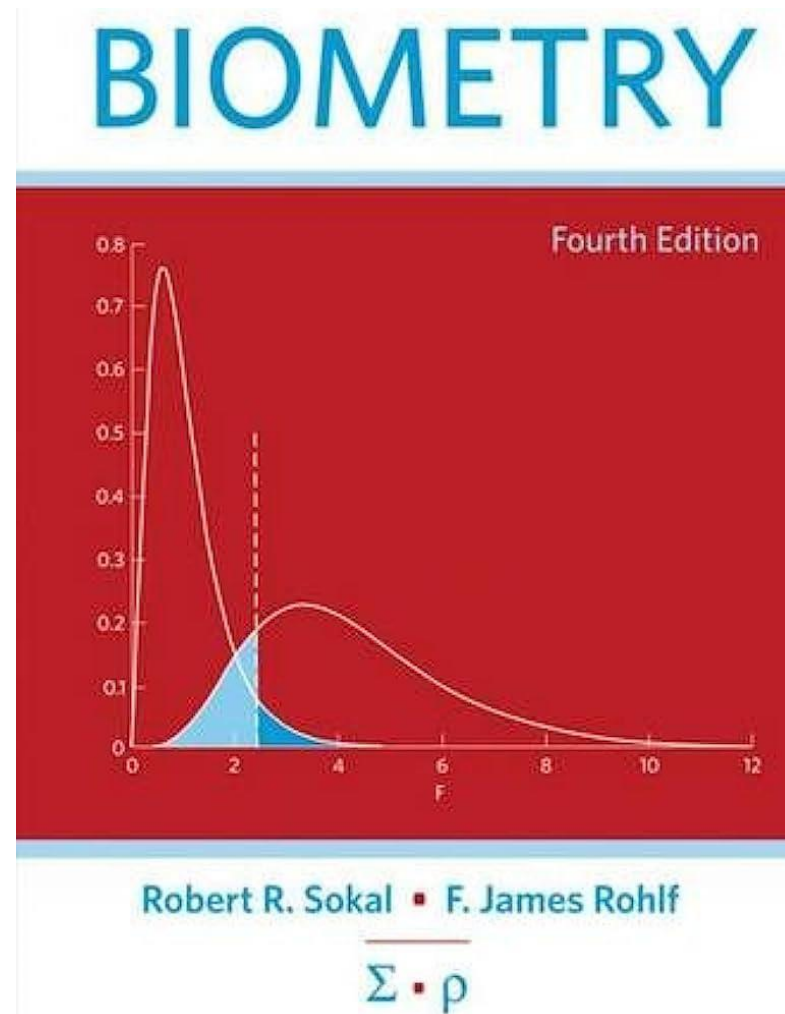
We will be in touch!

- Moodle USP: LGN5822

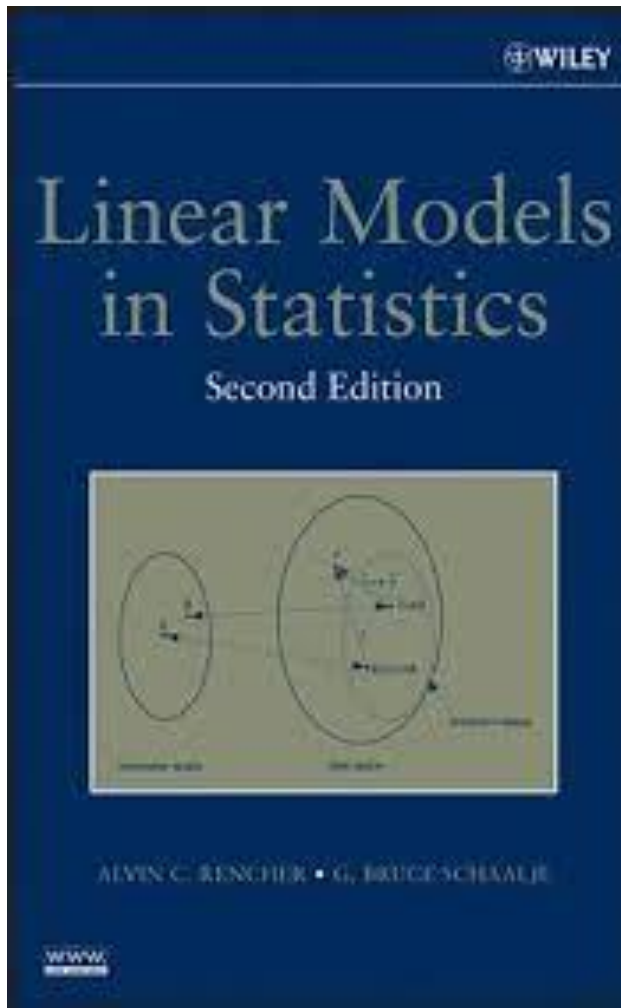
Check! I need USP number to add you!

You must participate!

# Introduction to Biometrics



Sokal, Robert R. "The principles and practice of statistics in biological research." *Biometry* (2012): 451-554.



Rencher, Alvin C., and G. Bruce Schaalje. Linear models in statistics. John Wiley & Sons, 2008.

## Purpose of discipline

To understand the use of **biometrics** with particular emphasis on agricultural and biological design, analysis, and interpretation experiments.

# LGN 5822 - Biometrical Genetics



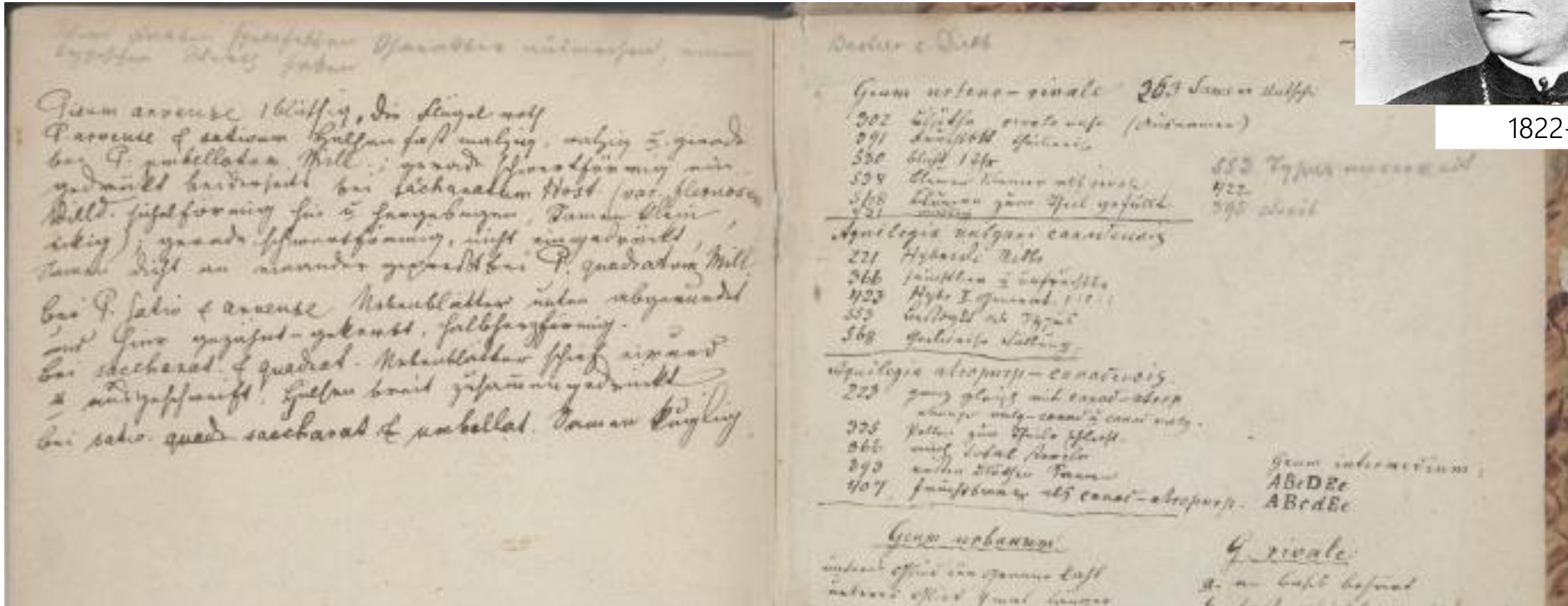
# Introduction to Biometrics

# Introduction to Biometrics

1865 – Gregor Mendel



1822-1884



Notes on the end page of Mendel's copy



# Introduction to Biometrics

1865 – Gregor Mendel

From Mendel's laws, we discovered how the factors responsible for inheritance of the simplest traits were transmitted;

## 1865 – Gregor Mendel

- **Mendel's First Law**, states that during gamete formation, the two alleles at a gene locus segregate from each other; each gamete has an equal probability of containing either allele
- **Mendel's 2nd law** states that during gamete formation the segregation of each gene pair is independent of other pairs



PERSPECTIVE

<https://doi.org/10.1038/s41588-022-01109-9>

nature  
genetics



## How did Mendel arrive at his discoveries?

Peter J. van Dijk <sup>1</sup> , Adrienne P. Jessop<sup>2</sup> and T. H. Noel Ellis <sup>3</sup>

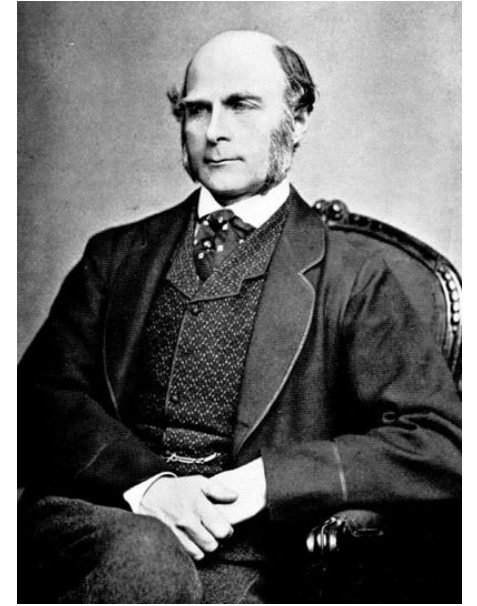
**There are few historical records concerning Gregor Johann Mendel and his work, so theories abound concerning his motivation. These theories range from Fisher's view that Mendel was testing a fully formed previous theory of inheritance to Olby's view that Mendel was not interested in inheritance at all, whereas textbooks often state his motivation was to understand inheritance. In this Perspective, we review current ideas about how Mendel arrived at his discoveries and then discuss an alternative scenario based on recently discovered historical sources that support the suggestion that Mendel's fundamental research on the inheritance of traits emerged from an applied plant breeding program. Mendel recognized the importance of the new cell theory; understanding of the formation of reproductive cells and the process of fertilization explained his segregation ratios. This interest was probably encouraged by his friendship with Johann Nave, whose untimely death preceded Mendel's first 1865 lecture by a few months. This year is the 200th anniversary of Mendel's birth, presenting a timely opportunity to revisit the events in his life that led him to undertake his seminal research. We review existing ideas on how Mendel made his discoveries, before presenting more recent evidence.**

van Dijk, Peter J., Adrienne P. Jessop, and TH Noel Ellis. Nature Genetics 54.7 (2022): 926-933

# Introduction to Biometrics

## 1886 - Francis Galton

- The field of biometry began with Francis Galton's work on how human characteristics, particularly height, were passed from parents to children.



1822-1911

- Galton's ancestral law states that the **two parent** contribute between them **one-half** of the total heritage of children, the **four grandparents one-quarter**, and so on.

the experimental value of the last three or four figures? The specific gravity of each species relative to water is given as usual, so that the reference to hydrogen is only an additional torment for the learner. We doubt too the wisdom of explaining specific and atomic heats, and giving lists of their values. Isomorphism and pseudomorphism are hopelessly confused and interchanged on p. 20, while the illustrative formula is quite unintelligible. The adjusting apparatus of the ungraduated goniometer is, as usual in text-books, wrongly disposed for use. We have noticed several mistakes of fact and errors of printing; but the book is neat in style, and perhaps will not do much harm.

*The Prospector's Handbook.* By J. W. Anderson, M.A., F.R.G.S. 8vo, pp. 132. (London: Crosby Lockwood and Co., 1886.)

THE author, after traversing the mineral fields of New Zealand, New Caledonia, New Mexico, and Colorado, feels convinced that some simple guide or handbook for the use of prospectors as well as travellers is a desideratum, and the present volume is the outcome of this conviction. It contains a number of notes or paragraphs upon subjects incidental to metallic mining, which are distributed into chapters under the different heads of prospecting, rocks, blowpipe-testing, character of minerals, metals, and metallic ores, other useful minerals and ores, composition of various rocks, testing by the wet process, assay of ores, and surveying; to which are added an appendix of tables and a glossary of terms. As the whole text is contained in rather more than a hundred pages, not very closely printed, it will be easily understood that no one of the numerous subjects included in the author's programme is very thoroughly treated. The best part of the book is the introductory chapter on

## LETTERS TO THE EDITOR

*[The Editor does not hold himself responsible for opinions expressed by his correspondents. Neither can he undertake to return, or to correspond with the writers of, rejected manuscripts. No notice is taken of anonymous communications.]*

*[The Editor urgently requests correspondents to keep their letters as short as possible. The pressure on his space is so great that it is impossible otherwise to insure the appearance even of communications containing interesting and novel facts.]*

### Hereditary Stature

PERMIT me to correct one word in my memoir on "Hereditary Stature" in the last number of NATURE (p. 297, col. 1, line 6 from bottom), which should read "seven" on an average. I should be glad at the same time to amplify the passage in which it occurs, as follows:—

The chance that the stature of the son will at least rival the stature of the father, is not uniform; it varies with the height of the father. When he is of mediocre stature, that is, 5 feet 8½ inches, out of every 100 sons born to a group of fathers of that height, 50 will be taller and 50 will be shorter than their fathers (the practically impossible case of absolute equality being neglected). Here then the chance of which we are speaking = 50 per cent. When the father is tall, the chance in question diminishes; when he is very tall, say 6 feet 5 inches, the chance is reduced to seven per thousand. The following table shows the probabilities in various cases. Columns A contain the height of the fathers, Columns B show how many per cent. of the sons will rival or surpass the height of their fathers:—

A		B		A		B		A		B	
ft.	in.	per cent.	ft.	in.	per cent.	ft.	in.	per cent.	ft.	in.	per cent.
5	8½	50	6	0	15	6	4	1·4	6	4	1·4
5	9	42	6	1	9	6	5	0·7	6	5	0·7
5	10	31	6	2	5	6	6	0·3	6	6	0·3
5	11	22	6	3	3						

FRANCIS GALTON

### Deposits of the Nile Delta

# Introduction to Biometrics

## 1903 - Pearson and Lee

VOLUME II

NOVEMBER, 1903

No. 4

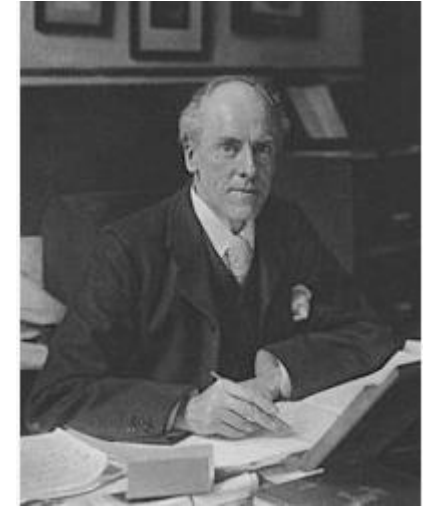
### ON THE LAWS OF INHERITANCE IN MAN\*.

#### I. INHERITANCE OF PHYSICAL CHARACTERS.

By KARL PEARSON, F.R.S., assisted by ALICE LEE, D.Sc.  
University College, London.

#### CONTENTS.

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1857-1936

Pearson later analyzed Galton's data as well as subsequent data and found that the correlation of the height of fathers and mothers with the height of their sons and daughters had a mean of 0.51.

Pearson K, Lee A (1903) On the laws of inheritance in man: I. inheritance of physical characters. *Biometrika* 2:357-462

# Introduction to Biometrics

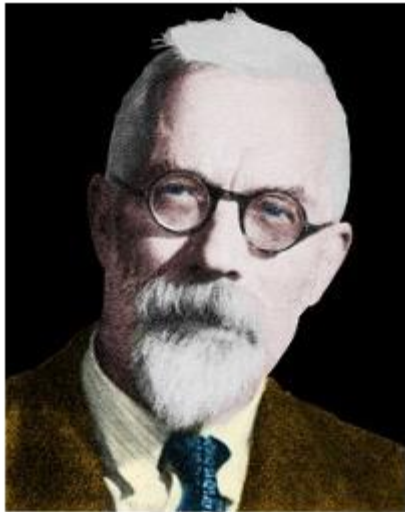
- These findings by the biometricians disagreed with Mendel's findings
- Mendel's results indicated a particulate nature of inheritance that led to distinct classes, rather than a continuum of observations for a given trait
- The absence of distinct phenotypic classes then suggested to the Mendelists that continuous traits are not heritable

- Overall, these studies by Galton and Pearson suggested that continuous variation in humans is at least partially inherited



# Introduction to Biometrics

## 1918 - Fischer: To reconcile the conflicting views of the biometricians and Mendelists



Ronald Fisher in the 1950s

XV.—The Correlation between Relatives on the Supposition of Mendelian Inheritance. By R. A. Fisher, B.A. *Communicated by Professor J. ARTHUR THOMSON.* (With Four Figures in Text.)

(MS. received June 15, 1918. Read July 8, 1918. Issued separately October 1, 1918.)

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Fisher, Ronald A. 1919 - Transactions of the Royal Society of Edinburg.

## 1918 - Fischer

- Fisher presents the conceptual model of genetics that shows that continuous variation between phenotypic traits may be the result of Mendelian inheritance
- The paper also contains the first use of the statistical term **variance**

## Quantitative Genetics

A specific area in genetics that deals with inheritance and variation of quantitative traits, which are strongly affected by the environment  
(Hallauer and Miranda Filho 1988, Vencovsky 1987).

- Has made an enormous contribution, generating valuable information placed at the service of breeders to obtain superior plants.

# Introduction to Biometrics

Welcome to the universe of biometrics!

The large amount of **data** and the need for more **appropriate analyses** required a new area of science.

This new area is called "**biometry**";

Professionals acting in this area are called "**biostatisticians**"

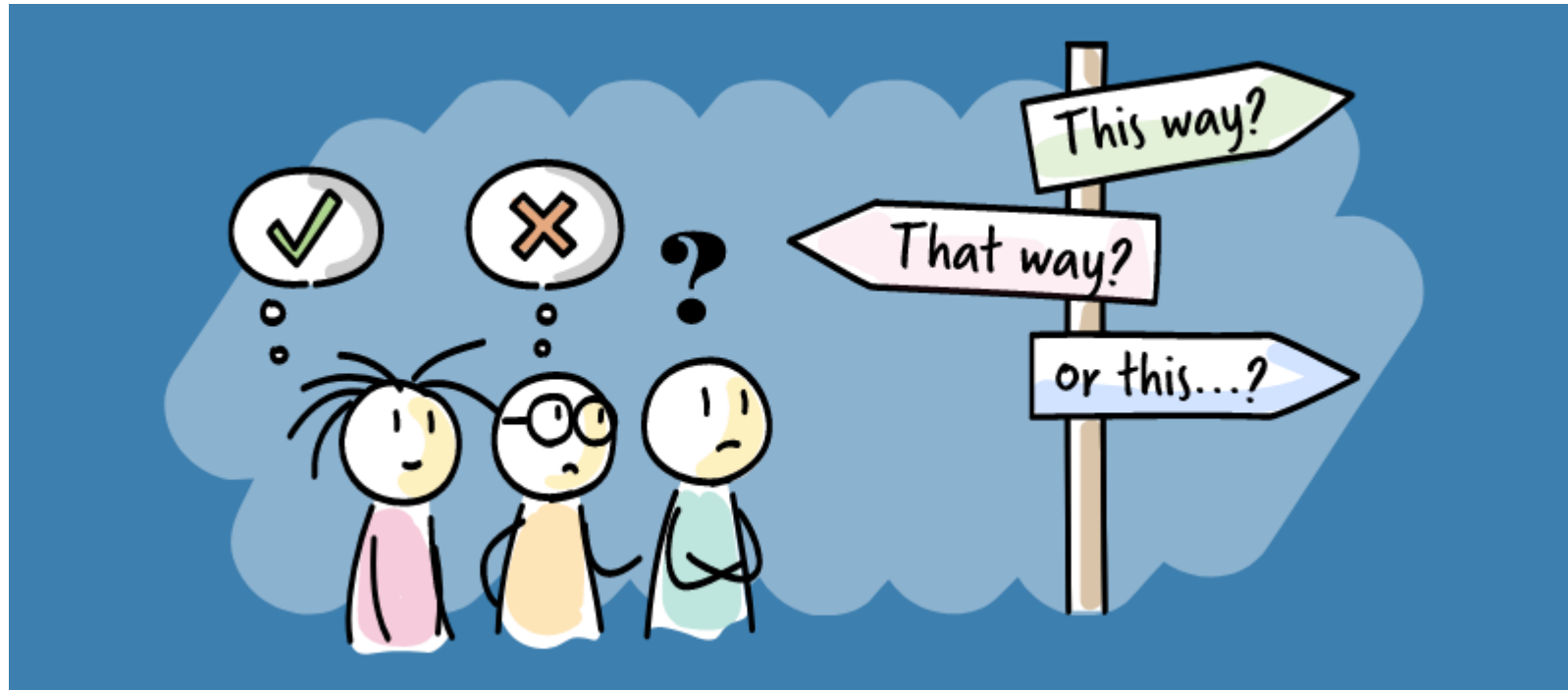
## What is Biometry?

The application of methods statistics to the solution of biological problems (Sokal and Rohlf, 1969.)

*Bios* ("life") and *metron* ("measure").

# Introduction to Biometrics

## Decision Making!



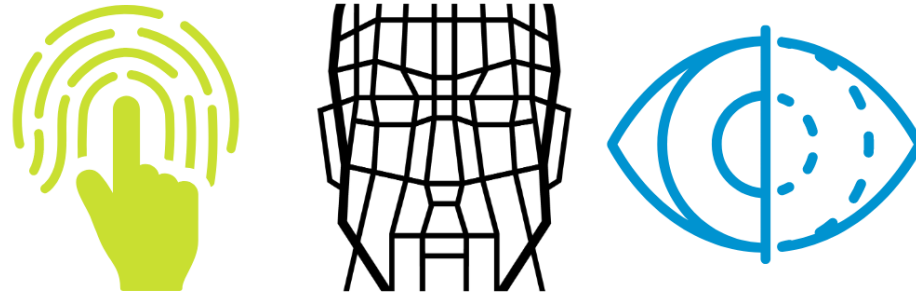
# Introduction to Biometrics

## The Best Jobs in America for 2022

	Job Title	Median Base Salary	Job Satisfaction	Job Openings	
#1	Enterprise Architect	\$144,997	4.1/5	14,021	<a href="#">View Jobs</a>
#2	Full Stack Engineer	\$101,794	4.3/5	11,252	<a href="#">View Jobs</a>
#3	Data Scientist	\$120,000	4.1/5	10,071	<a href="#">View Jobs</a>
#4	Devops Engineer	\$120,095	4.2/5	8,548	<a href="#">View Jobs</a>
#5	Strategy Manager	\$140,000	4.2/5	6,977	<a href="#">View Jobs</a>
#6	Machine Learning Engineer	\$130,489	4.3/5	6,801	<a href="#">View Jobs</a>
#7	Data Engineer	\$113,960	4.0/5	11,821	<a href="#">View Jobs</a>
#8	Software Engineer	\$116,638	3.9/5	64,155	<a href="#">View Jobs</a>
#9	Java Developer	\$107,099	4.1/5	10,201	<a href="#">View Jobs</a>
#10	Product Manager	\$125,317	4.0/5	17,725	<a href="#">View Jobs</a>

# Introduction to Biometrics

The term “**Biometrics**” has also been used to refer to the field of technology devoted to the **identification of individuals using biological traits**, such as those based on retinal or iris scanning, fingerprints, or face recognition.





## What is needed to study biometrics?

- Genetics;
- Experimental Statistics;
- Quantitative;
- Algebra;
- Programming;
- And others...

# Introduction to Biometrics

## Biometry – Knowledge guiding the selection strategy

The basic principles of **experimentation**, such as the need to conduct trials with **replication**, **randomness**, and, if necessary, **local control**, led to a revolution by providing more accurate mean values, information regarding experimental accuracy, and estimates of genetic and environmental parameters useful in guiding breeding strategies.

This is complementation between **genetic** and **statistical principles** for a common purpose.

# Introduction to Biometrics

## Biometry – Knowledge guiding the selection strategy

Breeding programs require intensive experimentation so that accurate genetic values can be obtained and used as selection criteria.

# Introduction to Biometrics

The **genetics, experimental statistics and biometry** areas have contributed a large number of models, with the purpose of ensuring the **good choice** of **genetic material** and of **establishing a predicted value** of performance of the individual or of its descendant.



### Genomic selection: genome-wide prediction in plant improvement

Zeratsion Abera Desta and Rodomiro Ortiz

Department of Plant Breeding, Swedish University of Agricultural Sciences, Sundsvagen 14, Box 101, Alnarp, SE 23053, Sweden

Association analysis is used to measure relations between markers and quantitative trait loci (QTL). Their estimation ignores genes with small effects that trigger underpinning quantitative traits. By contrast, genome-wide selection estimates marker effects across the whole genome on the target population based on a prediction model developed in the training population (TP). Whole-genome prediction models estimate all marker effects in all loci and capture small QTL effects. Here, we review several genomic selection (GS) models with respect to both the prediction accuracy and genetic gain from selection. Phenotypic selection or marker-assisted breeding protocols can be replaced by selection, based on whole-genome predictions in which phenotyping updates the model to build up the prediction accuracy.

#### Glossary

**Best linear unbiased prediction (BLUP):** a statistical approach used to estimate the breeding values of different traits.

**Breeding population (BP):** the descendants of a TP or introduced variety but related to the TP, in which they are only genotyped but not phenotyped.

**Breeding value:** the average effects of alleles in the entire loci that are anticipated to be transferred from the parent to the progeny. The breeding value measures how many of the superior alleles or genes are transferred to the progeny.

**Cross-validation:** a method used to train and develop the prediction model(s) using different sampling techniques in the TP data sets ahead of estimating the GEBVs in the BP. The greater the similarity of the correlation of the two subsets (training set and validation set) to the correlation of the true breeding values in the TP to the expected GEBVs in the BP, the higher the precision and reliability of the prediction model(s).

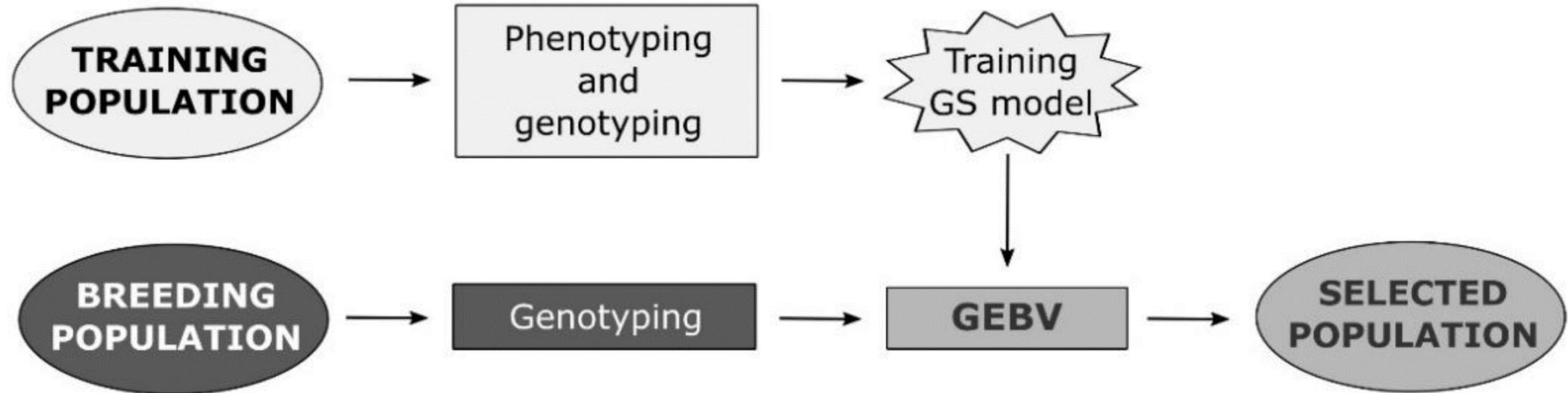
**Double haploids (DH):** synthesis of genotypes after the haploid cells have undergone artificial chromosome doubling.

**Genetic distance:** measurement of relatedness or dissimilarity between samples or populations. The larger the value of genetic distances between samples, the more divergent the samples.

# Introduction to Biometrics

## Biometry and advances: Molecular Genetics

### Genomic Selection (GS)



## Biometry and advances: Machine Learning



### Genomic Prediction of Breeding Values Using a Subset of SNPs Identified by Three Machine Learning Methods

Bo Li<sup>1,2,3</sup>, Nanxi Zhang<sup>4</sup>, You-Gan Wang<sup>5</sup>, Andrew W. George<sup>6</sup>, Antonio Reverter<sup>1</sup> and Yutao Li<sup>1\*</sup>

<sup>1</sup> CSIRO Agriculture and Food, St Lucia, QLD, Australia, <sup>2</sup> Shandong Technology and Business University, School of Computer Science and Technology, YanTai, China, <sup>3</sup> Shandong Co-Innovation Centre of Future Intelligent Computing, YanTai, China, <sup>4</sup> Centre for Applications in Natural Resource Mathematics, University of Queensland, St Lucia, QLD, Australia, <sup>5</sup> School of Mathematical Sciences, Queensland University of Technology, Brisbane, QLD, Australia, <sup>6</sup> CSIRO Data61, Dutton Park, QLD, Australia

The analysis of large genomic data is hampered by issues such as a small number of observations and a large number of predictive variables (commonly known as “large P small N”), high dimensionality or highly correlated data structures. Machine learning methods are renowned for dealing with these problems. To date machine learning

OPEN ACCESS

<https://doi.org/10.3389/fgene.2018.00237>

# Introduction to Biometrics

## Motivation

**Biometry** is an area of genetics in **continuous evolution**, which has contributed to generating information and finding solutions to diverse questions in **genetics and breeding**.





# Introduction to Biometrics

## Motivation

Biometry depends on the **critical and attentive eye of methods of data analysis** and on the algorithms that allow data processing supported by the biometric area.



# Introduction to Biometrics

## Motivation

There is an urgent need for further advances, now supported by **biometric genetics**, in the context of data processing.



## References

Sokal, Robert R. "The principles and practice of statistics in biological research." *Biometry* (2012): 451-554.

Rencher, Alvin C., and G. Bruce Schaalje. *Linear models in statistics*. John Wiley & Sons, 2008.