

# What do we not know? Quantifying data gaps and biases in knowledge of bat co-roosting

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## CETAF-DISSCO COVID-19 TASKFORCE NASBR/IBRC 2022- Austin, TX



# Occurrence data in abundance

GBIF



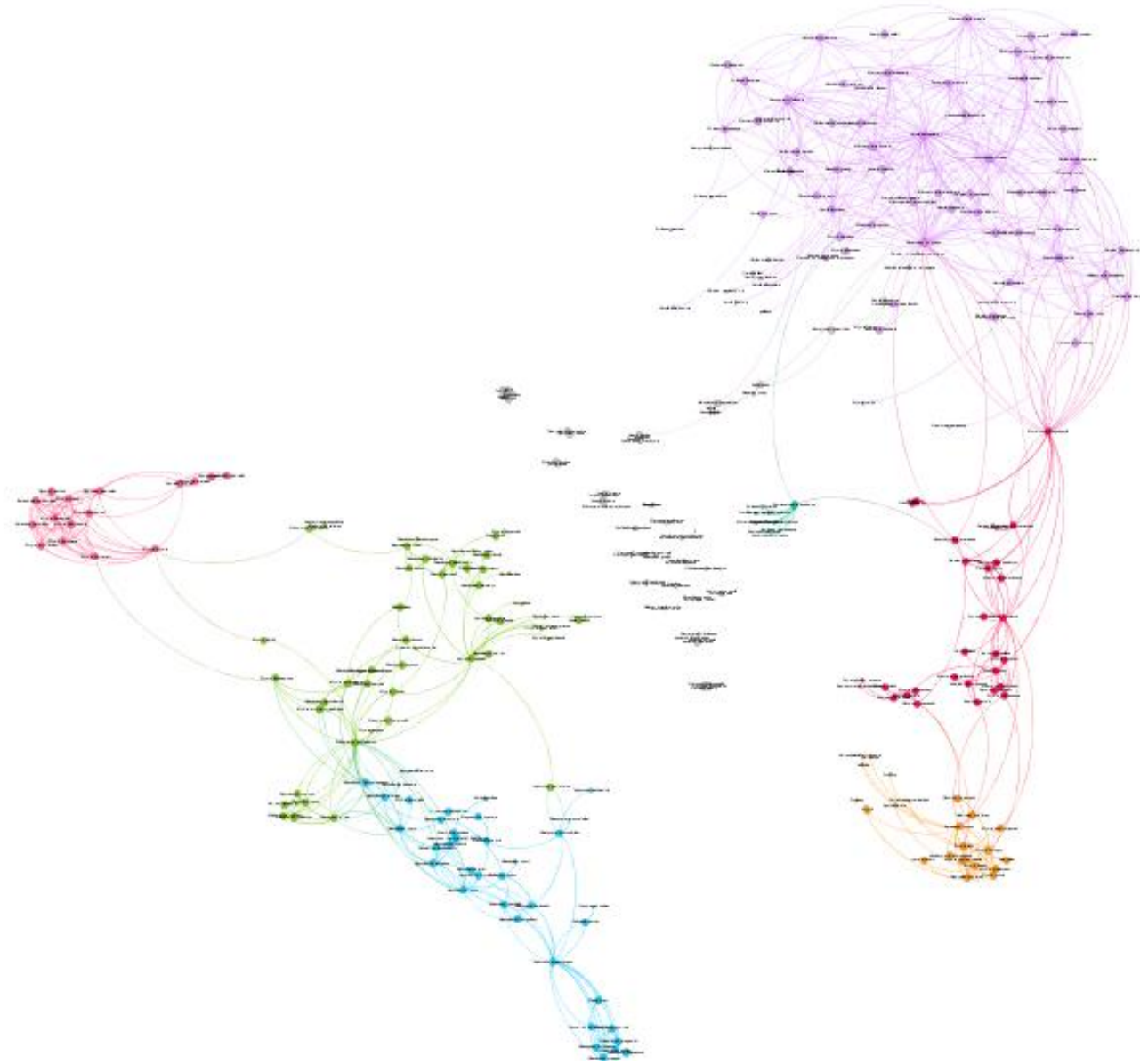
# Occurrence data in abundance

**GBIF**





# Background



# Objective

1. What bat species co-roost?
2. Where are they co-roosting?
3. What are common characteristics of the environment where co-roosting occurs?



The Nutritional Ecology Lab – *R. ferrumequinum* roosting with *M. emarginatus* and *Asellia tridens*

# Methods – Literature Collections

Systematic searches did not yield relevant literature

- ❑ Simmons Collection
- ❑ Citation collections
  - ❑ Willoughby et al. 2017
  - ❑ Mammal Species
  - ❑ BatBase.org





# Methods - Unattainable Literature



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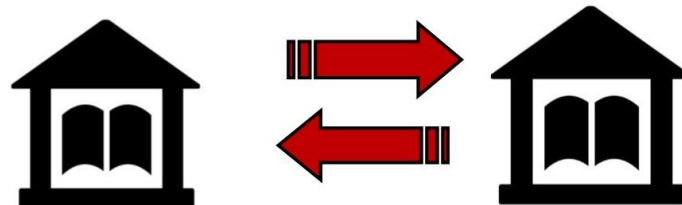
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# FAIR Data – extracted from publications



Viewpoint

## Liberating host-virus knowledge from biological dark data



*Nathan S Upham, Jorrit H Poelen, Deborah Paul, Quentin J Groom, Nancy B Simmons, Maarten P M Vanhove, Sandro Bertolino, DeeAnn M Reeder, Cristiane Bastos-Silveira, Atriya Sen, Beckett Sterner, Nico M Franz, Marcus Guidoti, Lyubomir Penev, Donat Agosti*

Connecting basic data about bats and other potential hosts of SARS-CoV-2 with their ecological context is crucial to the understanding of the emergence and spread of the virus. However, when lockdowns in many countries started in March, 2020, the world's bat experts were locked out of their research laboratories, which in turn impeded access to large volumes of offline ecological and taxonomic data. Pandemic lockdowns have brought to attention the long-standing problem of so-called biological dark data: data that are published, but disconnected from digital knowledge resources and thus unavailable for high-throughput analysis. Knowledge of host-to-virus ecological interactions will be biased until this challenge is addressed. In this Viewpoint, we outline two viable solutions: first, in the short term, to interconnect published data about host organisms, viruses, and other pathogens; and second, to shift the publishing framework beyond unstructured text (the so-called PDF prison) to labelled networks of digital knowledge. As the indexing system for biodiversity data, biological taxonomy is foundational to both solutions. Building digitally connected knowledge graphs of host-pathogen interactions will establish the agility needed to quickly identify reservoir hosts of novel zoonoses, allow for more robust predictions of emergence, and thereby strengthen human and planetary health systems.

*Lancet Planet Health 2021*

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September 22, 2021

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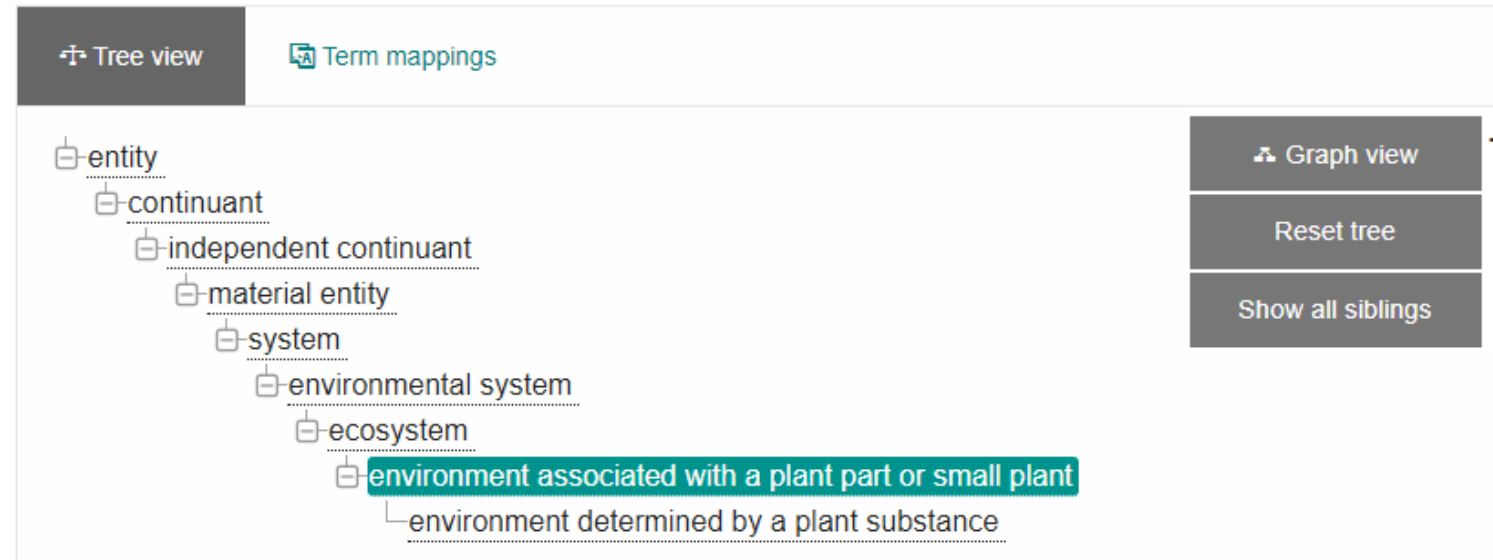
# FAIR Data – extracted from publications



# Methods – Ontologies



An environmental system determined by part of a living or dead plant, or a whole small plant.



## Term information

### alternative term

- Plant corpus

### in subset

- envoEmpo
- envoMeo
- envoOmics

## Term relations



Open Life Science

# What we have so far

**11,500** interaction records

>**360** bat species

>**137** countries

>**175** publications

**1860-2020**

all accessible via the Coronavirus-Host community at Zenodo;

CETAF-DiSSCo/COVID19-TAF biodiversity-related knowledge hub working group: indexed biotic interactions and review summary



# Methods – Example

## \*58 interactions

- 16 roost
- 4 anthropogenic
- 1 co-roost
- 36 other

## Effects of Tropical Cyclonic Storms on Flying Fox Populations on the South Pacific Islands of Samoa

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**Abstract:** The South Pacific islands of Samoa have two extant flying fox species, *Pteropus samoensis* and *P. tonganus*. Following two severe cyclonic storms, we examined their differential behavioral responses and evaluated the effectiveness of recently established reserves in providing refugia. Although the cyclones disrupted activity patterns and foraging behavior for both species, comparisons with pre-storm data suggested that the more common, widely distributed *P. tonganus* experienced more severe population declines than the endemic *P. samoensis*. This differential mortality could be explained by a combination of ecological and behavioral factors. *P. tonganus* had a greater tendency to enter villages to feed on fallen cultivated fruits, making it more vulnerable to human hunting and predation by domestic animals. In addition, *P. samoensis* appeared to use survival strategies not observed in *P. tonganus*. Leaves, which were far more available than flowers or fruits in the immediate post-storm period, comprised a major part of the post-storm diet of *P. samoensis*. This species also fed on the fleshy bracts of a storm-resistant native liana, (*Freycinetia reineckei*). In contrast, a seasonally important food of *P. tonganus* is nectar from the delicate flowers of *Syzygium inophylloides* (asi), a canopy tree that is very vulnerable to wind damage and has become increasingly scarce with the clearing of lowland forest. Rainforest reserves, established prior to the storms, served as adequate refugia for local *P. samoensis* populations, which appeared to feed relatively close to their roosts, primarily in native forest, but did not protect *P. tonganus* populations, which traveled outside reserves to forage in areas lacking hunting bans. Although wind damage was patchy and not consistent between storms, areas of high topographic complexity (e.g., volcanic cones and deep valleys) were the most likely to retain areas with some foliage and should be given priority in the design of future reserves.

El efecto de las tormentas ciclónicas tropicales sobre las poblaciones de zorros voladores en las islas del Pacífico Sur de Samoa.

**Resumen:** Las islas del Pacífico Sur de Samoa tienen dos especies existentes de zorros voladores, *Pteropus samoensis* y *P. tonganus*. Luego de dos severas tormentas ciclónicas, examinamos sus diferentes respuestas de comportamiento y evaluamos la efectividad de las reservas recientemente establecidas para proveer de refugio. Si bien los ciclones perturbaron los patrones de actividad y forrajeo en ambas especies, las comparaciones con datos previos a las tormentas sugieren que la especie más común y ampliamente distribuida, *P. tonganus*, experimentó declinaciones poblacionales más severas que la especie endémica *P. samoensis*. Esta mortalidad diferencial podría ser explicada por una combinación de factores ecológicos y de comportamiento. *P. tonganus* presentó una mayor tendencia a entrar en las aldeas para alimentarse de frutos cultivados caídos, haciéndose más vulnerable a la caza por humanos y a la de predación por parte de animales domésticos. Además, *P. samoensis* pareció usar estrategias de supervivencia no observadas en *P. tonganus*. Las hojas, que estuvieron mucho más disponibles que las flores o frutos inmediatamente después de las tormentas, comprendieron la mayor parte de la dieta de *P. samoensis*, durante el período posterior a las tormentas. Por otra parte, esta especie se alimenta de las bracteas carnosas de una liana nativa.

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Paper submitted November 20, 1993; revised manuscript accepted

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# Methods – Retained verbatim text

Table 2. Number of identified *Pteropus samoensis* roosts at selected sites in Samoa before the first cyclone, after Cyclone Ofa (post-Ofa), and after Cyclone Val (post-Val).

Date	Inside reserves			Outside reserves			
	Falealupo	Tafua	Olovalu	Vai'a'ata	Afono	Amalau	Alava
Pre-Cyclone							
July 1987	—	—	—	—	2	5	—
July 1988	2	—	—	—	—	5	—
July 1989	—	—	—	1 <sup>a</sup>	—	—	—
January 1990	—	4	—	—	—	—	—
Post-Ofa							
June 1990	2	5	—	0	—	4	—
October 1990	—	9	3	0	2	5	—
August 1991	2	—	—	0	—	5	—
Post-Val							
January 1992	—	8	5	—	2	—	7
January 1993	2	12	7	0 <sup>b</sup>	2	4	1

<sup>a</sup>This site was unusual because it had over 40 animals (Wilson & Engbring 1992).

<sup>b</sup>Wilson & Engbring 1993.

The first survey of Olovalu Crater, nine months after Cyclone Ofa in November 1990, identified three *P. samoensis* roosts. In January 1992, a few weeks after Cyclone Val, two additional roosts were found. Two additional roosts were found in January 1993. This site sustains many areas.

ata in the year and a half after the first survey of *P. samoensis* in 1989 was gone. Although roosting in the area in late afternoon, feeding alone on some resources (*F. religiosa*) there by Wilson and Engbring

In July 1987, two *P. samoensis* roosts were identified in Afono Valley and five on the ridge above Amalau Valley. The number of roosts in Afono Valley has remained the same on all subsequent visits (November 1990, January 1992, and January 1993), although the number in Amalau Valley has fluctuated between four and five, and was at four in January 1993. In January 1992, a few weeks after Val, seven *P. samoensis* roosting sites (1–2 individuals each) were identified, associated with a series of defoliated small cones along the 5.5-km Alava Ridge road. This road experienced a substantial amount of recreational four-wheel drive traffic during 1992, and one of the roosting cones was partially cleared for a taro (*Colocasia esculenta*) plantation. In January 1993 only one roost, the one farthest from the main road), appeared occupied.

ternoon. The majority of *P. tonganus* foraged at night, and during *Mangifera indica* (mango; mago) or *Ceiba pentandra* (kapok; vavac) season could be heard all night long squabbling in feeding trees in villages. The foraging times of the two species, however, overlapped considerably. *P. tonganus* was sometimes heard feeding down and frequently appeared in foraging trees well before dark. On a number of occasions *P. tonganus* were observed feeding simultaneously in the same trees with *P. samoensis*. Although *P. samoensis* showed a flexible foraging pattern, feeding alone on some resources (*F. religiosa*), it was generally observed feeding in groups on others (*Planchonella torricellensis* [mama lava], *Cananga odorata* [moso'oi], or *Ficus obliqua* [banyan] [aola]), *P. tonganus* typically was encountered in aggregations (Elmqvist et al. 1992).

Immediately following both Cyclones Ofa and Val, *P. tonganus* showed considerable disruption of its normal activity pattern. It disappeared from most known roost sites, became far more diurnal, and was generally observed feeding alone. It also showed an increased tendency to enter villages and seek fruit very close to human habitation. In contrast, *P. samoensis* remained in pre-cyclone roost sites and continued to forage diurnally, primarily within the forest. The only noticeable change was that, immediately after the storm, its activity appeared to be more evenly distributed throughout the day, and the late afternoon activity peak was not evident. Also, soaring behavior, characteristically observed near roost sites in late afternoon, was seen less often. In January 1993, one year after Val, *P. samoensis* activity

“On a number of occasions *P. tonganus* were observed feeding simultaneously in the same trees with *P. samoensis*.”

**What kind of interactions  
are we finding?**



# Results – Interactions of interest

Co-roosts with

[http://purl.obolibrary.org/obo/RO\\_0002801](http://purl.obolibrary.org/obo/RO_0002801)



© Roberto Toffoli

# Results – Interactions of interest

Preyed upon by

[http://purl.obolibrary.org/obo/RO\\_0002458](http://purl.obolibrary.org/obo/RO_0002458)



Fernando Belmar



# Results – Interactions of interest

Feces eaten by

[http://purl.obolibrary.org/obo/OMIT\\_0004607](http://purl.obolibrary.org/obo/OMIT_0004607)



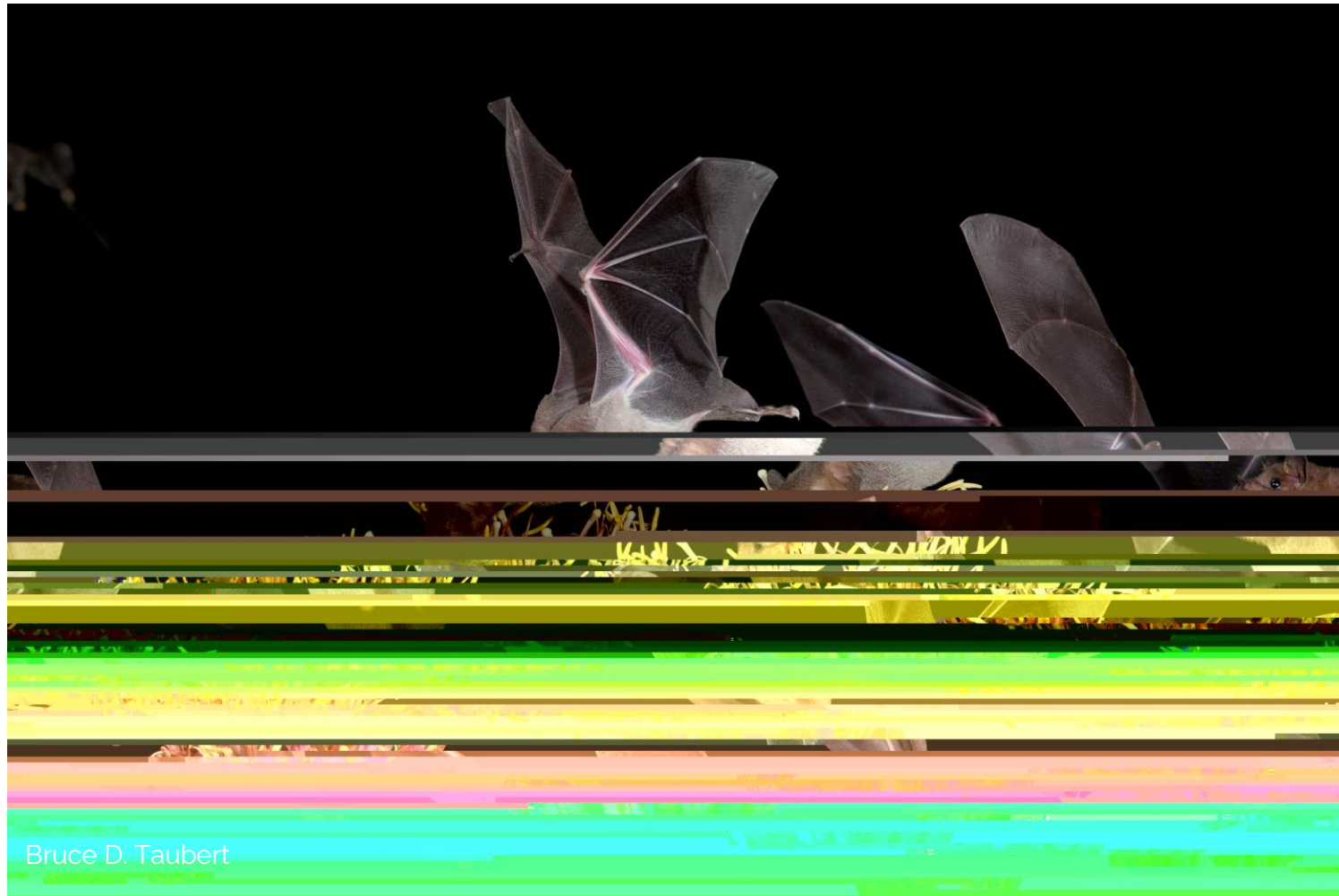
Robbie Shore



# Results – Interactions of interest

Visits flowers of

[http://purl.obolibrary.org/obo/RO\\_0002622](http://purl.obolibrary.org/obo/RO_0002622)



Bruce D. Taubert

# Results – Interactions of interest

Cohabitates with

???



**What kind of roosts are  
bats using?**



# Results – Co-roosting Environments

tree

[ENVO 01001057](#)

standing tree

cavity in standing  
tree



Rollin Verlinde



# Results – Co-roosting Environments

cave

[ENVO\\_00000067](#)



Rollin Verlinde

# Results – Co-roosting Environments

foliage

modified leaves

[ENVO 01001057](#)

leaf tent





# Results – Co-roosting Environments

rock shelter

[ENVO\\_00000481](#)

in crack or crevice



Kory Roberts



# Results – Co-roosting Environments

anthropogenic

ENVO\_00000070

domestic building

ENVO\_00000073

in roof

[ENVO\\_01000472](#)



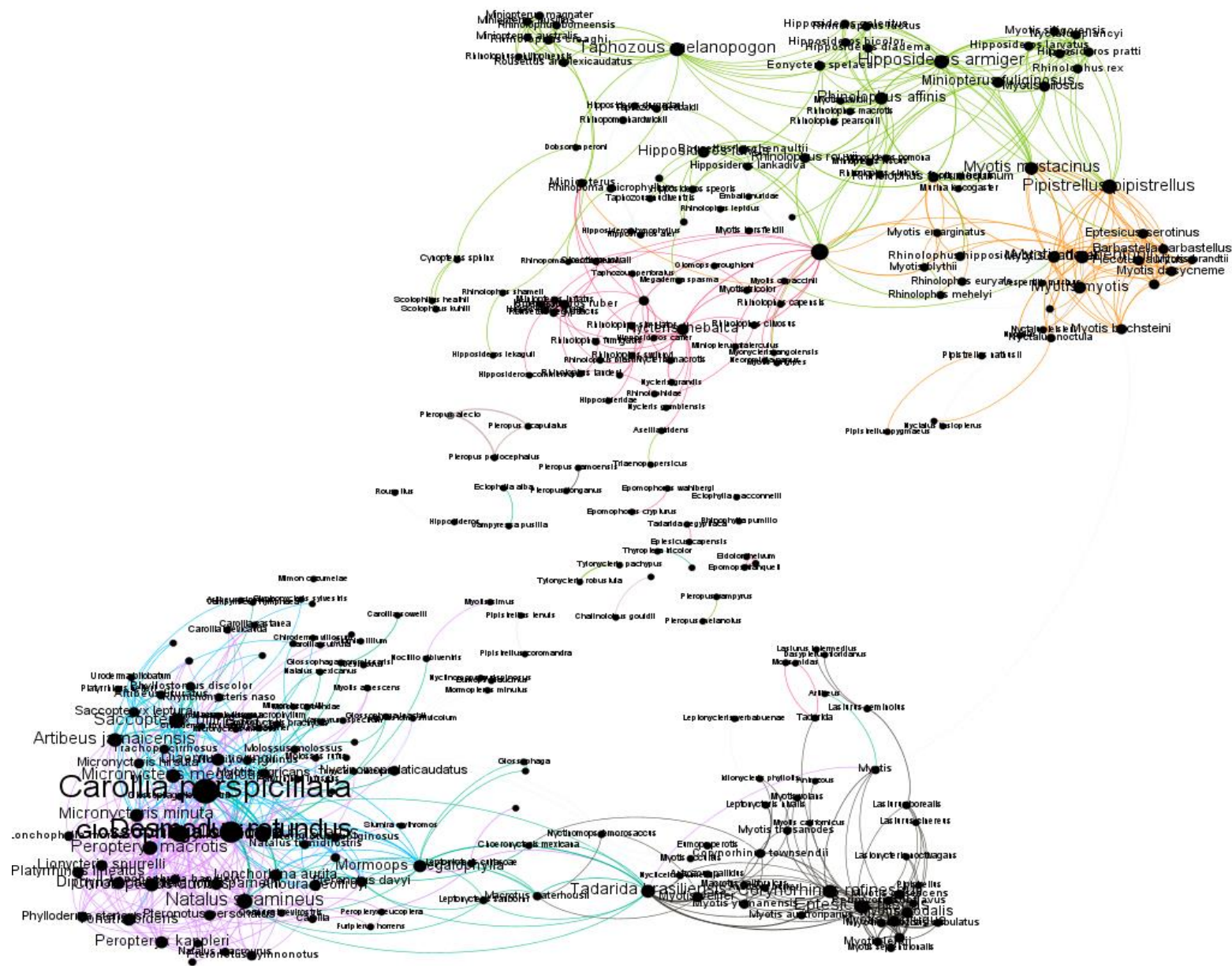
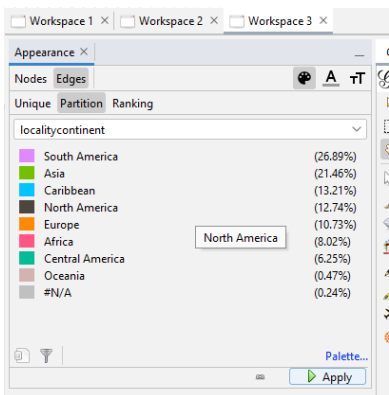
AAAnimal Control

# Results - Provenance

## Primary Data vs Secondary Data

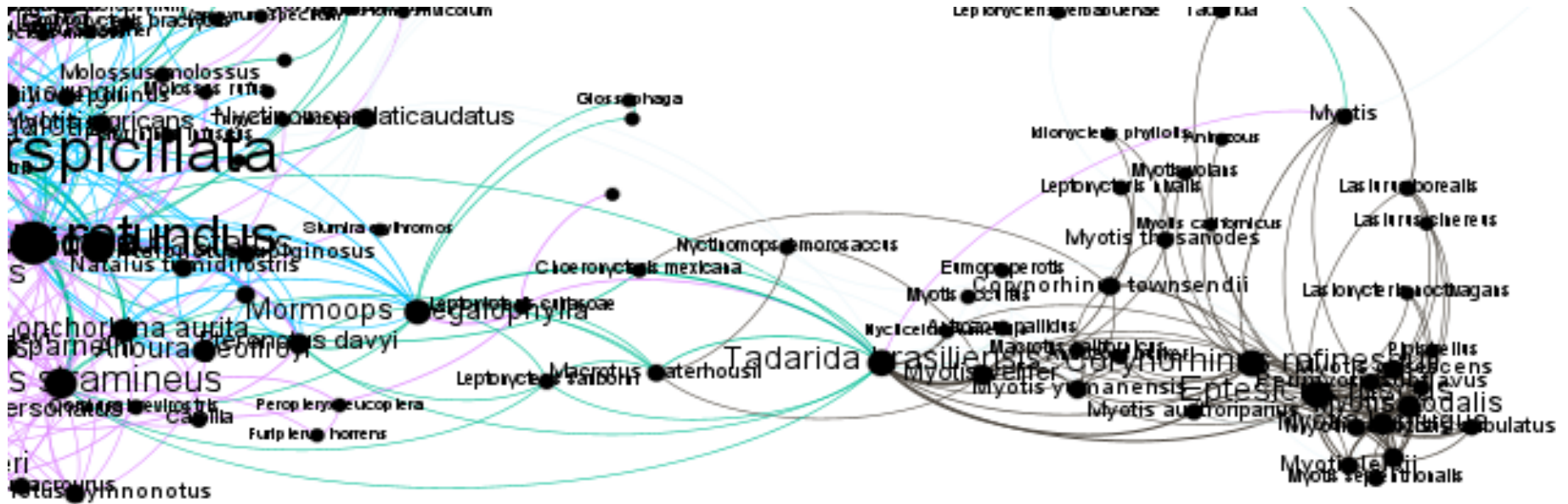
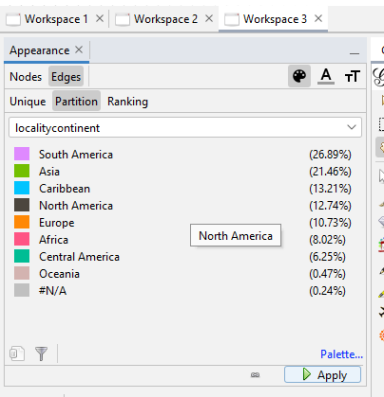


# First Outputs – Co-roosting





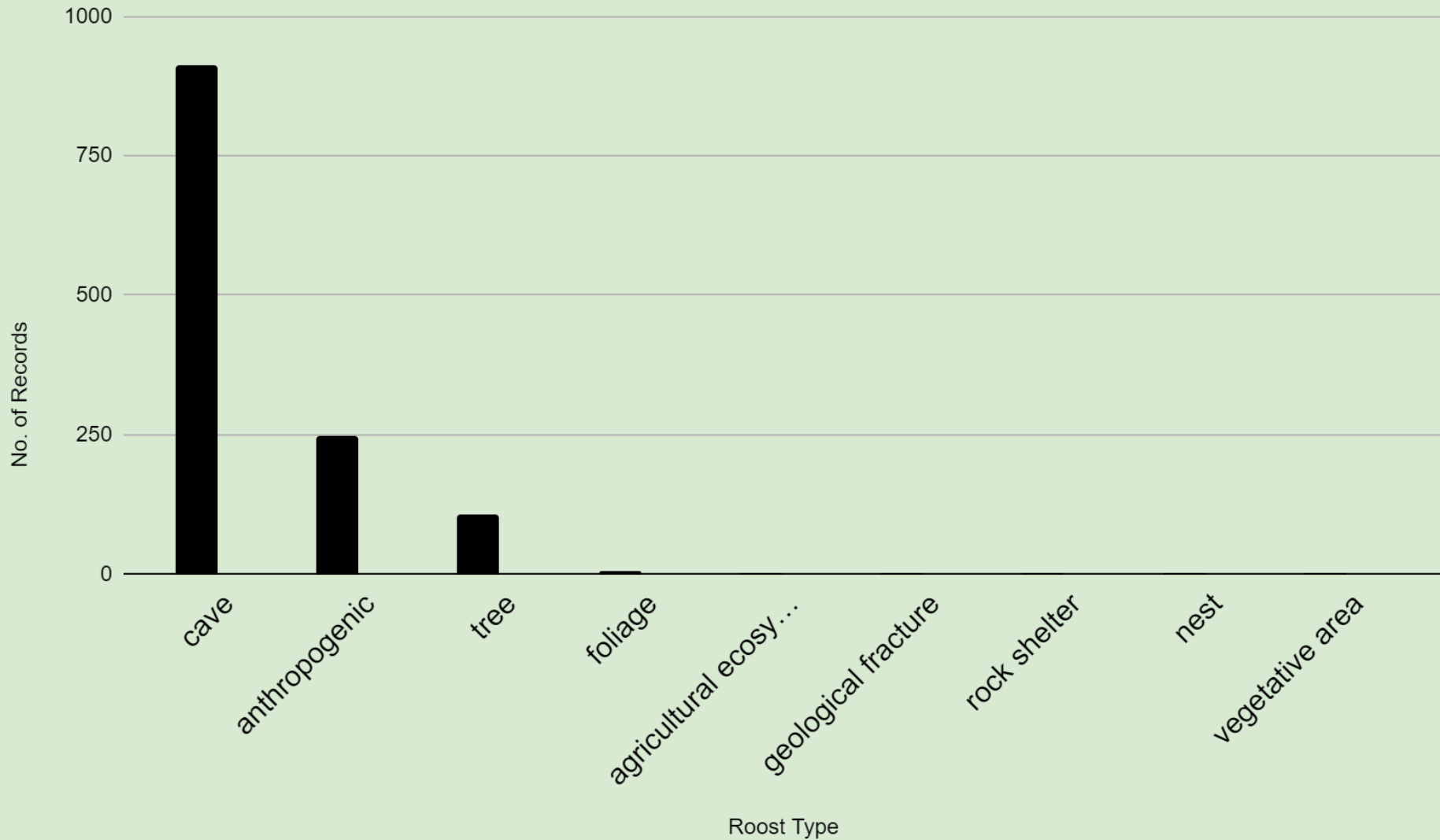
# First Outputs – Co-roosting





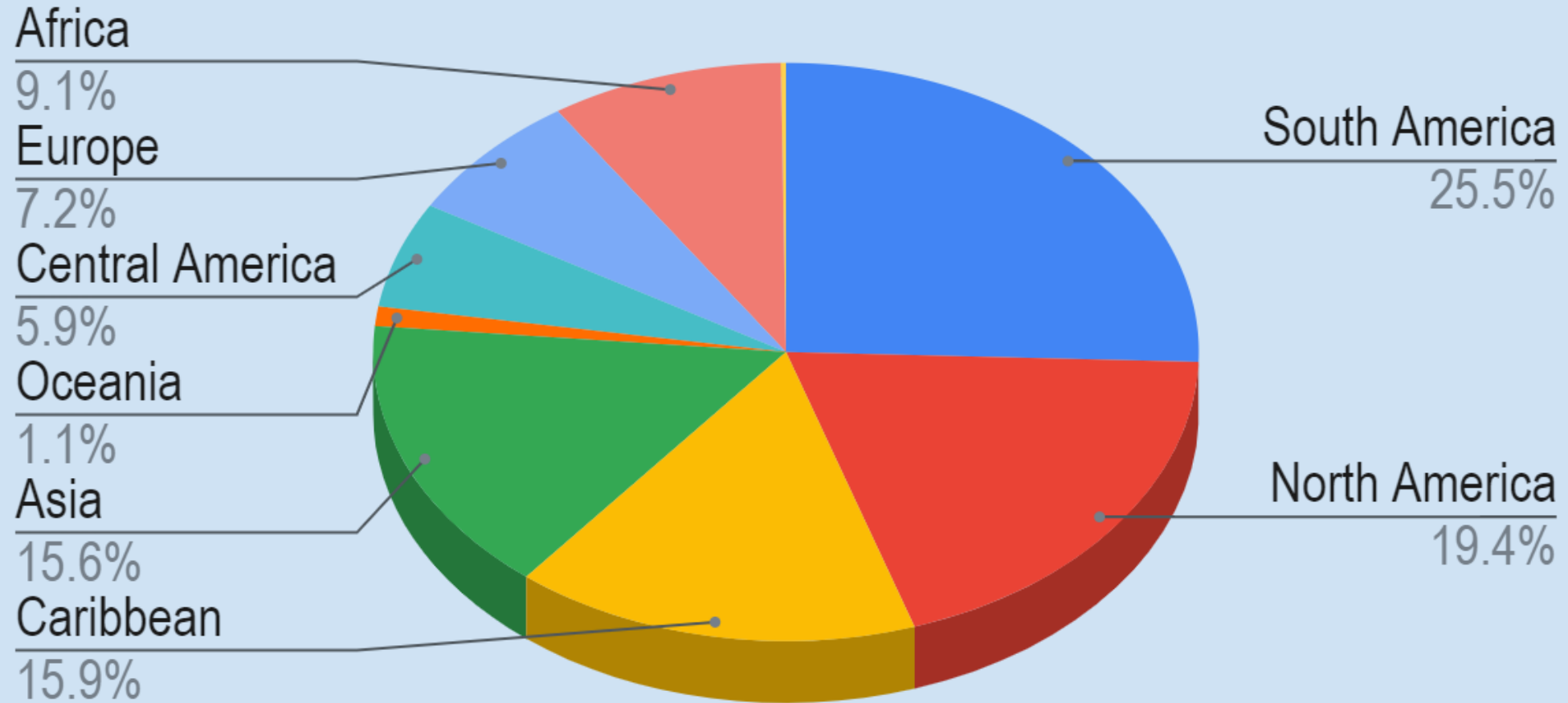
# First Outputs – Co-roosting

## Co-Roosting Roost types

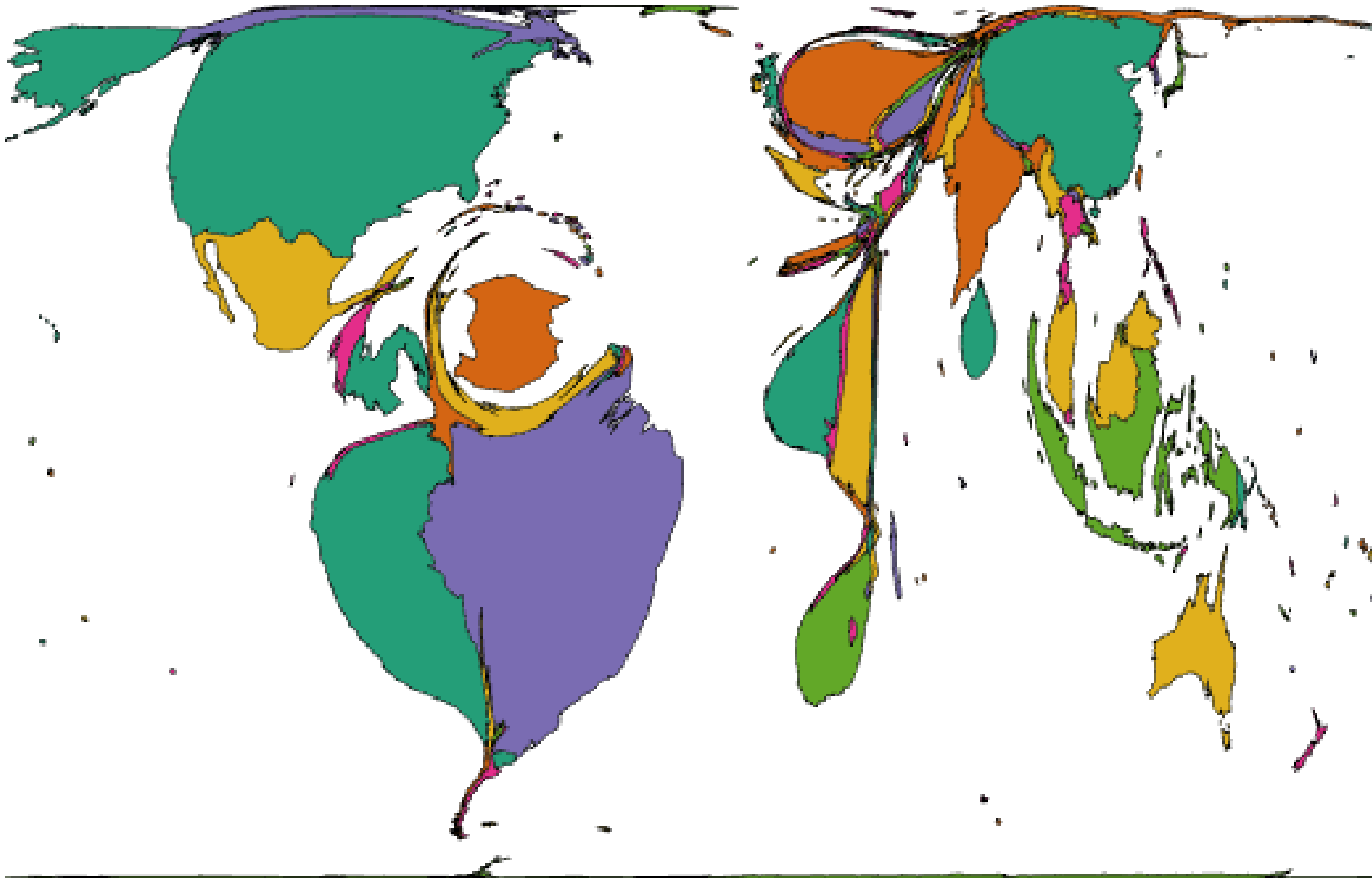


# First Outputs – Co-roosting

## Geographic Representation of Co-Roosting Data



# Data Distribution



A cartogram of co-roosting data for those records that have a specific country

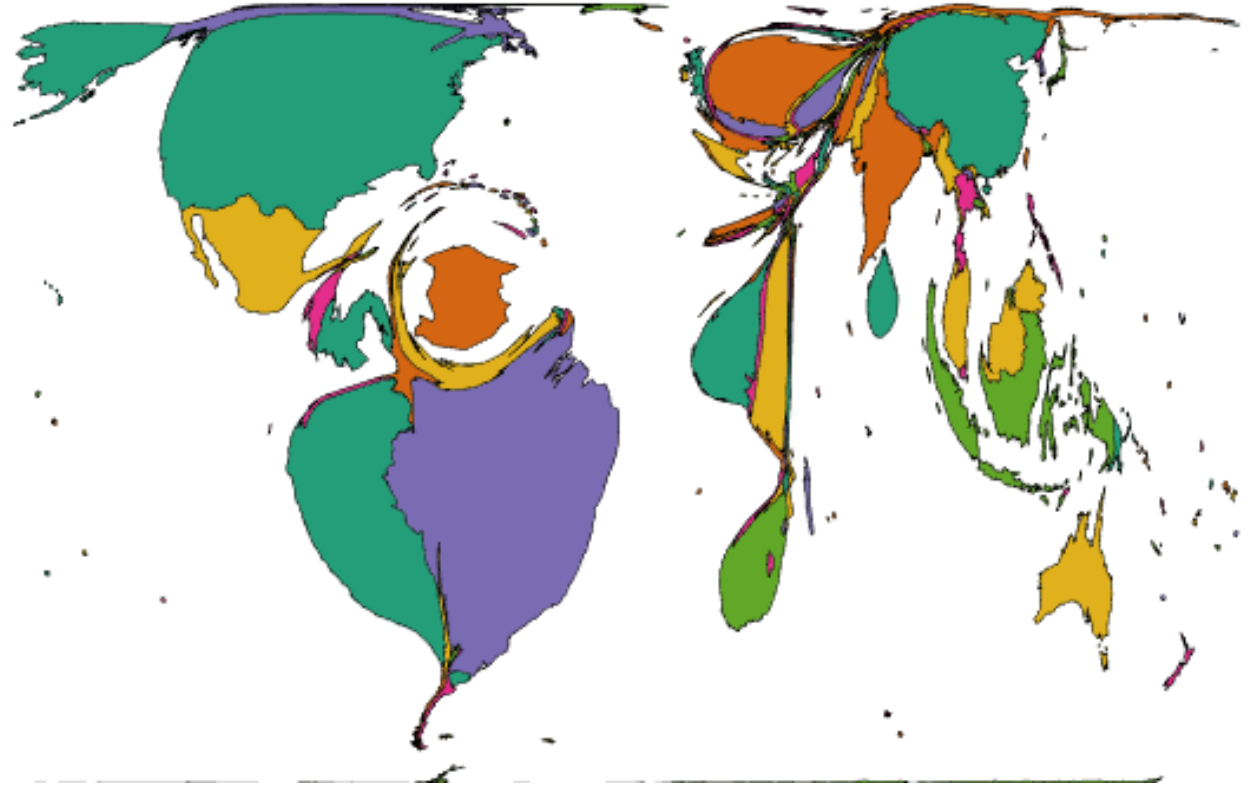
Gastner MT, Seguy V, More P. Fast flow-based algorithm for creating density-equalizing map projections. *Proc Natl Acad Sci USA* 115(10):E2156–E2164 (2018).



# Data Bias Relative to Species Richness

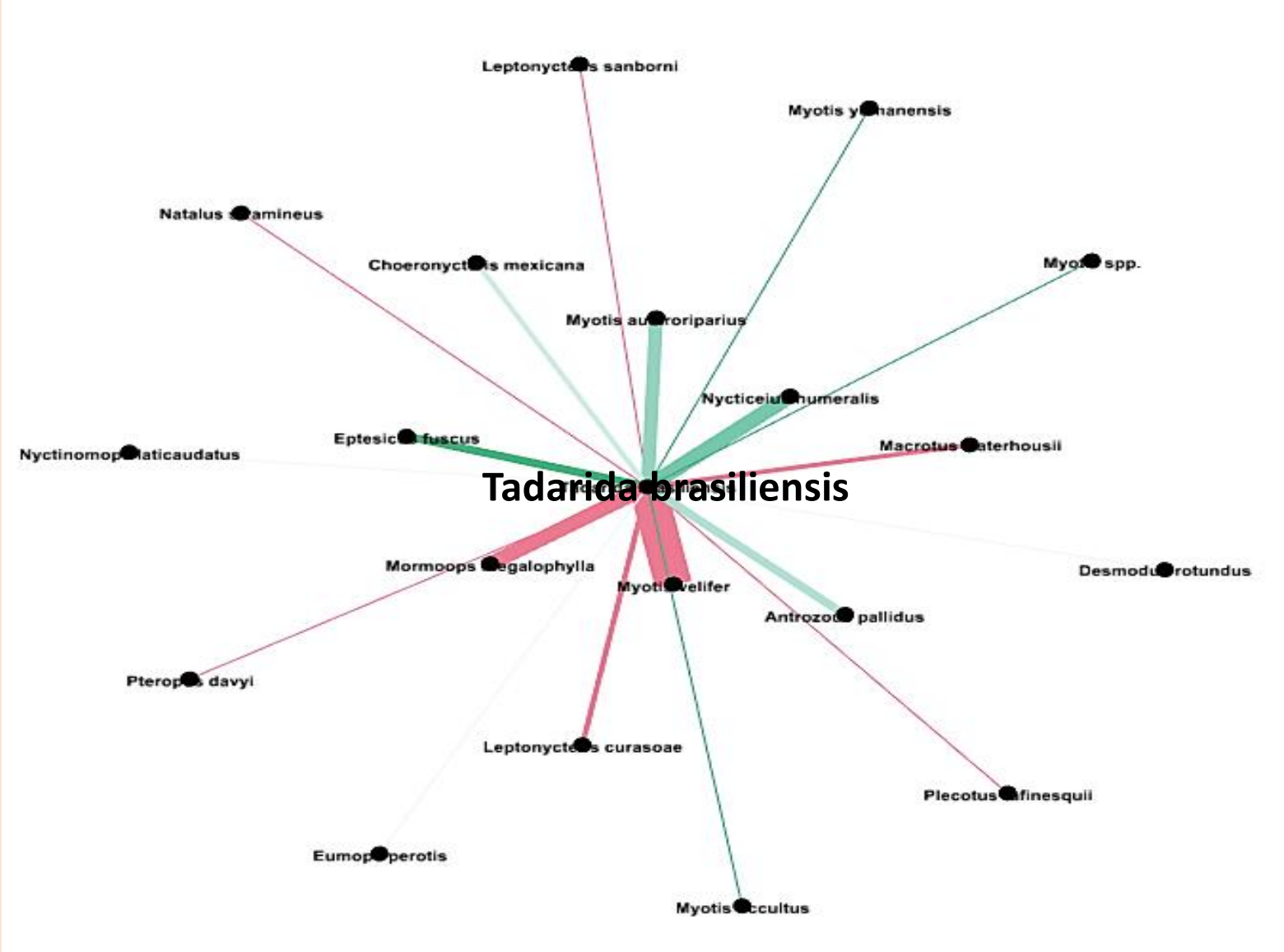


A cartogram of bat species richness  
Mammal Diversity Database v1.8



A cartogram of co-roosting data for those  
records that have a specific country

# Interactions with Context

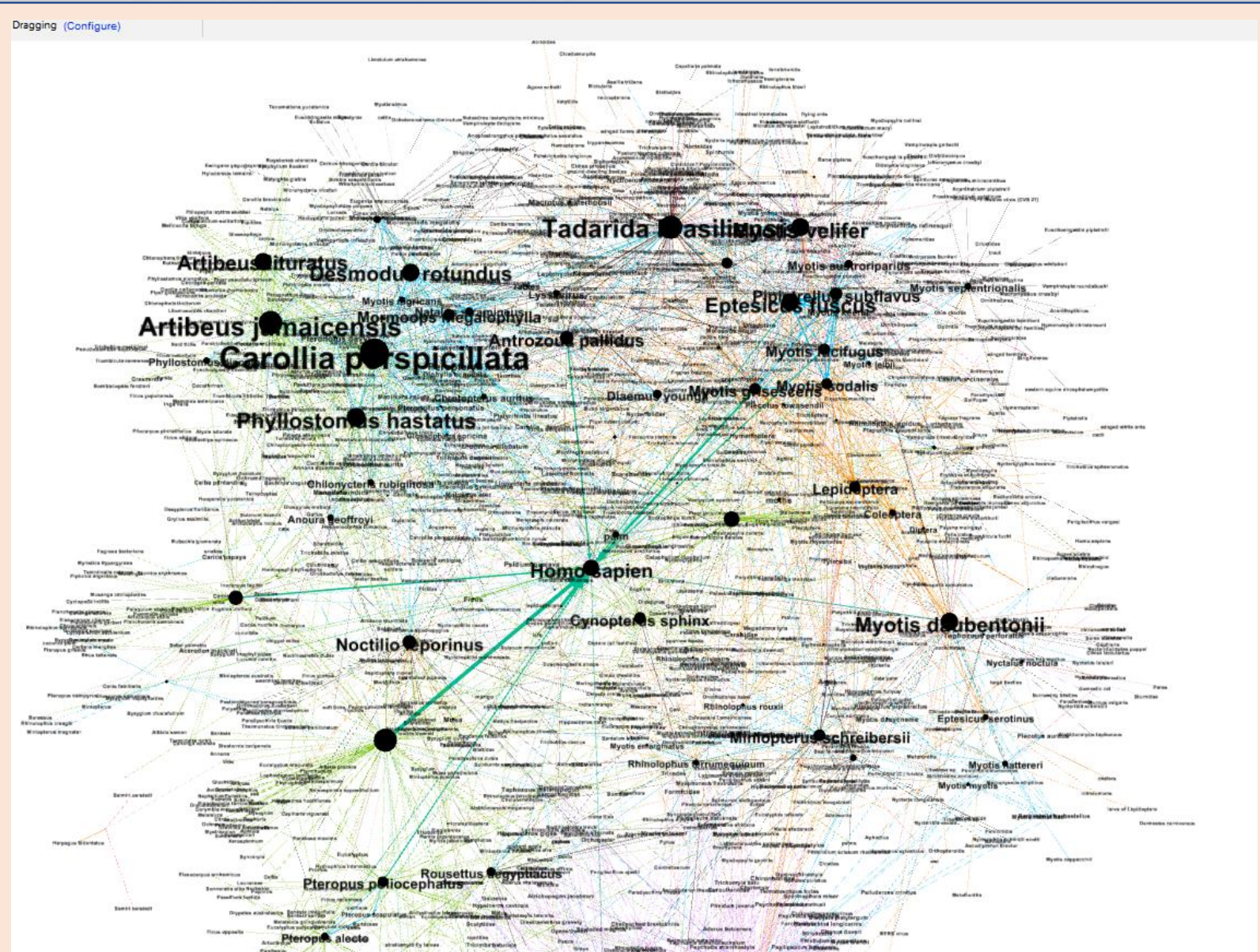


Tadarida brasiliensis co-roosting occurrences

occurrenceId
sourceTaxonName
targetTaxonName
interactionTypeName
interactionTypeId
Season
Start Month
Start Date
Start Year
Start Month
End Date
End Year
Country
localityName
synchronous_YN
contact_YN
roostCat1
ENVO_cat1
roostCat2
ENVO_cat2
roostCat3
ENVO_cat3
roostTaxon
InteractionText
TextType
roostUsageType
InteractionReferencePage
Basis of record
FrequencyofOccurrences
PlantTaxonName
Tags
Habitat
referenceDOI
referenceURL
referenceCitation
referencePage
referenceFileName
contributors



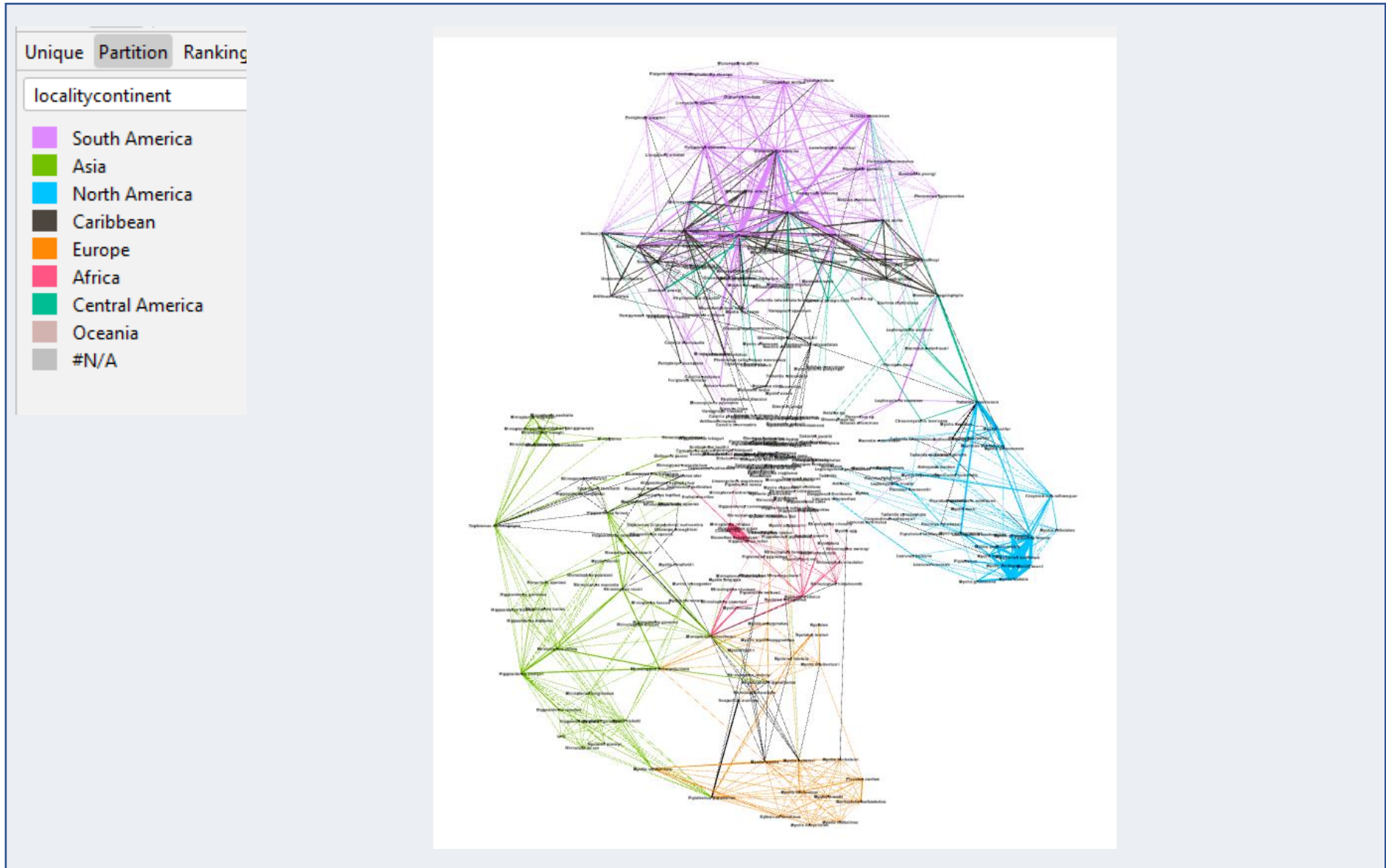
# Interactions with Context



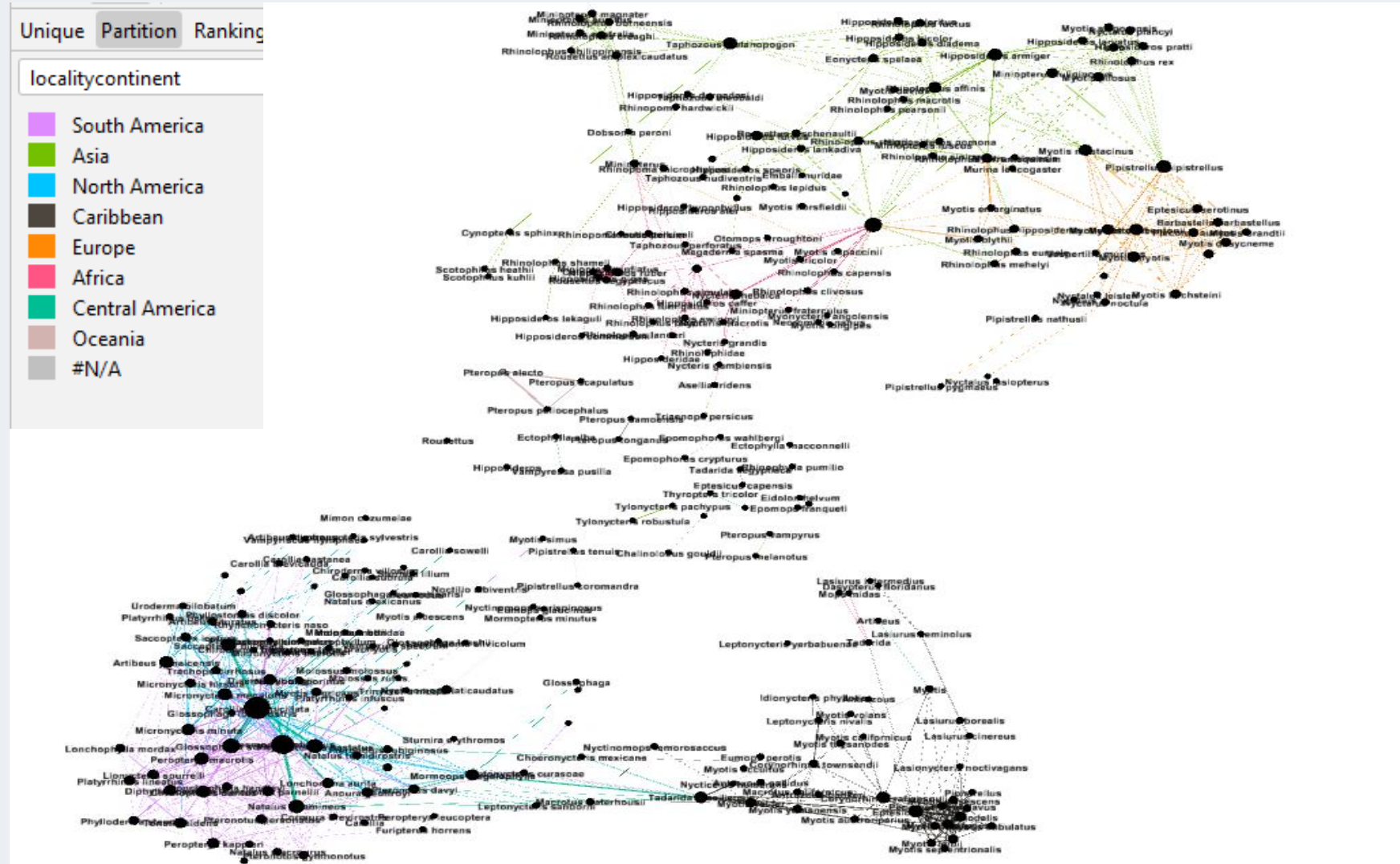
*Tadarida brasiliensis* all interactions



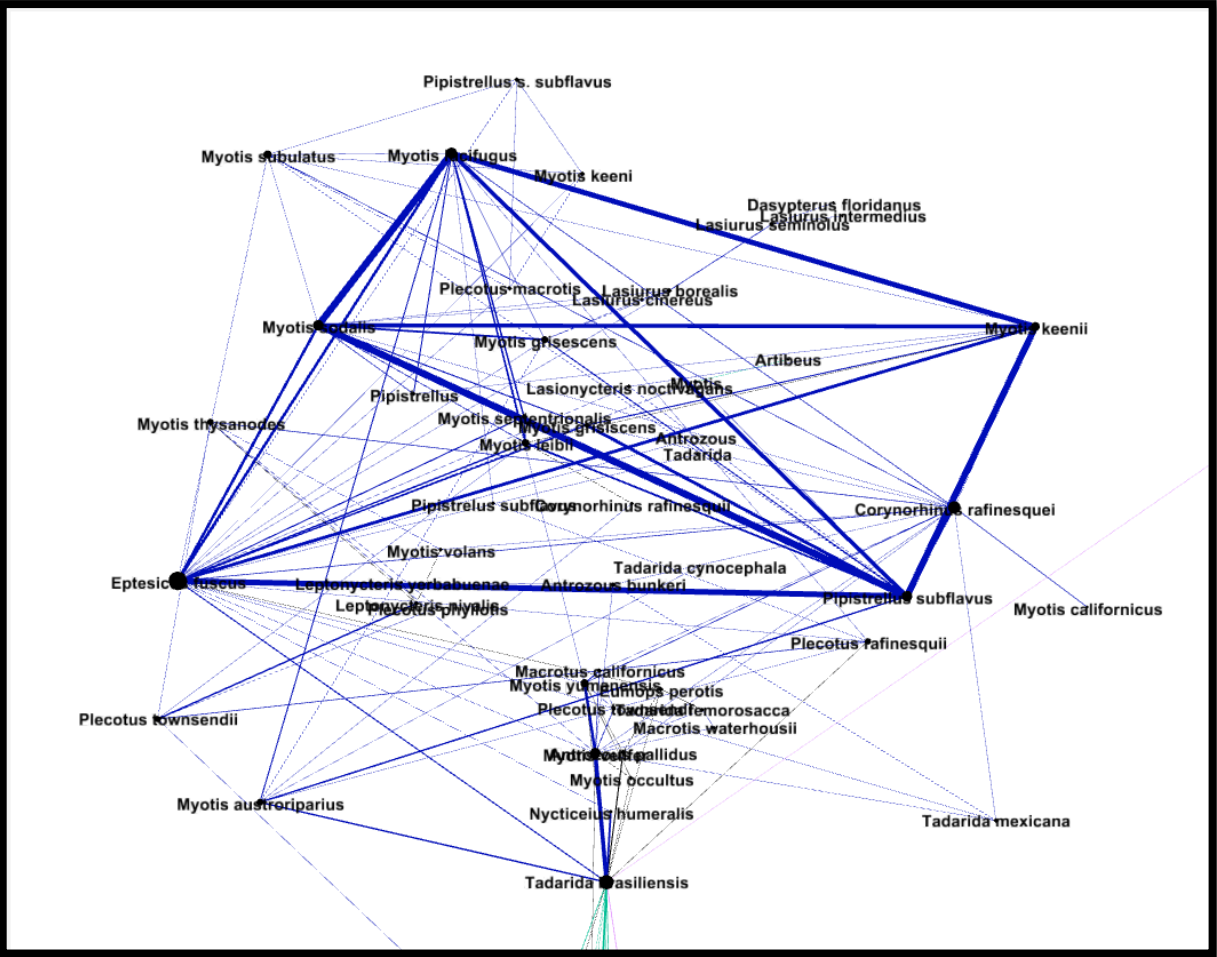
# Challenges and Opportunities with Taxonomy



# Challenges and Opportunities with Taxonomy

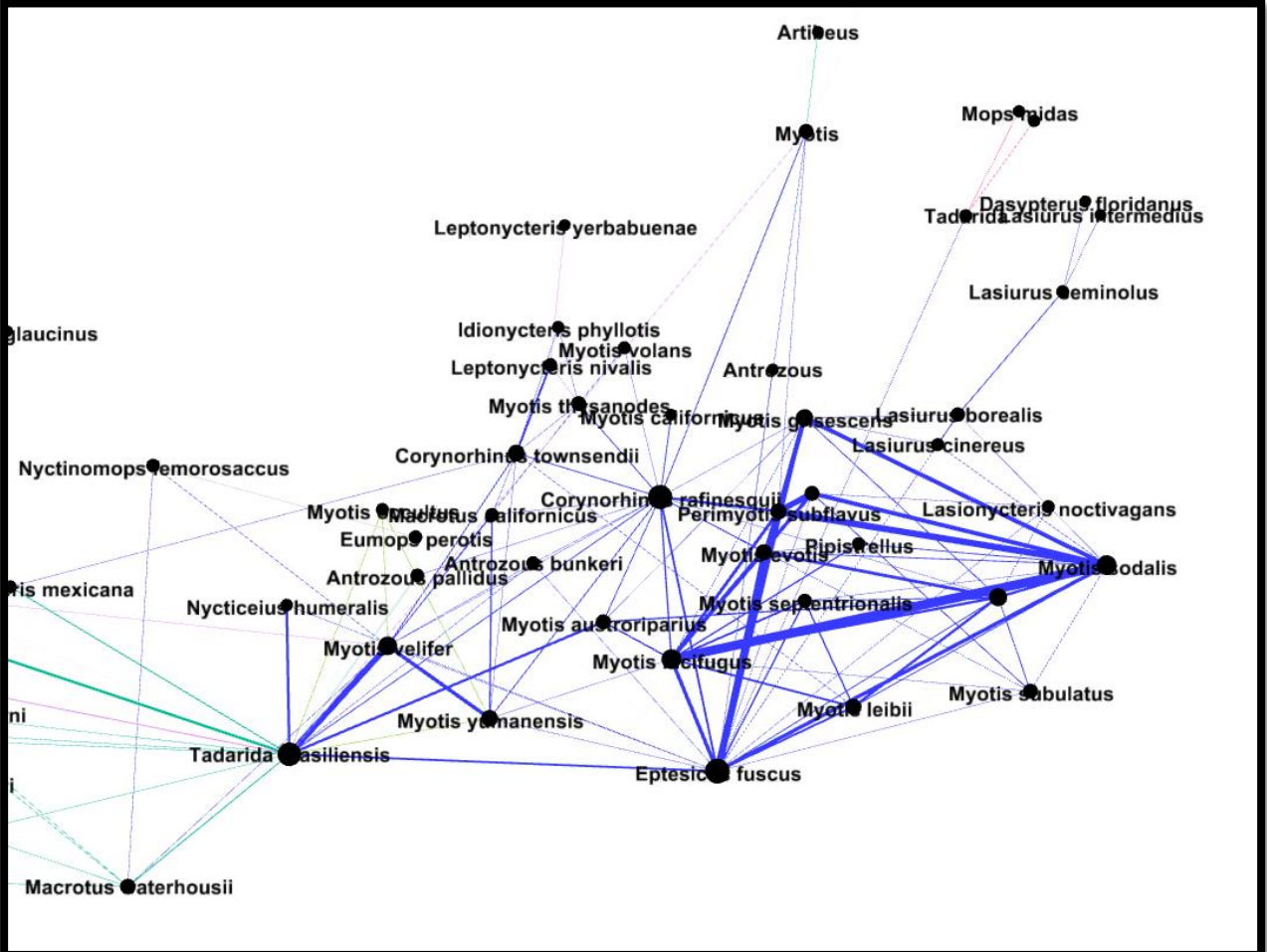


# Resolved Taxonomy



Before

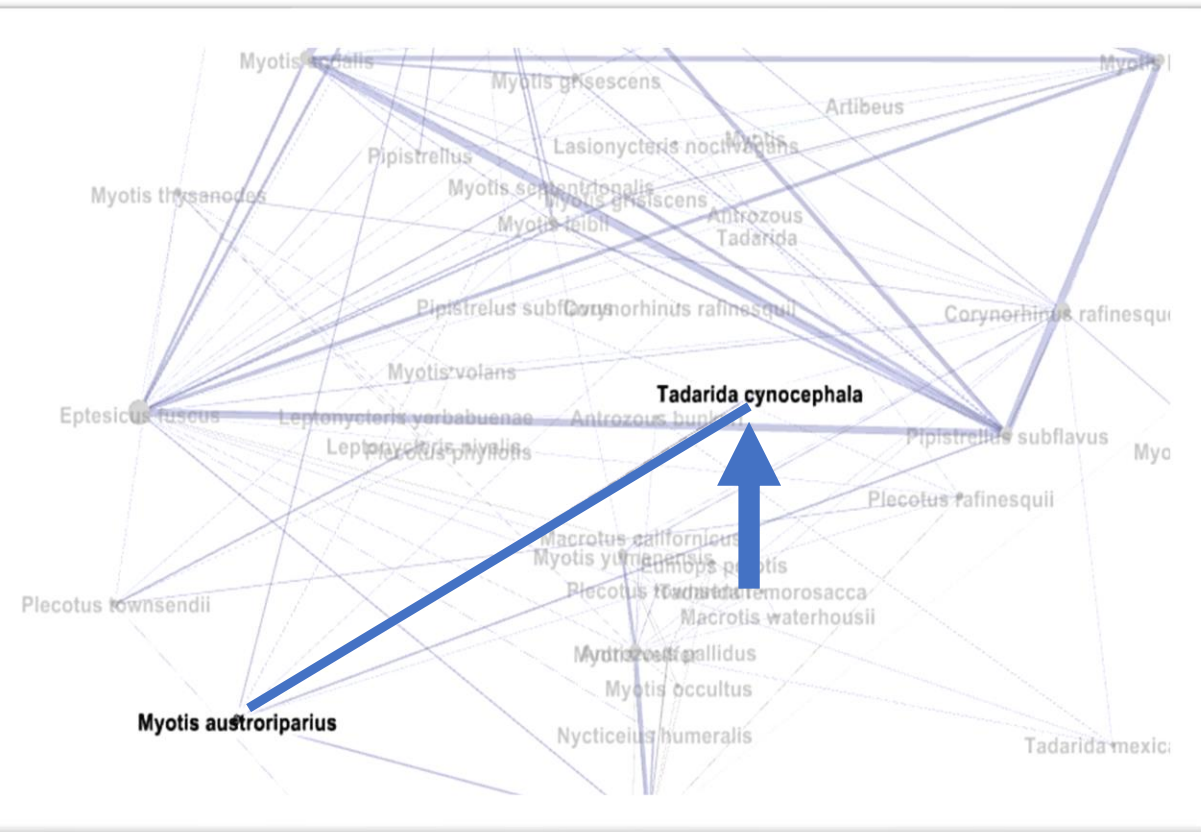
*Tadarida cynocephala* now considered a subspecies of *Tadarida brasiliensis*



After

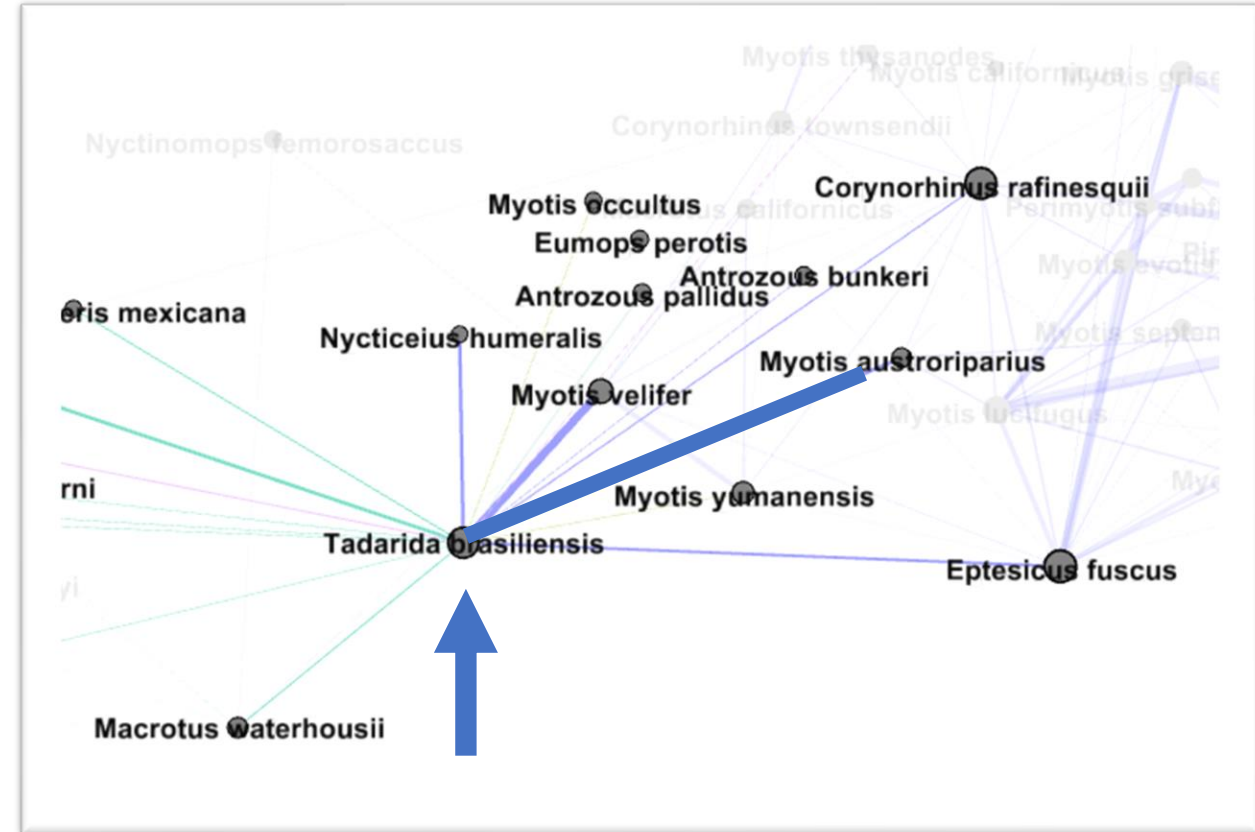


# Resolved Taxonomy



## Before

## Tadarida cynocephala now considered a subspecies of Tadarida brasiliensis



## After

# Next steps



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batbase.org

## Database Search

16451 Interactions | 533 Bat Species | 2551 Other Species | 722 Citations | 938 Locations in 119 Countries

?

Tutorial

i

Tips

☰

Lists

↺

Group Interactions by:

Taxon

View:

Bats

⏏

Filters

↺

📍

Map Interactions

📄

CSV

+

New

👁

Review

🔄

?

Select List of Interaction Data

Select Interaction List

Load Interaction List in Table

List Details

List Name:

Display Name

Interactions:

Description:

Description

Modify List Data

Add Interactions to List:

☐ All Shown
☐ Select Rows
☐ Enter IDs

Unselect All

Delete

Save List

?

Taxon Filters

Species:

Select Species

Genus:

Select Genus

Family:

Select Family

Name:

Taxon Name (Press Enter to Filter)

Select Taxon Group

☐ Show interactions

published

after:

Apply

Save

Select Filter Set

Name:

Filter Name

Delete

Description:

Filter Description

Saved Filter Sets

?

# Next steps – Teaching the robots





# Next steps

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Questions?

Contact details



# CETAF-DISCO COVID-19 TASKFORCE



# Next steps

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- Identify areas of the world where data are lacking
- Teach AI data collection process
- Generalism vs. specialism of roosting behavior
- Demonstrate social-economic challenges in transcribing literature
- Demonstrate the varied skills needed to build a species interaction datas
- connect them to other cyber infrastructure like taxonomic systems, geo-spatial coding schemes (e.g., geonames), ontologies