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# A PLANETARY INVENTORY OF LIFE





LIFEPLAN website

# A new generation of statistical methods

- SN 0 M
- For huge dimensional, highly structured, sparse and imbalanced data.
- Widely applicable across sciences, engineering and

# A new understanding of biodiversity

- Global Joint Species Distribution Models will move community ecology towards a predictive science.
- Addresses long-standing unsolved ecological

# A transformative data resource

- Robust data across the globe on millions of species.
- Spatial resolution from 100m to the global scale.



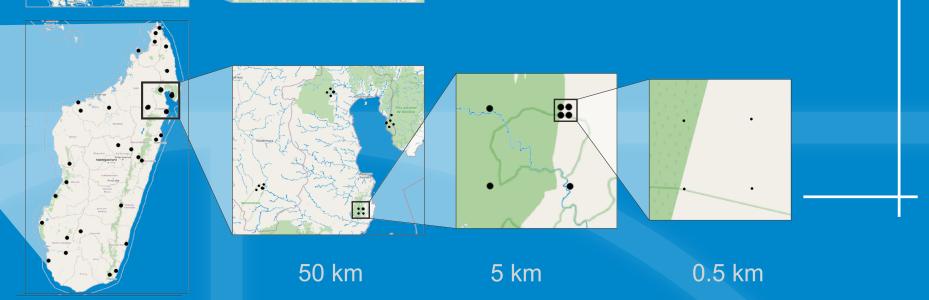
## Training **Scientific Data Scientists**

- Tools to build & implement realistic models & algorithms driven by scientific knowledge.
- Fundamentally different from "industry" data scien-



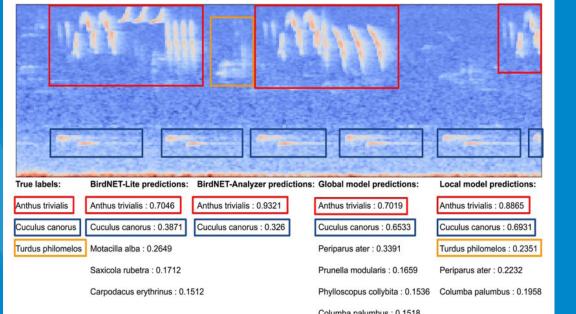
#### ... at multiple spatial scales

- We sample at spatial scales from global to local from 2020 to 2025.
- Spatial scales are relevant for different taxa and ecological processes; sampling at such a range of scales allows us to study these relationships.
- Our highest-density sampling happens in the Nordic countries and in Madagascar. Plots in the global design switch between a natural and an urban environment once a year to study the effects of urbanisation on different taxa.
- Global Lifeplan sampling is done by teams around the world who collect data on their field sites. Each team owns their own data and their results. We commit to the principles of FAIR and open data.



### Training ML methods via crowdsourced annotation

• We collect example images and sounds of the species in our data. If you can recognise birds from their vocalisations, you can help us by going to *bsg.laji.fi* and identifying bird sounds recorded in Lifeplan.



on
on
off
Crop recording

• The example images and sounds are used to train machine learning (ML) models. With these models, we can go through the millions of images and years of sound we collect. Active learning methods optimise the amount of human annotation required.

• Our models for identifying bird species based on their vocalizations now have a higher accuracy than previous algorithms.

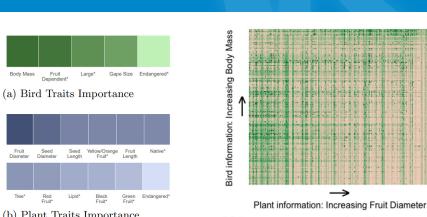
Lauha P et al. 2022. doi: 10.1111/2041-210X.14003

# New statistical methods for LIFEPLAN data analysis

1000 km

Lifeplan data is motivating the development of novel statistical models and algorithms for ecological applications, including:

- Flexible community data analysis within the Hierarchical Modelling of Species Communities (HMSC) framework
- A framework for uncovering latent interactions from biased networks



Interaction matrix ordered by tra

• A new class of models for discrete processes characterized by self-similarity and long range dependence such as bird vocalizations

• Scalable models for massive multivariate data as well as nonstationary processes in spatial domains constrained by barriers and boundaries.

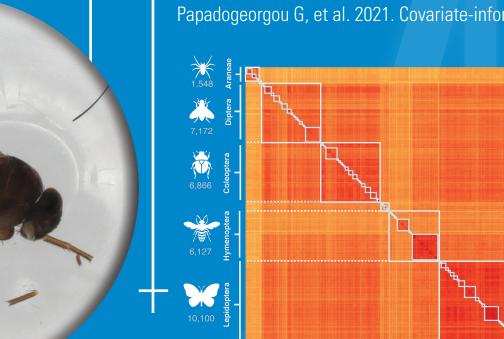
• DNA barcoding algorithms that account for novel species of insects and

#### **DNA metabarcoding meets image recognition**



• We metabarcode all our physical samples. As we use non-destructive methods, we can bulk photograph the arthropods in the Malaise samples after metabarcoding.

• For a subset of individuals, we also generate individual images and barcodes, machine learning training data, and bolster taxonomic reference libraries on *boldsys*tems.org.



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