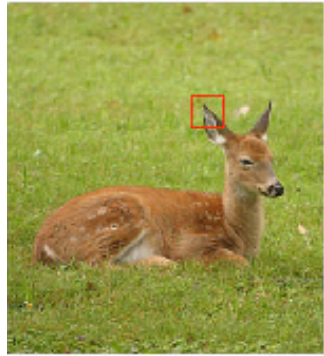
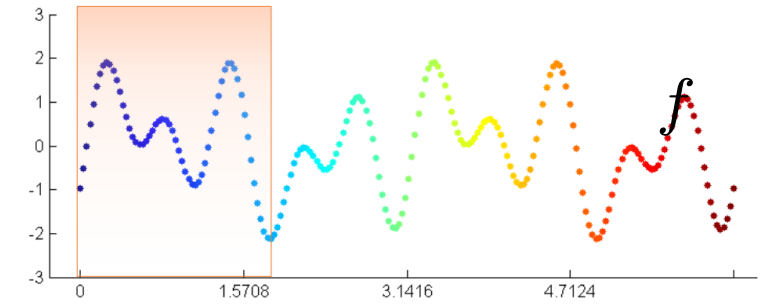


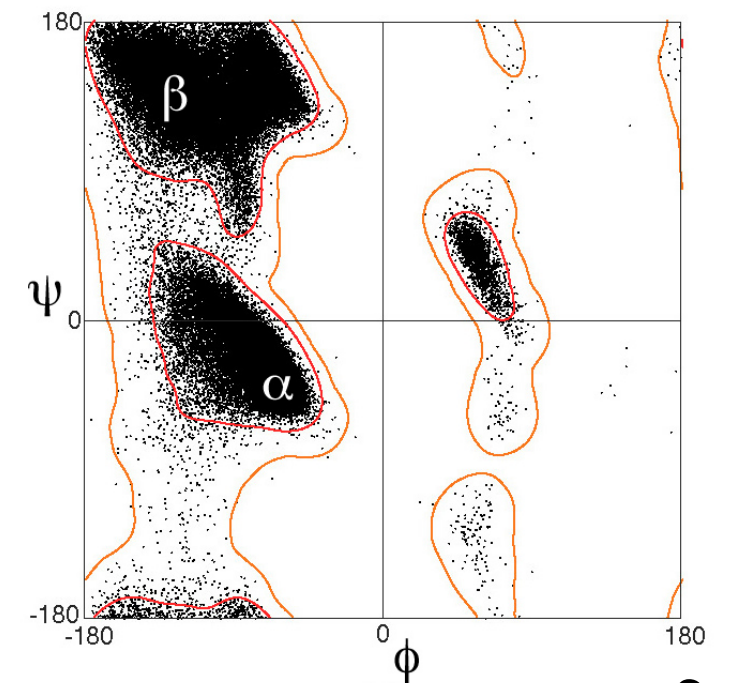
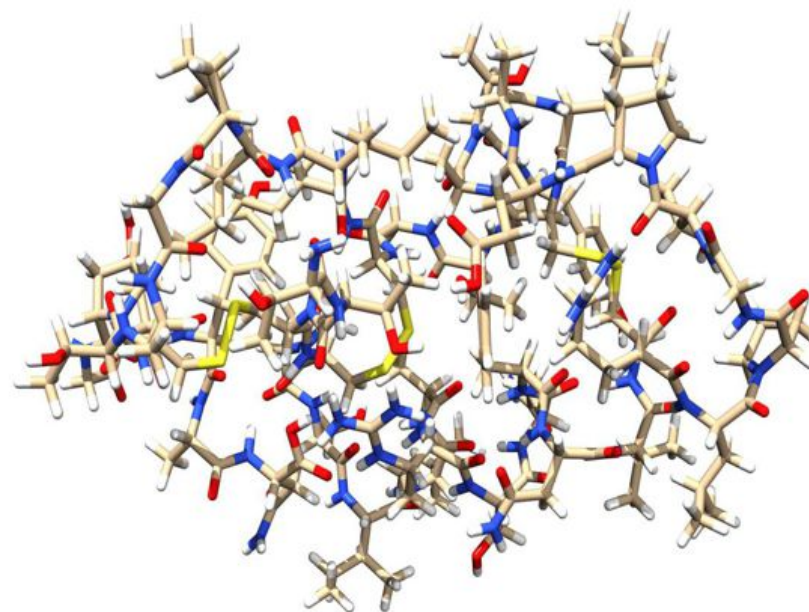
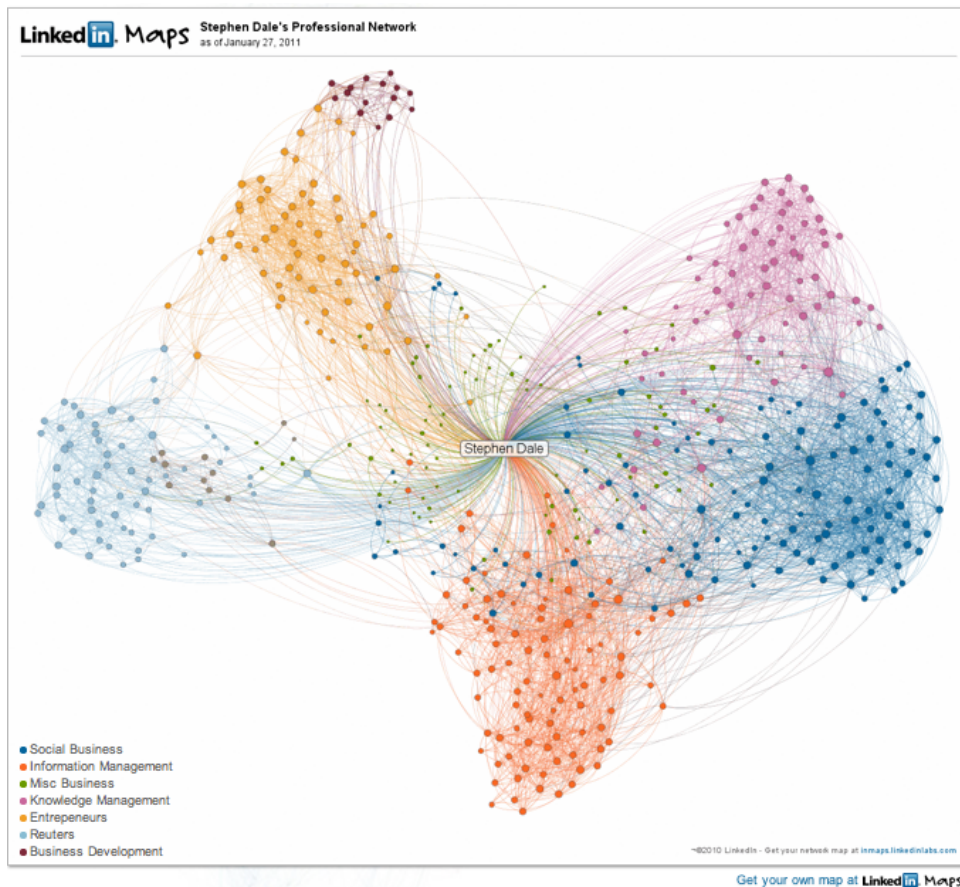
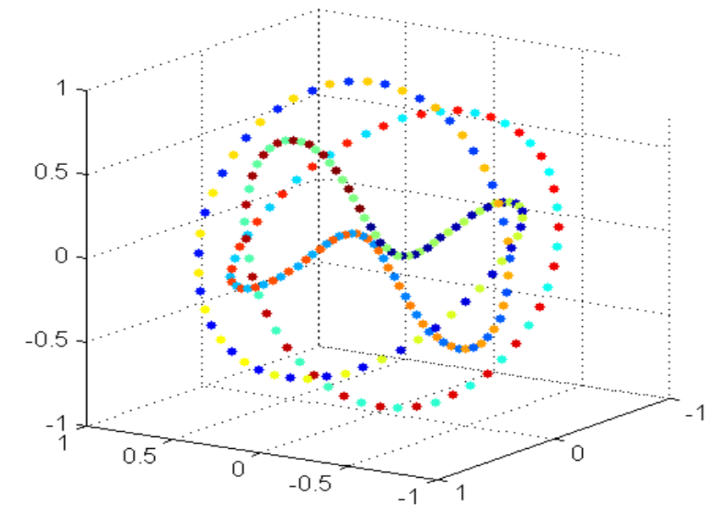
# Topology in data



window



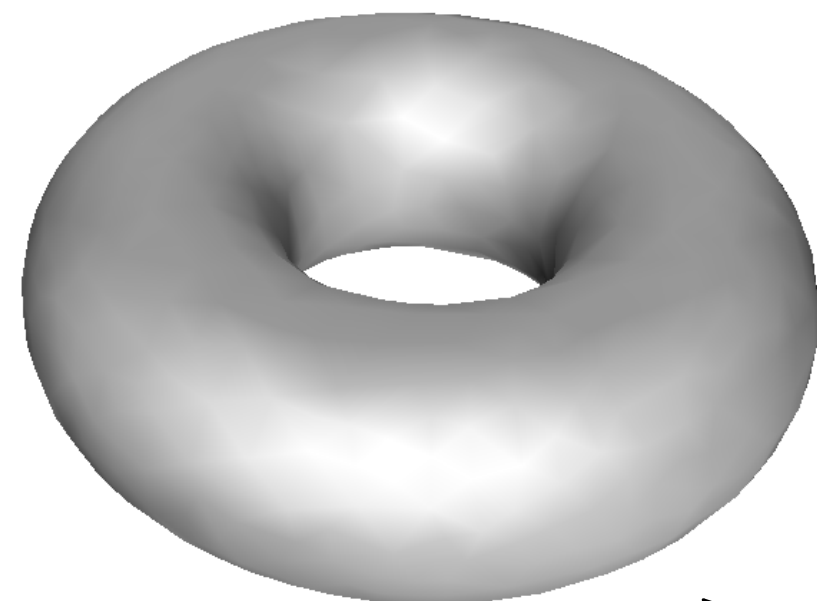
↓ (time-delay embedding)



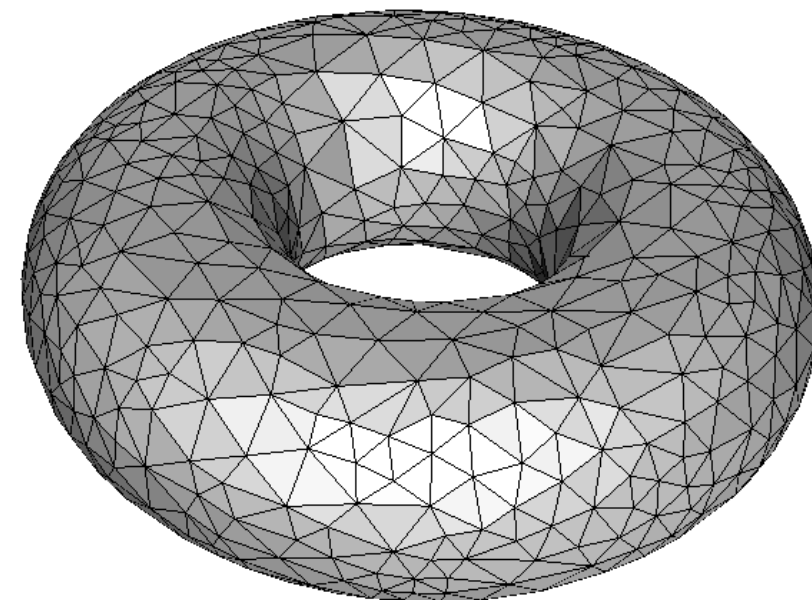
# Topological Data Analysis (TDA)

topological invariants for classification

$$\beta_0 = \beta_2 = 1$$
$$\beta_1 = 2$$



compact set

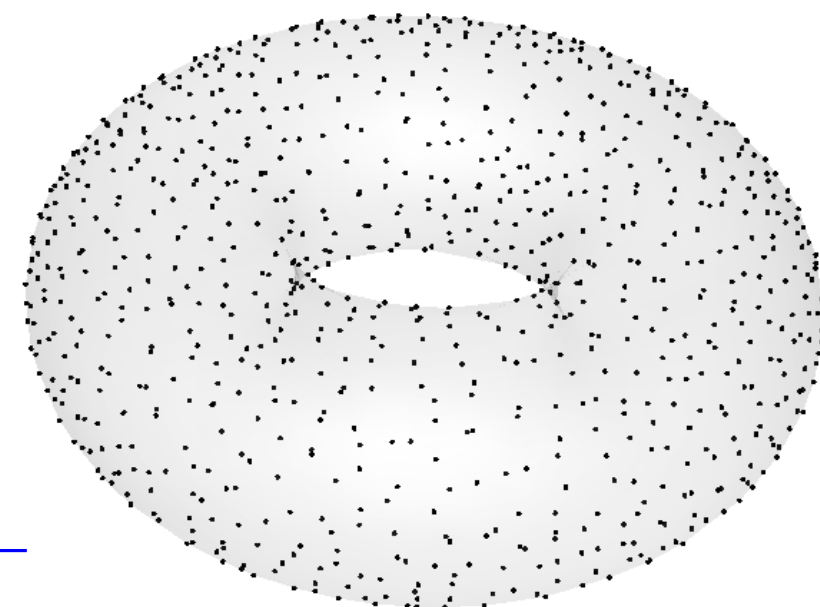
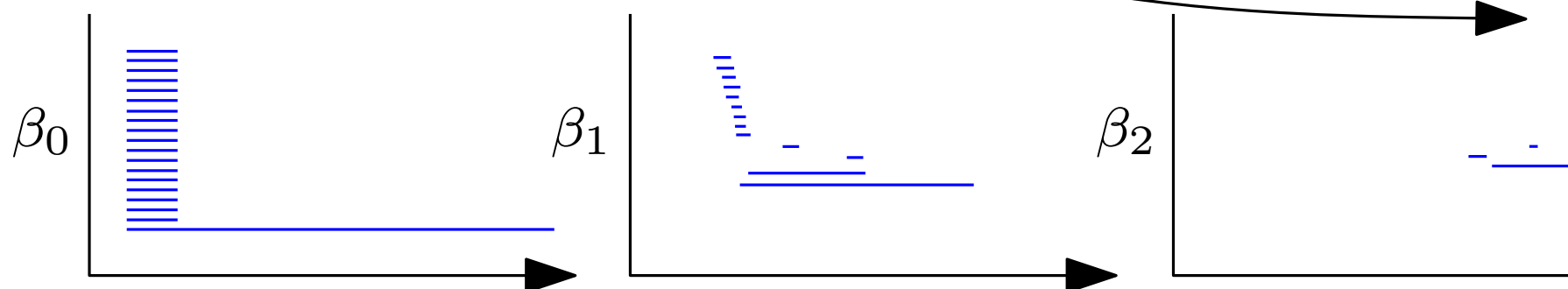


triangulation

Algebraic topology

Applied algebraic topology

topological descriptors for inference and comparison



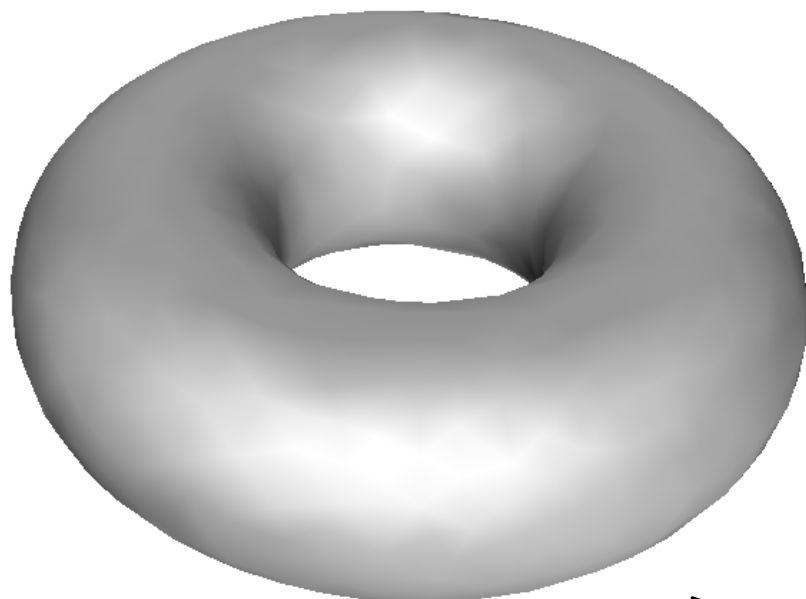
point cloud

# Topological Data Analysis (TDA)

Properties of topological descriptors:



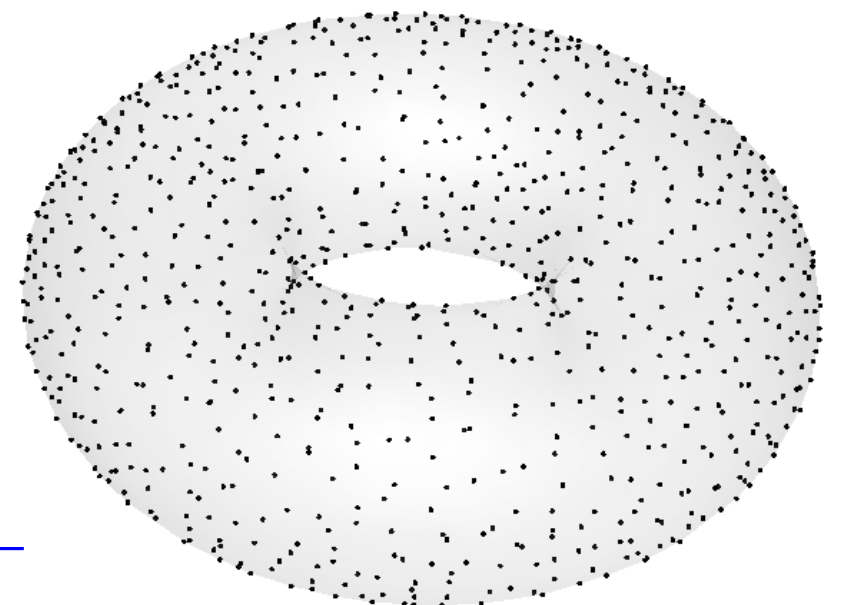
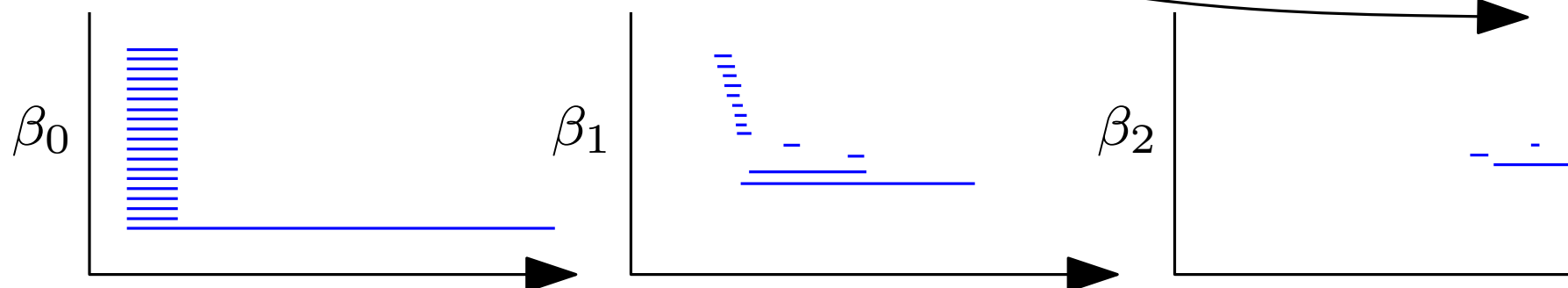
- invariant under coordinate changes
- stable with respect to perturbations
- informative



compact set

Applied algebraic topology

topological descriptors for inference and comparison



point cloud



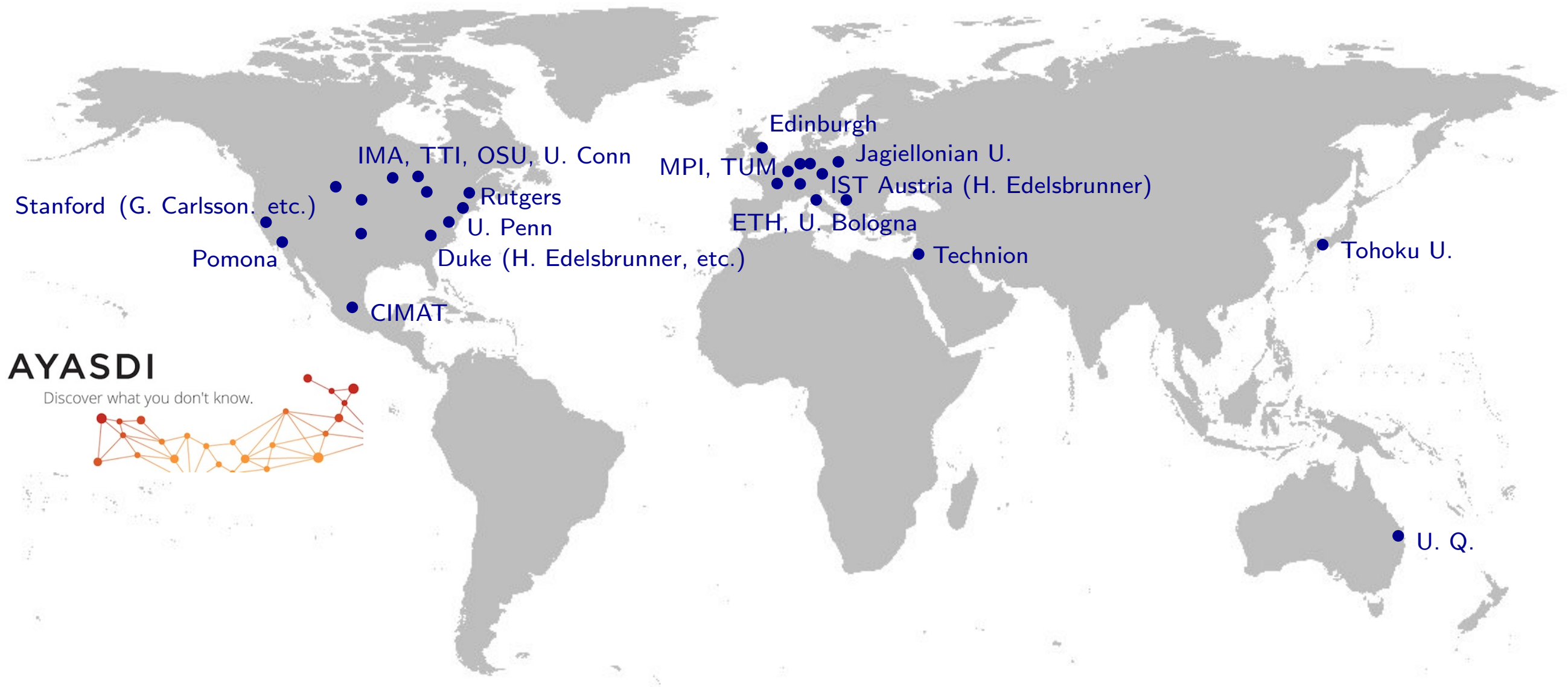
# The TDA community (as of 2002)



- 2 research groups (5-10 researchers)



# The TDA community (as of today)



- $\sim 100$  researchers working on theoretical foundations
- 200-300 researchers at the interface with applications
- successful applications and company (Ayasdi)

# Some applications

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- analysis of random, modular and non-modular scale-free networks and networks with exponential connectivity distribution,
- analysis of social and spatial networks like neurons, genes, online messages, air passengers, Twitter, face-to-face contact, etc.,
- coverage and hole detection in wireless sensor fields,
- multiple hypothesis tracking on urban vehicular data,
- analysis of the statistics of high-contrast image patches,
- image segmentation,
- 1d signal denoising,
- 3d shape classification/segmentation/matching,
- clustering of protein conformations,
- measurement of protein compressibility,

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# Some applications

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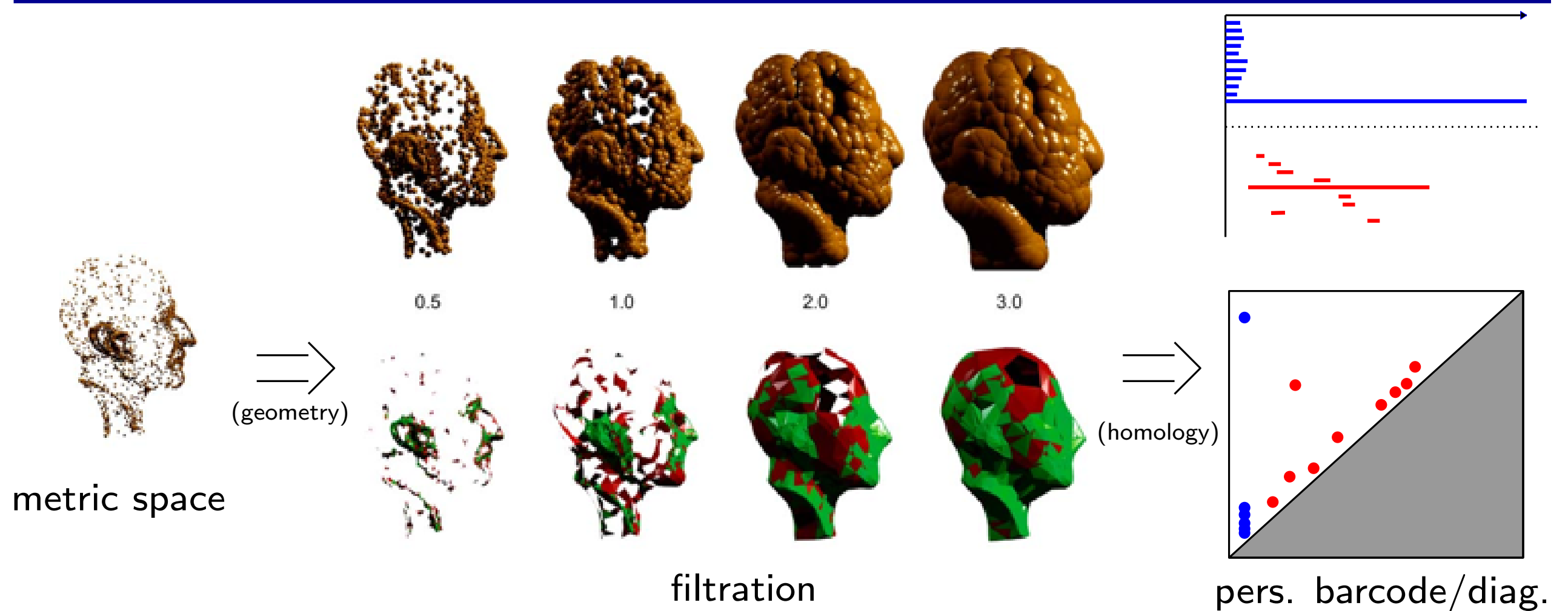
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- time series analysis,

# Some applications

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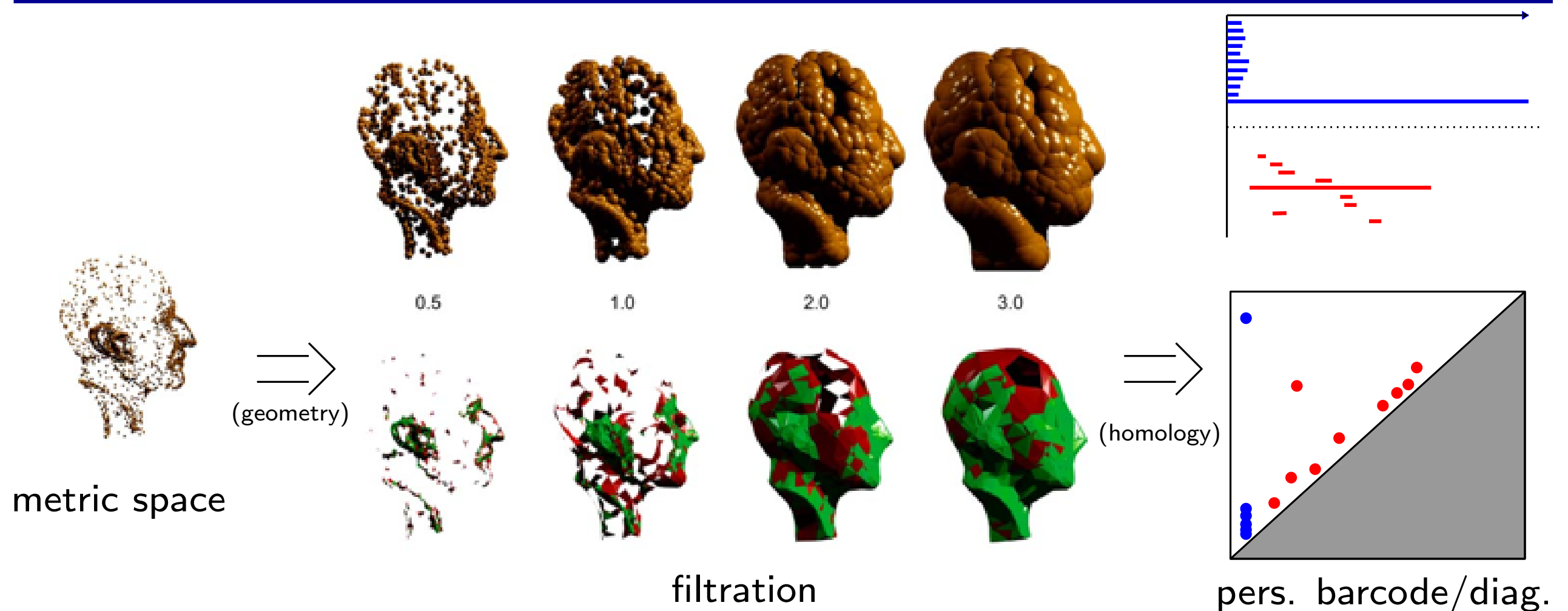
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- time series analysis,
- refinement of the classification of NBA players,
- discrimination of electroencephalogram signals recorded before and during epileptic seizures,
- statistical analysis of orthodontic data,
- measurement of structural changes during lipid vesicle fusion,
- characterization of the frequency and scale of lateral gene transfer in pathogenic bacteria,
- pattern detection in gene expression data,
- study of the cosmic web and its filamentary structure,

# The TDA pipeline in a nutshell





# The TDA pipeline in a nutshell



## 4 pillars to the theory (**topological persistence**):

- decomposition theorems ( $\exists$  barcodes)
- algorithms (computation of barcodes)
- stability theorems (barcodes as stable descriptors)
- statistics / learning (barcodes as observations)