

The recognition of forms
and
the taxonomists



<http://time.com/5144257/fewer-scientists-studying-insects-entomology/> Fewer Scientists Are Studying Insects. Here's Why That's So Dangerous

“If you are studying a vector, or any other kind of organism, first try to recognize it”
(A. Fain, Institute of Tropical Medicine, Belgium. 1980).

Triatominae (Heteroptera, Hemiptera)
Vectors of Chagas disease



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Mexico
Guatemala
Honduras
Nicaragua
Panama
Colombia
Guianas
French Guyana
Venezuela
Ecuador
Perou
Brazil
Uruguay
Argentine
Chile



Ministério da Saúde

FIOCRUZ
Fundação Oswaldo Cruz

Centro de Pesquisas Aggeu Magalhães



“An alarming decline in the representation of taxonomy in university curricula and faculty was evident by the end of the **1980s** “... (Wheeler, 2014. Are reports of the death of taxonomy an exaggeration? New Phytologist 201 370 371)

Taxonomists: an endangered species...

The “**old guards**” of taxonomy have either retired or are retiring, many others have turned their backs on taxonomic research because of obvious and justifiable reasons, and unfortunately **new talents are nowhere in sight** mainly due to **lack of employability of taxonomists** (Jairajpuri, **1996**)

[Melissa Mert](#). 2002 Taxonomy in Danger of Extinction. News from Science.
<http://www.sciencemag.org/news/2002/05/taxonomy-danger-extinction>

“...Since 1992, **funding for systematic biology** at major research institutions in the United Kingdom **has dropped** between 15% and 25% ...”

Are We Losing the Science of Taxonomy?: As need grows, numbers and training are failing to keep up.

[Lisa W. Drew](#)

BioScience, Volume 61, Issue 12, 1 December **2011**, Pages 942–946,

“...During one recent visit to a **museum** that Mares will not name— “but it's one everyone on this planet has heard of,” he says—he found that every **one of roughly 50 specimens**, representing seven species and three genera, was **mislabeled.**”

The decline of Medical entomology...

About American and Canadian medical school curricula, a few years ago: **only 11 of 120 institutions include course content about arthropods.**

(<http://time.com/5144257/fewer-scientists-studying-insects-entomology/> Fewer Scientists Are Studying Insects. Here's Why That's So Dangerous)

Sibling species

(Ernst Mayr in 1942,)

Two species that cannot be distinguished on morphological ground.
(without necessarily any reference to the phylogenetic context).

Sibling species

([Ernst Mayr](#) in 1942,)

Two species that cannot be distinguished on morphological ground.

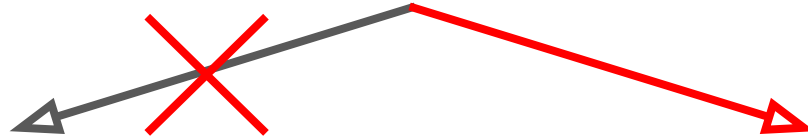
Anopheles gambiae,
~1950

- reproductive isolation between some laboratory strains
- cytogenetics could distinguish them
- Isoenzyme electrophoresis could etc.
- RFLP, RAPD, could etc.
- DNA probes could etc.

Sibling species, an ambiguous concept

([Ernst Mayr](#) in 1942,)

“...cannot be distinguished...”



“ are identical (isomorphic) “

The characters currently used do not show difference.

The concept of sibling species is a subjective, or an ambiguous one

Species recognition in insects or in other organisms may rely on characters other than the ones traditionally used by taxonomists

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The concept of sibling species, an ambiguous concept

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- were the characters quantitatively defined?

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SNEATH PH, SOKAL R. (1973). Numerical Taxonomy: The principles and practice of numerical classification. Ed. W. H. Freeman & Co., San Francisco 535pp

The concept of sibling species, an ambiguous concept

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SNEATH PH, SOKAL R. (1973). Numerical Taxonomy: The principles and practice of numerical classification. Ed. W. H. Freeman & Co., San Francisco 535pp

To be possible, numerical taxonomy requires each morphological trait to have the same weight.

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(same weight for each one)
- were the quantitative characters redundant ones ?

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(same weight for each one)
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COOLEY AL, LOHNES P. (1971). *Multivariate data analysis*. Wiley, New York. 346pp.

CHATFIELD C, COLUNGS AJ. (1980). *Introduction to multivariate analysis*. Chapman & Hall, New York. 246pp.

The concept of sibling species, an ambiguous concept

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(same weight for each one)
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LANE RP, READY PD. 1985. *Multivariate discrimination* between *Lutzomya wellcomei*, a vector of mucocutaneous leishmaniasis and *Lu. complexus* (Diptera: Phlebotominae) *Ann. Trop. Med. & Parasitol.* 79:469-47

MS. McNAMEE C. DYTAM 1993 *Morphometric discrimination of the sibling species* *Drosophila melanogaster* (Meigen) and *D. simulans* (Sturtevant) (Diptera: Drosophilidae). *Systematic Entomology* Volume 18, Issue 3

Etc.

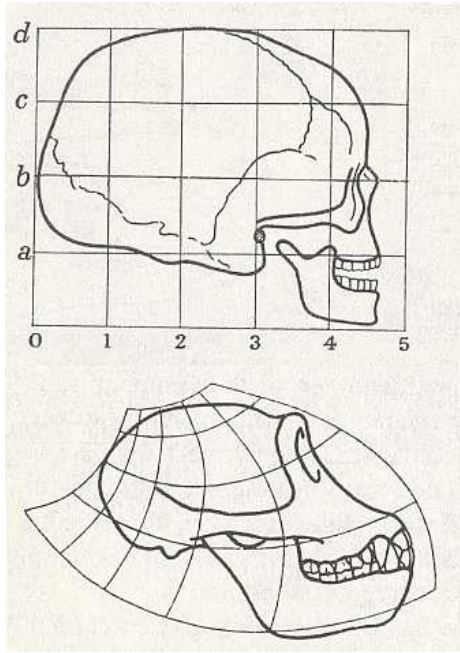
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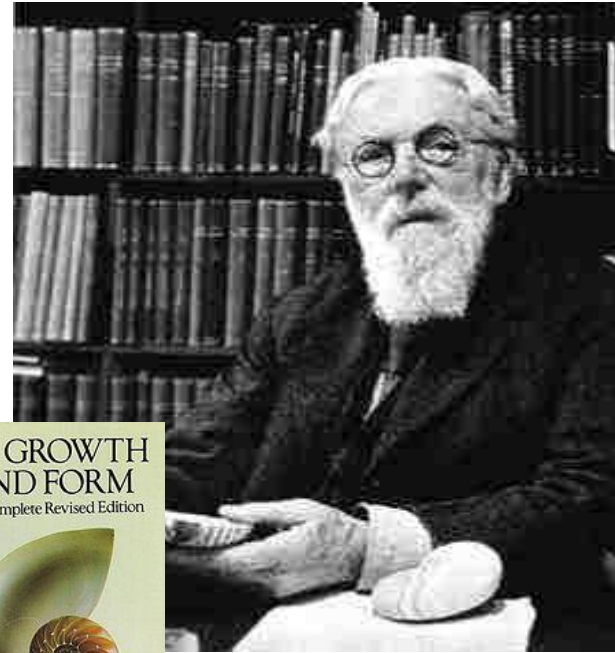
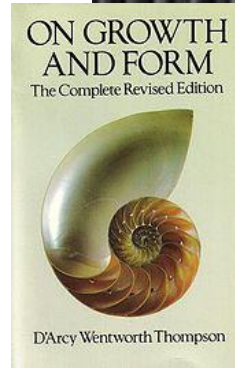
- were the characters quantitatively defined?
(same weight for each one)
- were the quantitative characters redundant ones ?
(multivariate analyses)
- were the quantitative characters completely defined?
(shape ?)

were the quantitative characters completely defined?

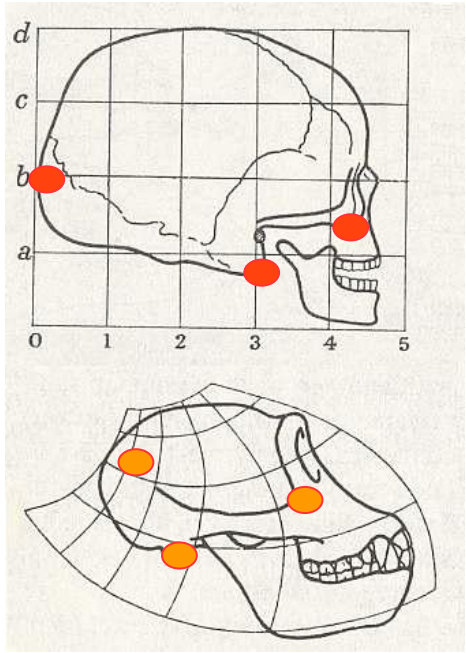
Size and **shape** !



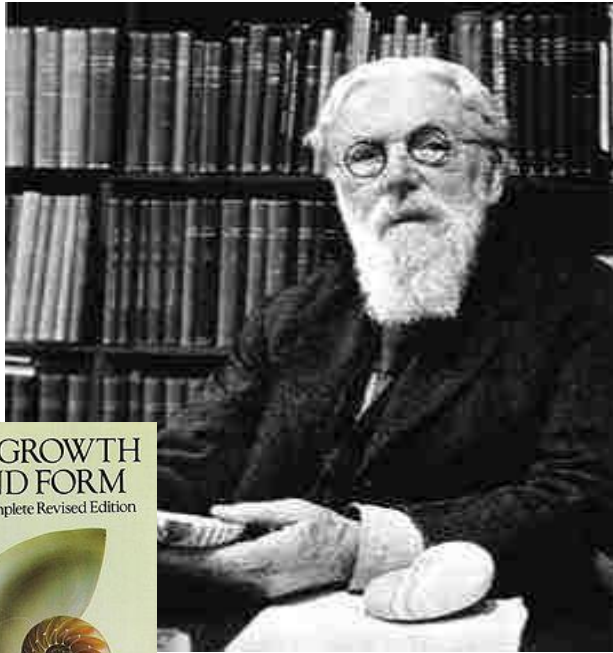
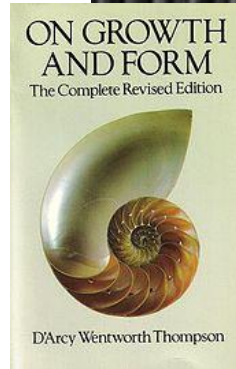
« **landmark-based** »



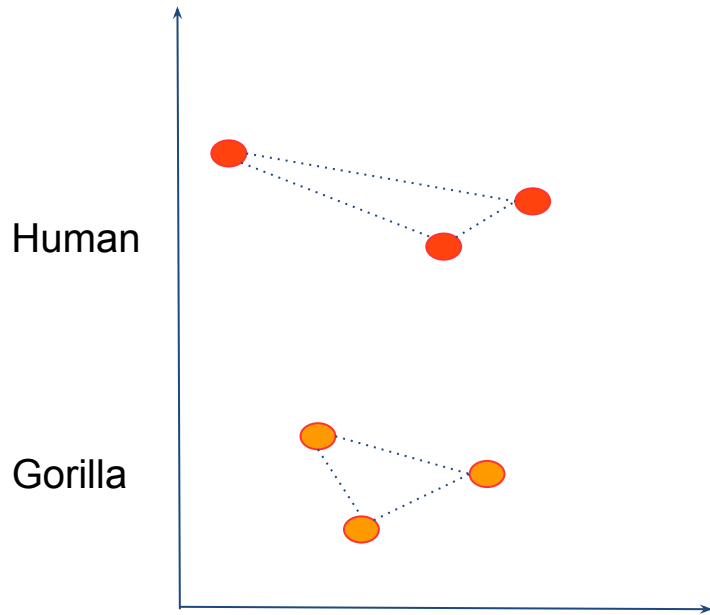
Born
2 May 1860
[Edinburgh](#)
Died 1948 (aged 88)
[St Andrews](#)
Occupation
[Mathematical biologist](#)



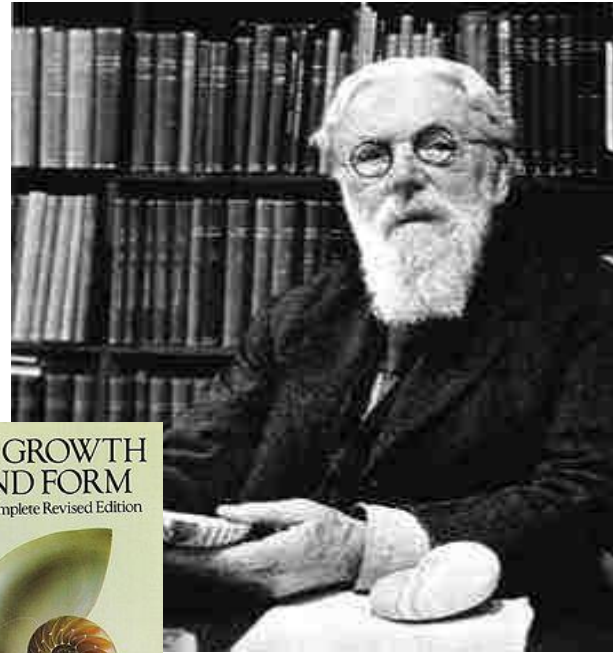
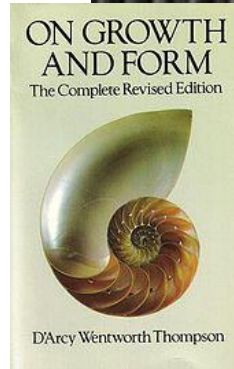
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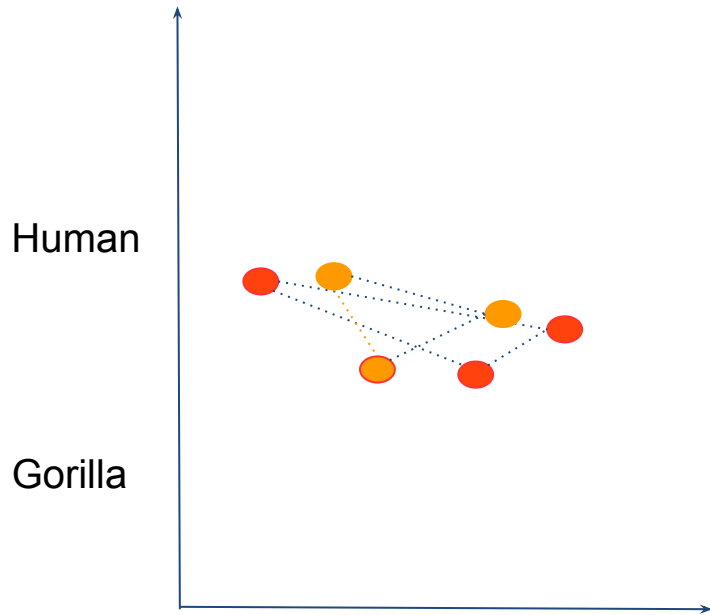
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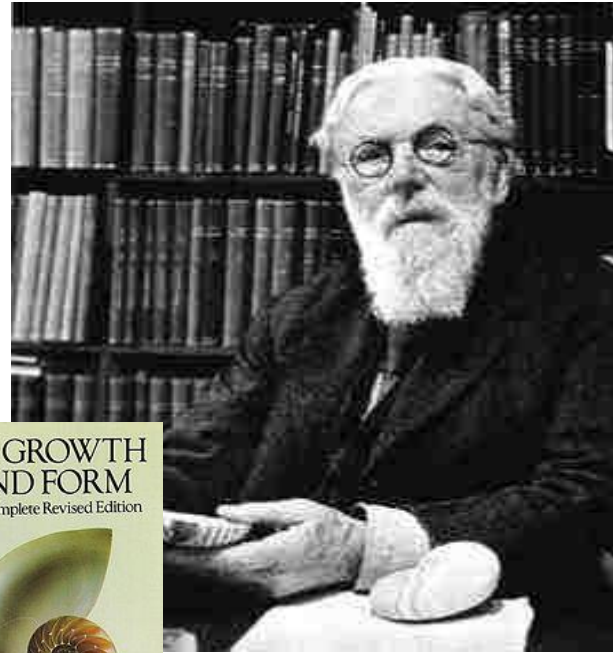
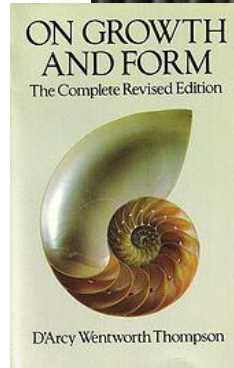
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Kendall D. G. 1984. Shape manifolds, Procrustean metrics and complex projective spaces. *Bulletin of the London Mathematical Society* 16: 81-121

Bookstein F. L. 1984. A statistical method for biological shape comparisons. *Journal of Theoretical Biology* 107: 475–520.

Bookstein F. L. 1986. Size and shape spaces for landmark data in two dimensions (with discussion). *Statistical Science* 1: 181–242.

Rohlf J. F. 1986. Relationships among eigenshape analysis, Fourier analysis, and analysis of coordinates. *Mathematical Geology* 18: 845–654.

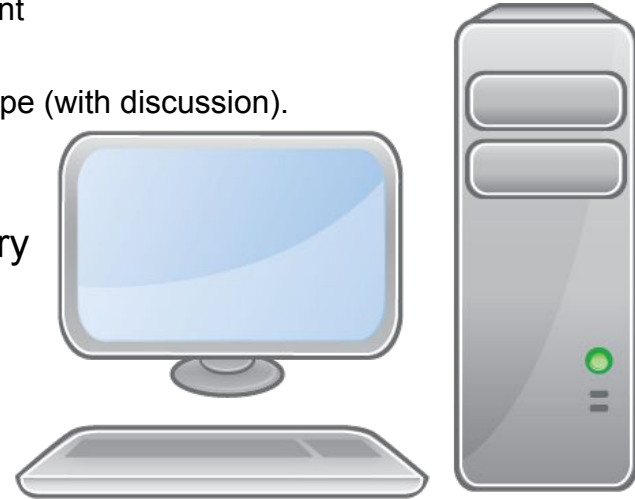
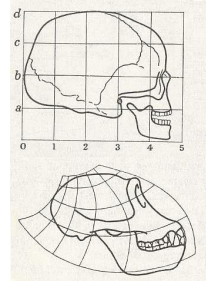
Rohlf J. F. 1999. Shape statistics: Procrustes superimposition and tangent spaces. *Journal of Classification* 16: 197–223.

Goodall C. R. 1991. Procrustes methods in the statistical analysis of shape (with discussion). *Journal of the Royal Statistical Society, Series B* 53: 285-339

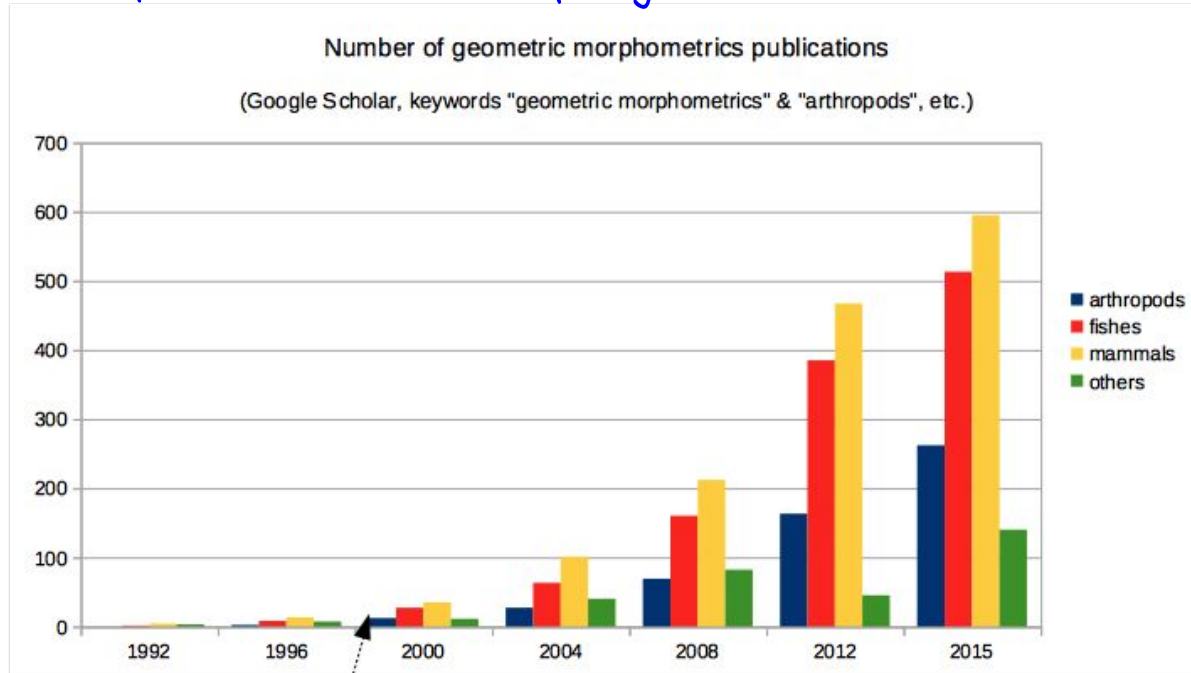
Other important names in developing techniques and theory

since 1990

Ian **Dryden**,
Kanti **Mardia**,
Dennis **Slice**,
Dean **Adams**,
... **Etc.**

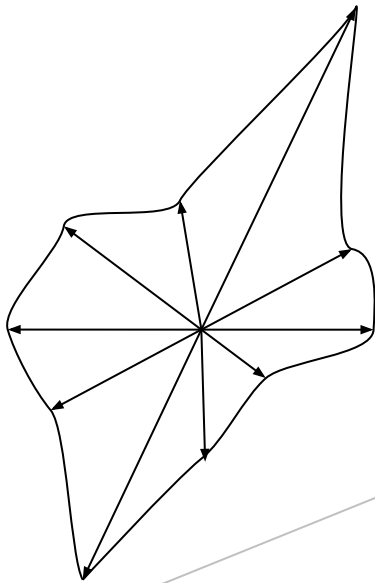


were the quantitative characters completely defined? Size and **shape** !

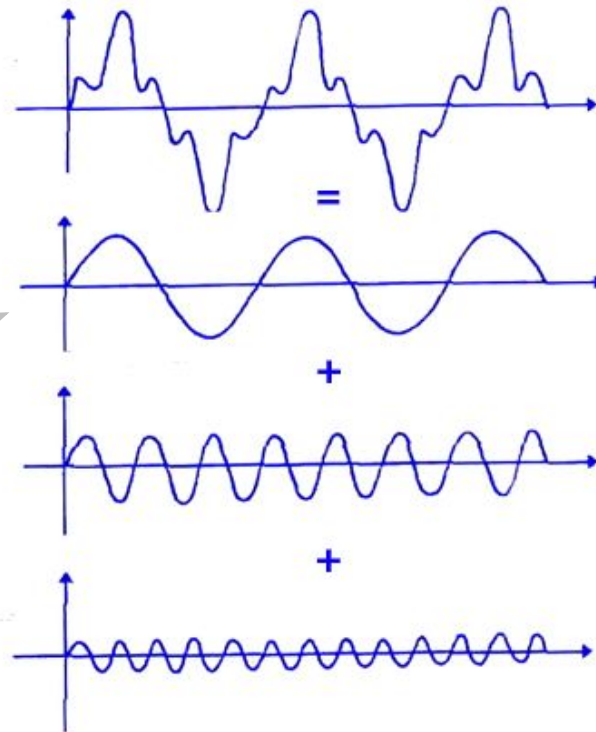


A **revolution** morphometrics. Rohlf, Marcus
Trends Ecol Evol. **1993** 8(4):129-32. doi: 10.1016/0169-5347(93)90024-J..

Geometric Morphometrics: Ten Years of Progress Following the 'Revolution'
Adams, Rohlf, Slice. Ital. J. Zool., **2004** 71:5-16.



Harmonics



Jean Baptiste Joseph Fourier (1768 – 1830) was a French physicist and mathematician who is known for investigating the Fourier series and its application to problems of heat flow.

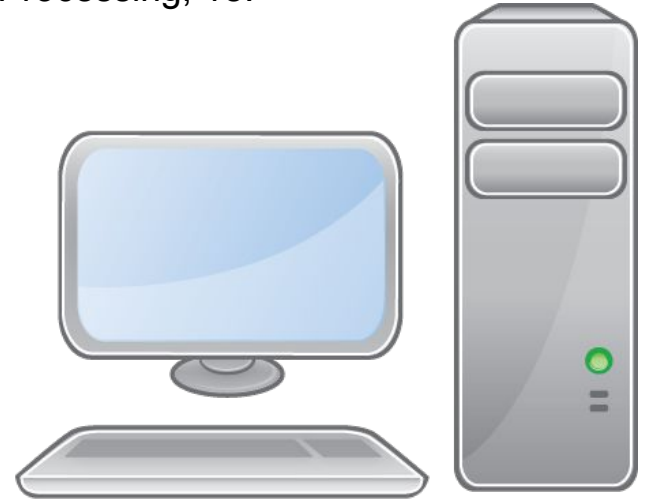
Kuhl FP and **Giardana CR**, **1982**. Elliptic Fourier features of closed contour. *Computer Vision, Graphics and Image Processing*, 18: 236-258.

Other names

Lestrel, 1987

Rohlf, 1990

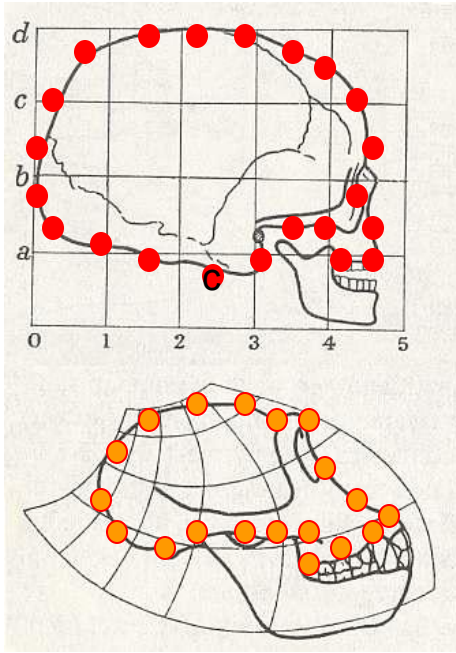
Etc.



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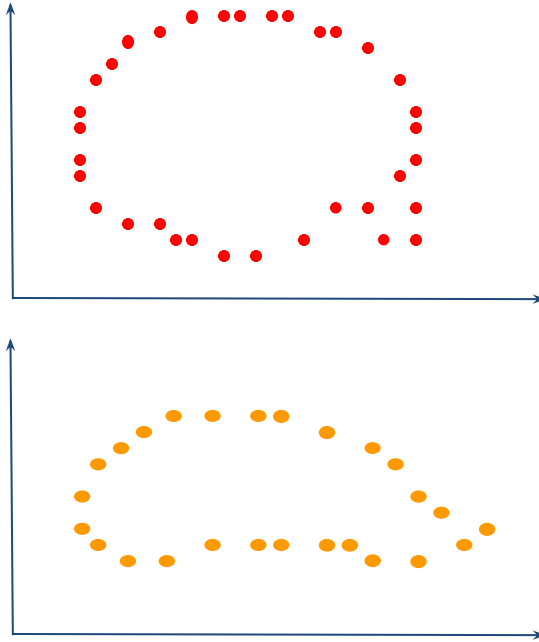


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Harmonics

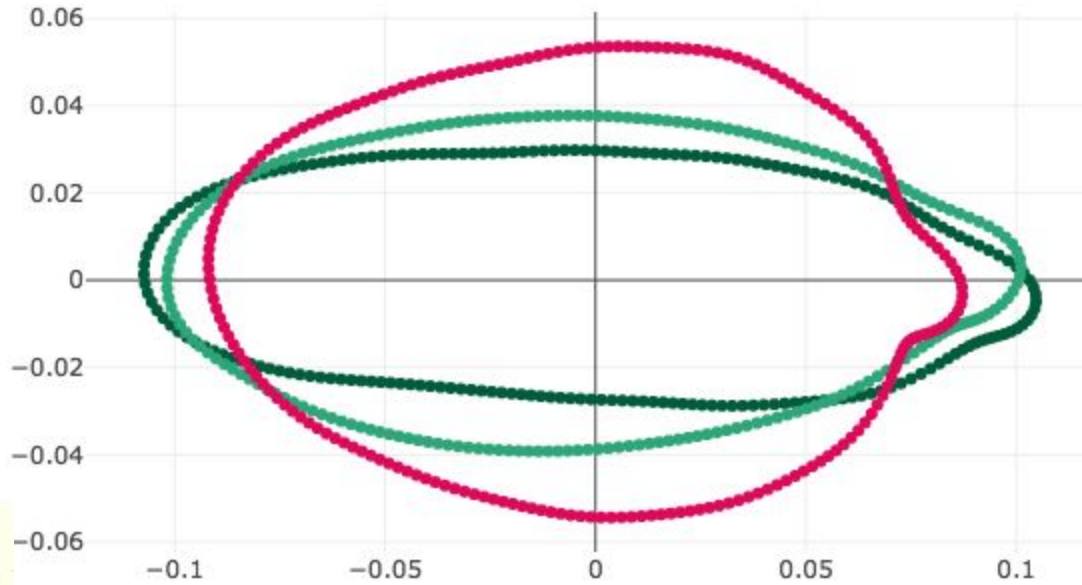


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Mean Objects



- Group 1 17 *F. gigantea*
- Group 2 9 *F. hepatica*
- Group 3 10 *F. intermedia*



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Fasciola sp.



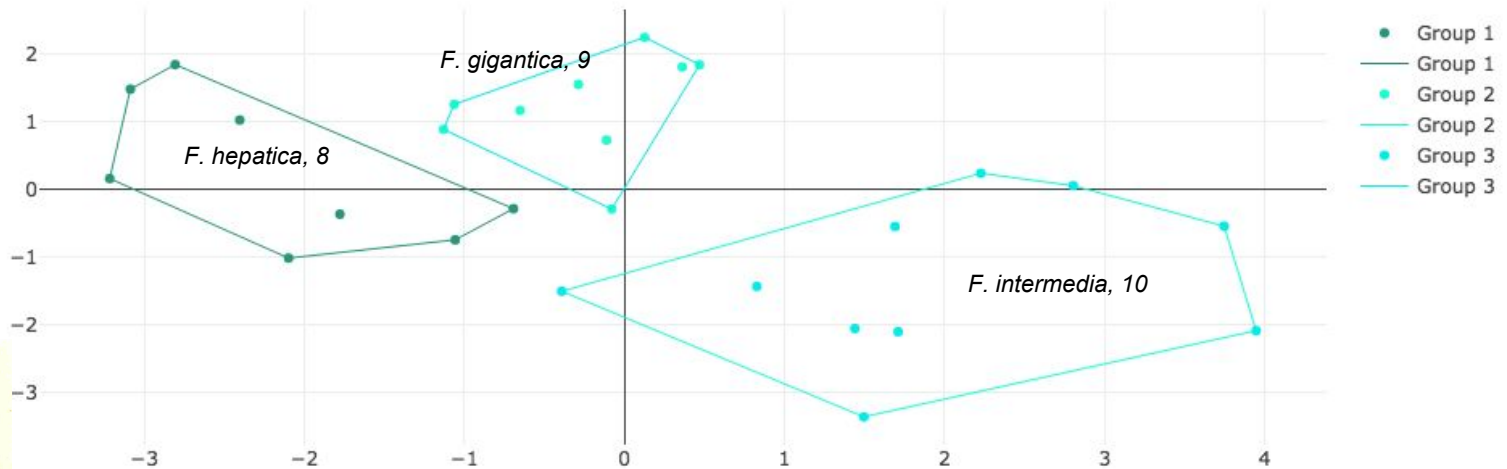
Graphical outputs

PCA GRAPHIC

DA GRAPHIC

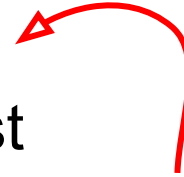
HC GRAPHIC

Discriminant Analysis



Analysis Report of 7/15/2018, 6:15:57 PM

The “**new**” taxonomist,
as opposed to the “**old**” taxonomist,
does not need to be a hyperspecialist
of the organism under study.



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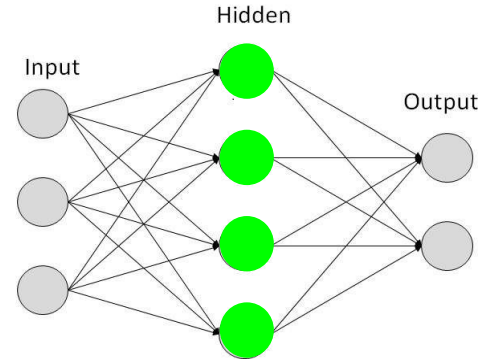
MACHINE LEARNING

-> SUPERVISED LEARNING

-> Support Vector Machine

-> **Neural Network**

-> etc. etc.



MACHINE LEARNING

**Known
data**

species **A**, species **B**,
etc.

MACHINE LEARNING

**Known
data**

species **A**, species **B**,
etc.

Quantitative data

(Morphometric data)

- size
- log-shape ratios
- coordinates after geometric processing
- etc.

(Other kind of data)

- GPS coordinates
- Etc.

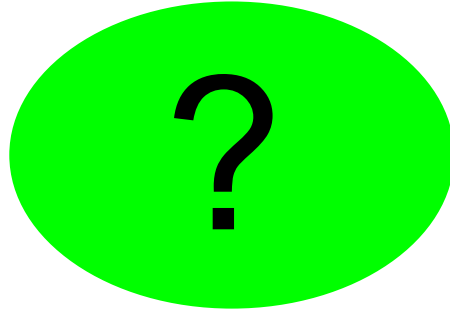
Quantitatively coded data

- present/absent
- frequencies

MACHINE LEARNING

Known data = Reference data

species **A**, species **B**, etc.



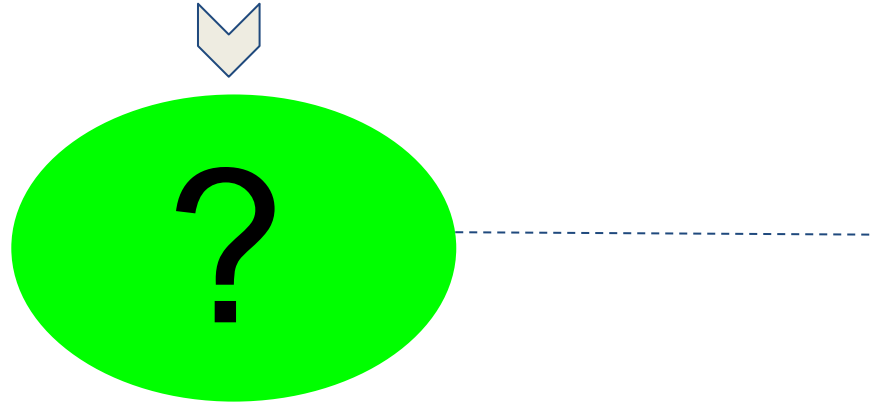
MACHINE LEARNING

Known data = Reference data

species **A**, species **B**, etc.

**Unknown
data**

species ??



MACHINE LEARNING

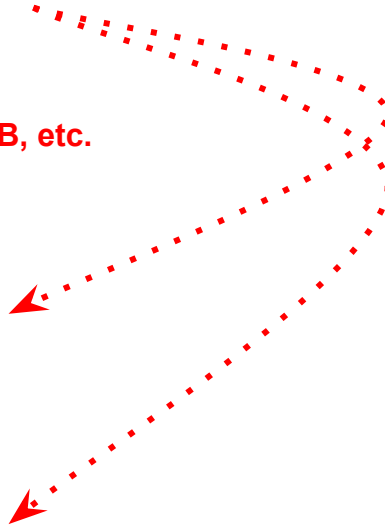
**Reference
data**

species A, species B, etc.

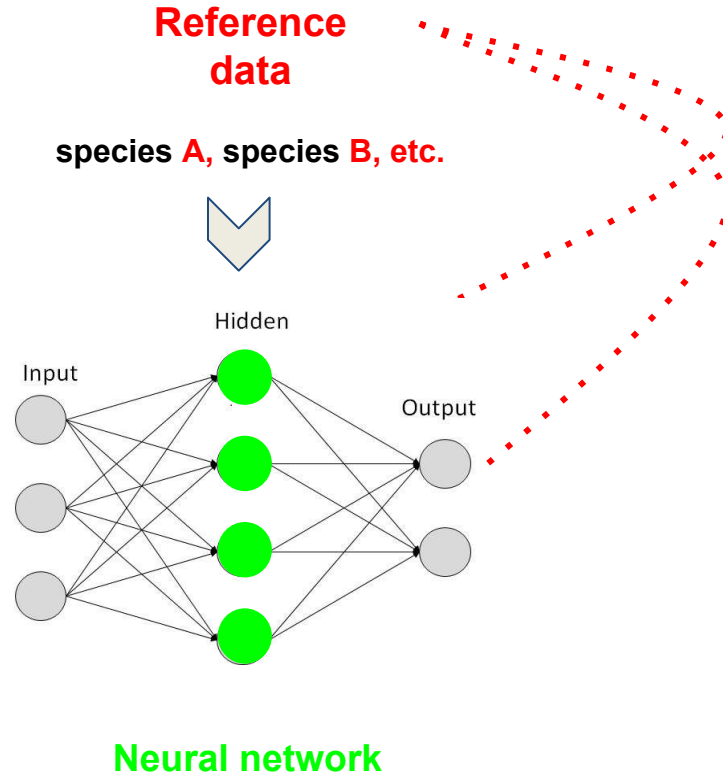


Training set

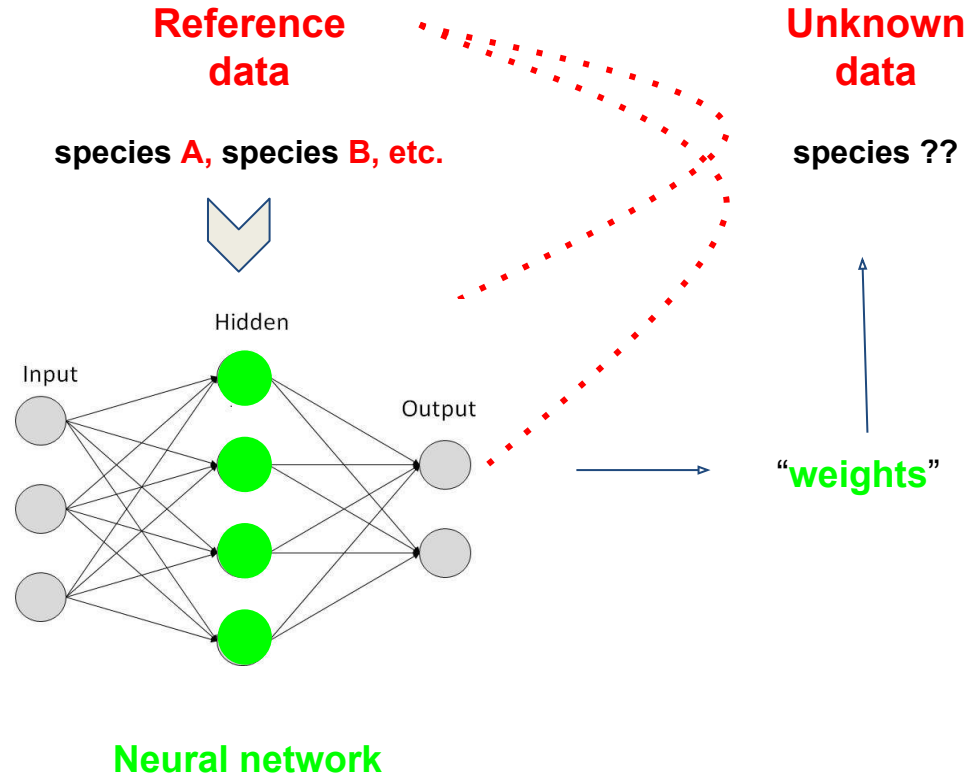
Testing set



MACHINE LEARNING / NEURAL NETWORK



MACHINE LEARNING / NEURAL NETWORK



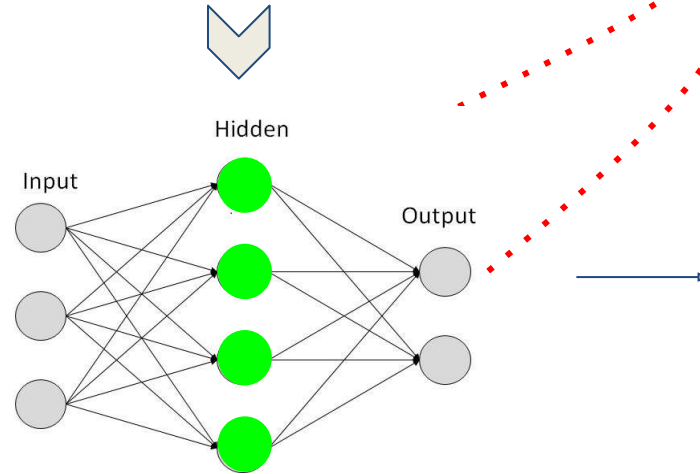
MACHINE LEARNING / NEURAL NETWORK

Reference data

species A, species B, etc.

Unknown data

species ??



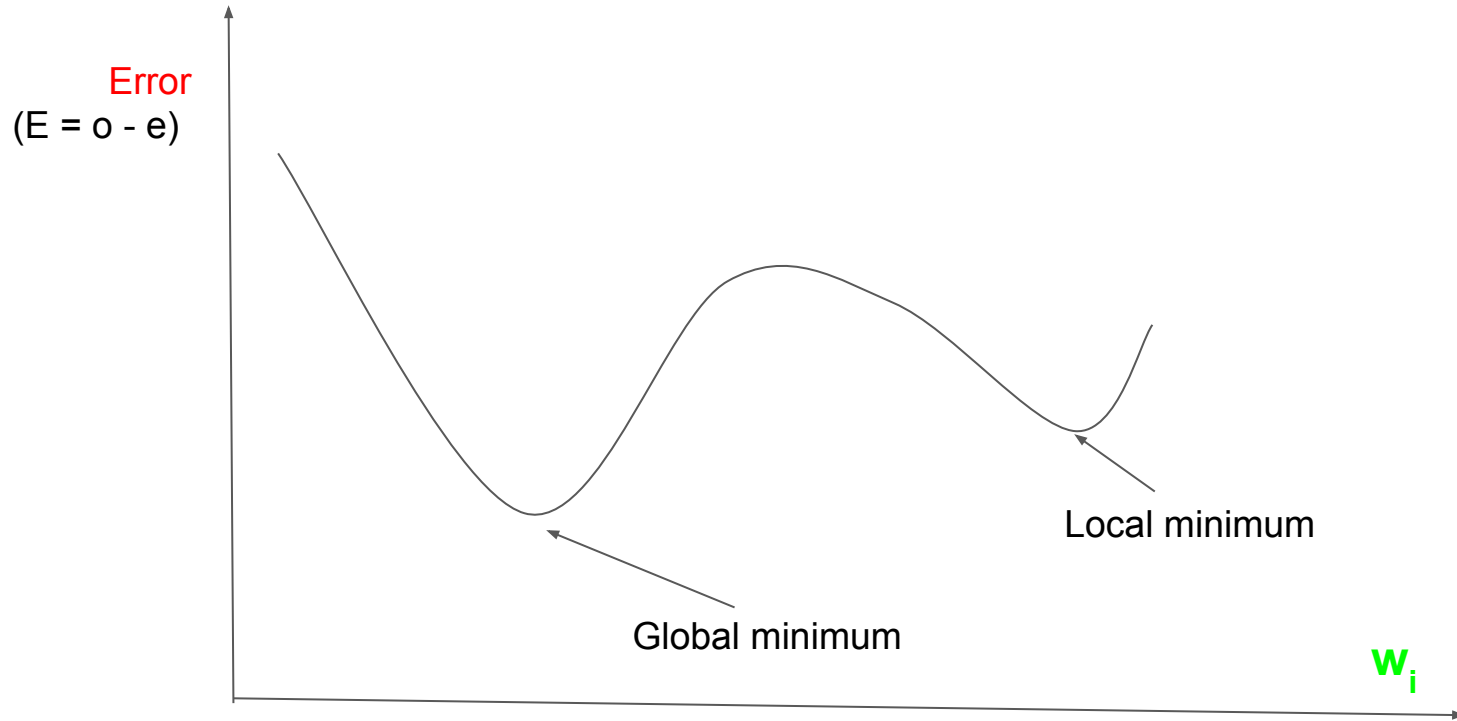
Neural network

“weights”

Quantitative data
Or
Quantitatively
coded

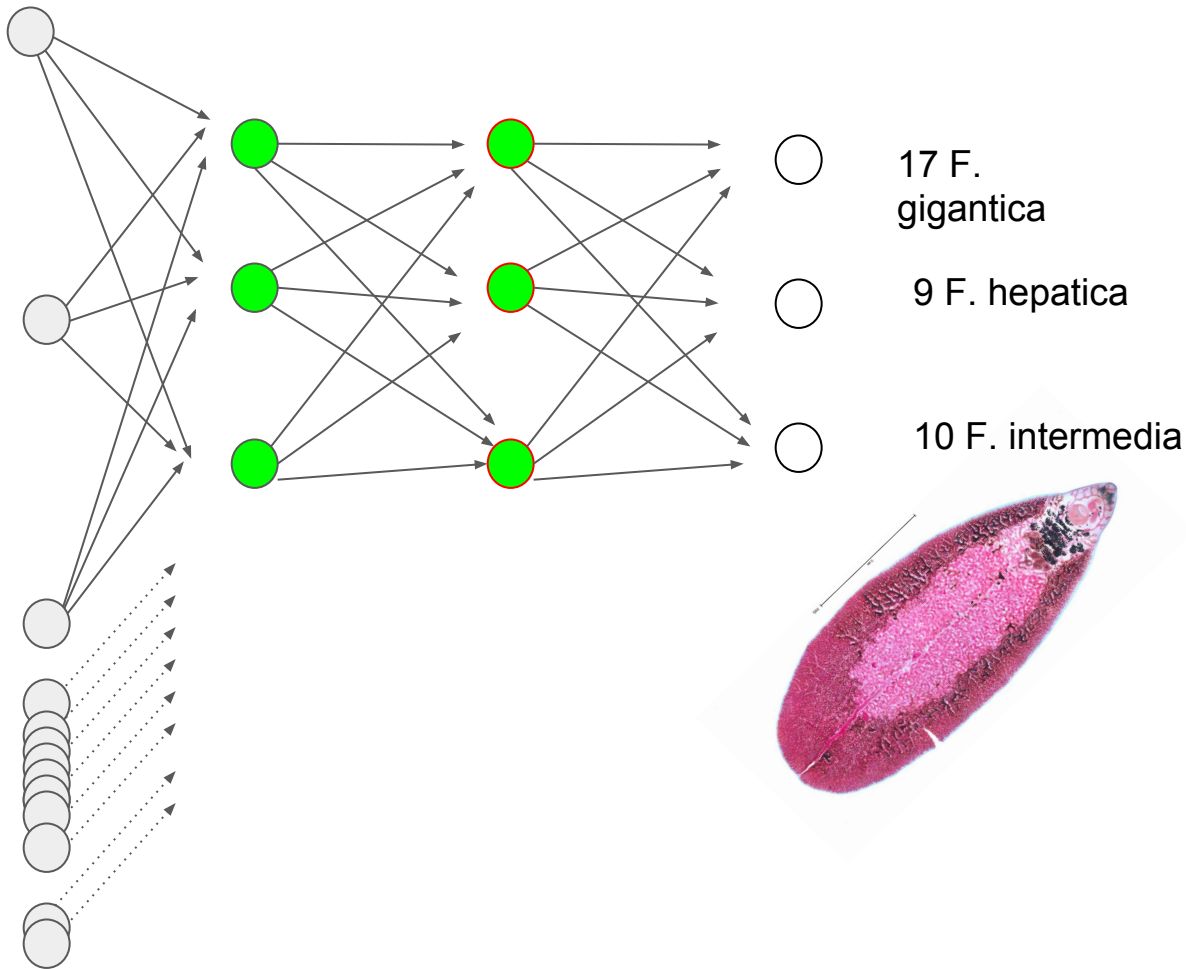
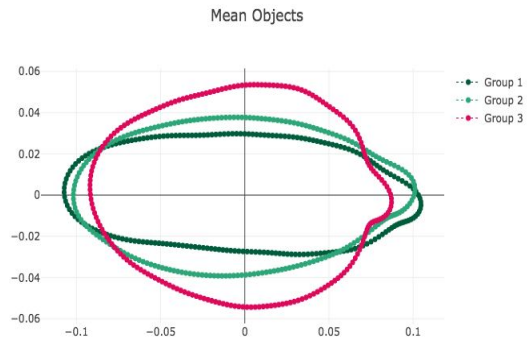
“weights = 1”

A graph of the training error as a function of the input parameters



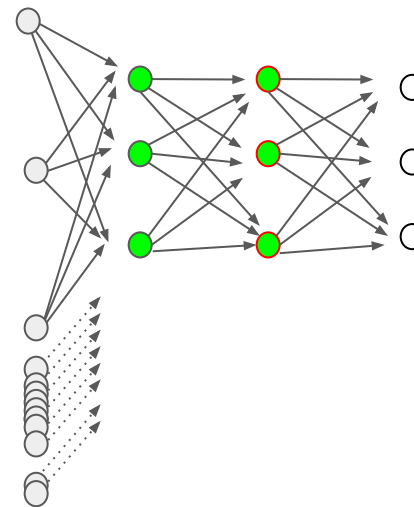
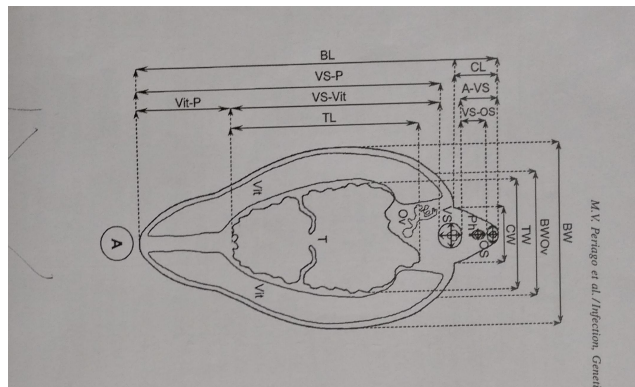
The weight update for a given node has the following (simple) form:

$$\Delta w_i = -\alpha \frac{\partial E}{\partial w_i}$$



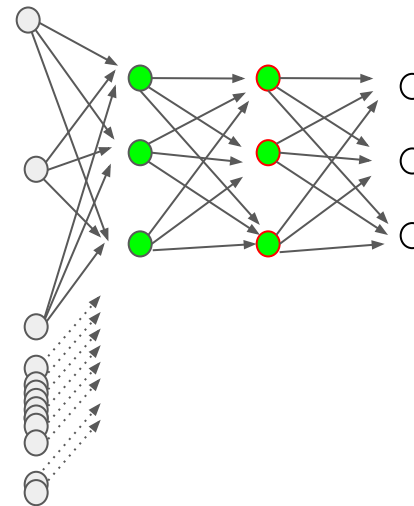
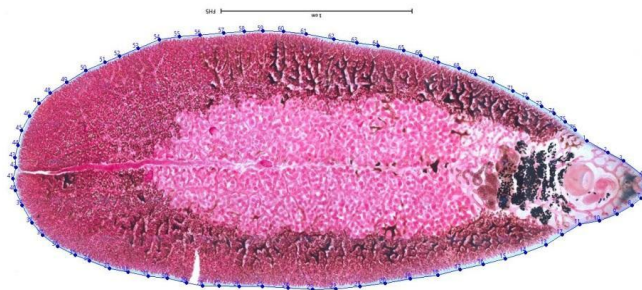
Scores of validated classification using as input for the multilayer perceptron
log-transformed **linear measurements** (LN)

	LN
4 LN	64% (13/36)
6 LN	78% (8/36)
8 LN	81% (7/36)
10 LN	87% (5/36)
12 LN	89% (4/36)



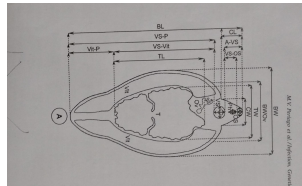
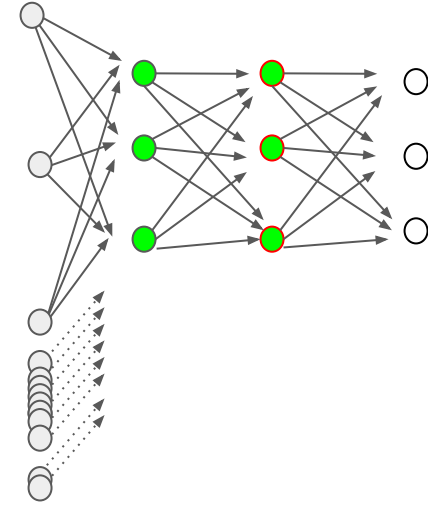
Scores of validated classification using as input for the multilayer perceptron
OUTLINE DATA.

	LN	
4 LN	64%	
6 LN	78%	
8 LN	81%	
10 LN	87%	
12 LN	89% (4/36)	89% (4/36)



Scores of validated classification using as input for the multilayer perceptron
 either log-transformed linear measurements (LN) alone,
 or a **combination of LN with outline data**.

	LN	LN + outline data
4 LN	64%	95% = 2 errors (out of 36 identifications)
6 LN	78%	98% = 1 error (out of 36 identifications)
8 LN	81%	95%
10 LN	87%	98%
12 LN	89% (4 errors /36)	100% = 0 error (out of 36 identifications)



SUMMARY

Traditional taxonomy was based on qualitative morphological characters <- Human EYES

It was too subjective of an approach, and has been put into difficulty by a subjective concept, the “sibling species” concept.

Modern taxonomy makes use of quantitative morphological characters <- Computer EYES

- It removes the requirement to be an expert of the group of insects under study.
- It removes subjectivity of the taxonomist (89%, 95%, etc.).

CONCLUSION

The new taxonomist is expected to be able to use **computerized** methods for taxonomic data collection, analyses and classification

Computers perform billions of accurate calculations in less than a second...

Do we conclude that we do not need mathematicians anymore?