

# [tiny.cc/2019BEF](https://tiny.cc/2019BEF)

## Tools for Integrating Remote Sensing and Organismal Occurrence Data Streams

NASA BEF Breakout Round 4: Trainings and Tutorials

22 May 2019

3.50-4.30pm & 4.45-5.25pm

While you are waiting:

- 1) Create an account at [auth.mol.org/register](https://auth.mol.org/register)
- 2) Go to [tiny.cc/2019BEF](https://tiny.cc/2019BEF)

# Tools for Integrating Remote Sensing and Organismal Occurrence Data Streams

AIST-16-0092

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# Tools for Integrating Remote Sensing and Organismal Occurrence Data Streams



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## AIST Program Objectives

- Reduce the risk, cost, size, and development time for Earth science space-based and ground-based information systems,
- Increase the accessibility and utility of science data, and
- Enable new observation measurements and information products.

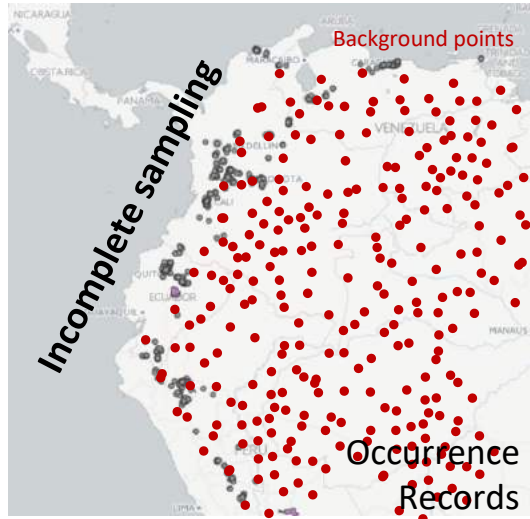
# Break the 80/20 rule



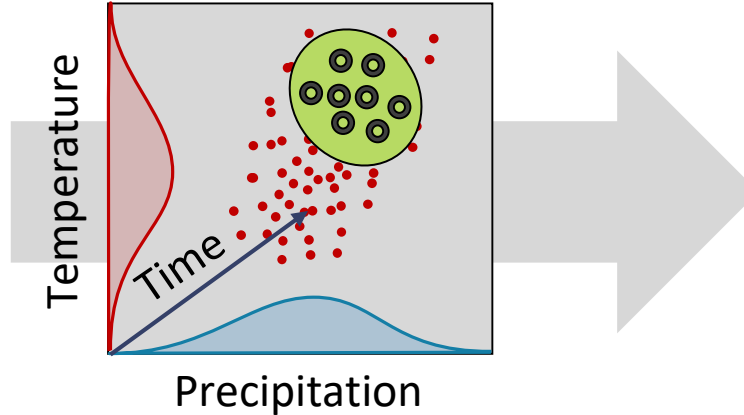
80% of a data scientist's time is spent finding, cleansing, and organizing data, leaving only 20% to actually perform analysis ([IBM 2019](#))



# Environmental Niche Modeling



Niche model in  
“Environmental Space”



***“Species Distribution Modeling”.*** Google Scholar: 3.5m results (74k since 2018)!

***Many ways to use these data***

(maxent and friends)

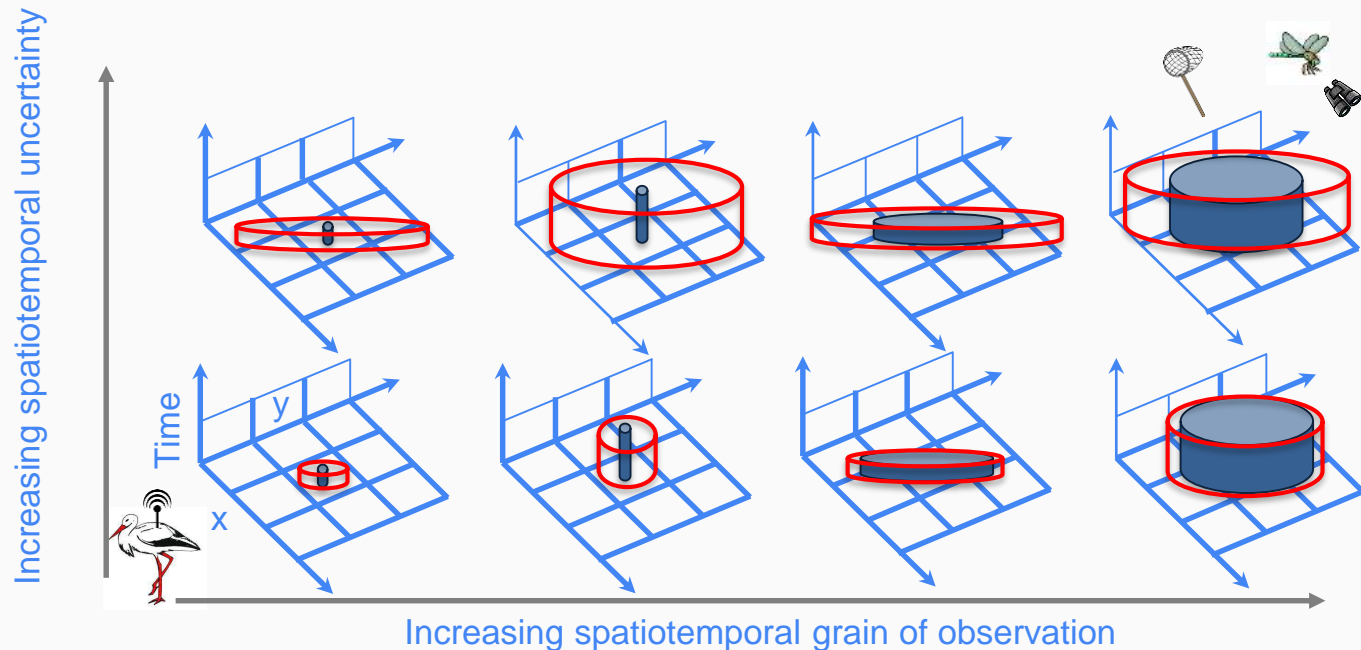
# Integrating species occurrence and environmental data is not trivial.



Observation Grain  
Locational Uncertainty

Spatio-temporal grain and uncertainties

- Occurrence record
- Environmental data



# Integrating species occurrence and environmental data is not trivial

American Badger  
*Taxidea taxus*



[login/register](#) [en](#) [de](#) [es](#) [fr](#) [zh](#)

Species Home

Summary Map

Detailed Map

Projection

Search for a species

## American Badger

*Taxidea taxus*

| Mustelids

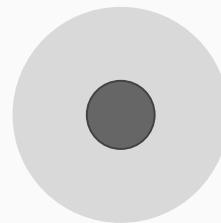
Least Concern (IUCN 2016)



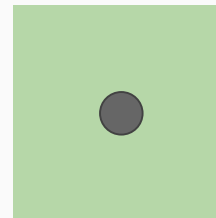
### Sources

- ☒ [Point observations](#)
- ☒ [Expert range maps](#)
- ☒ [MOL grid of IUCN](#)
- ☒ [Local inventories](#)
- ☒ [Regional checklists](#)

	1,279		
	1		
	1		
	1,197		



Spatiotemporal  
Uncertainties  
(location error)



Grain of  
Observation





# Motivations for cloud-based environmental annotation

## 1. Massive data of varying type

- a. Digitized specimen records
- b. Camera traps data
- c. GPS tags (ICARUS)
- d. Citizen science records



## 1. Observation-level uncertainties and grains (space and time)

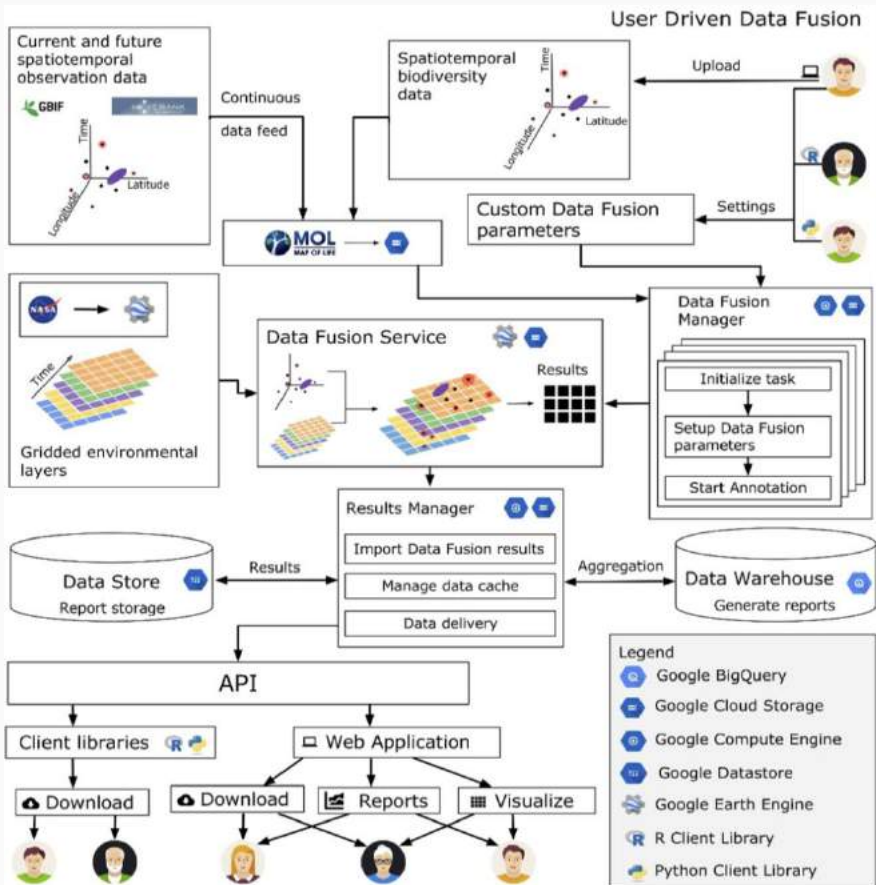
Need to be accounted for in annotation

## 1. Need for dynamic annotation

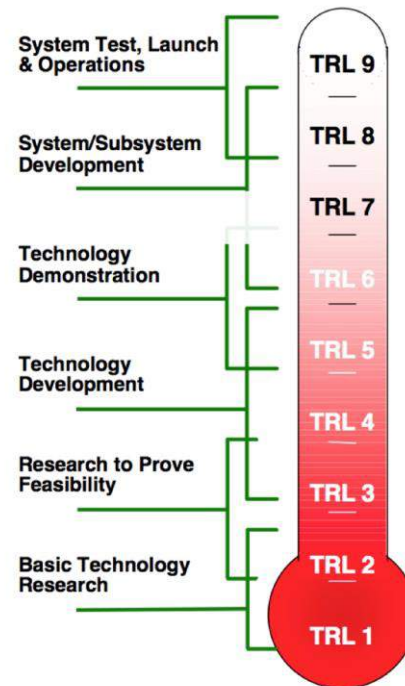
- a. Temperature on the day of observation?
- b. Long-term mean conditions?
- c. Environmental Anomalies?



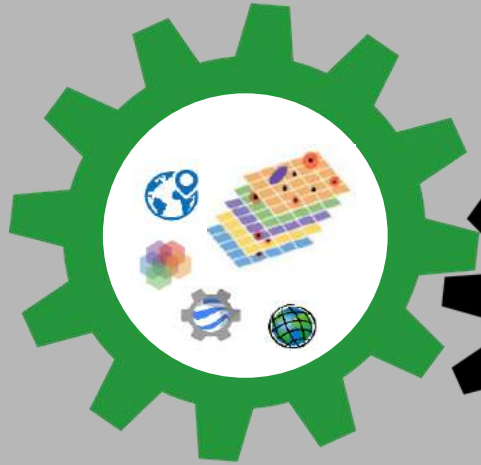
# AIST Project Overview



## NASA Technology Readiness Level (TRL)



This Project



Back End

Front  
End  
(GUI)



# Today's Tutorial

## Data Upload

Upload a sample species occurrence dataset

## Annotation

Annotate it with various environmental data

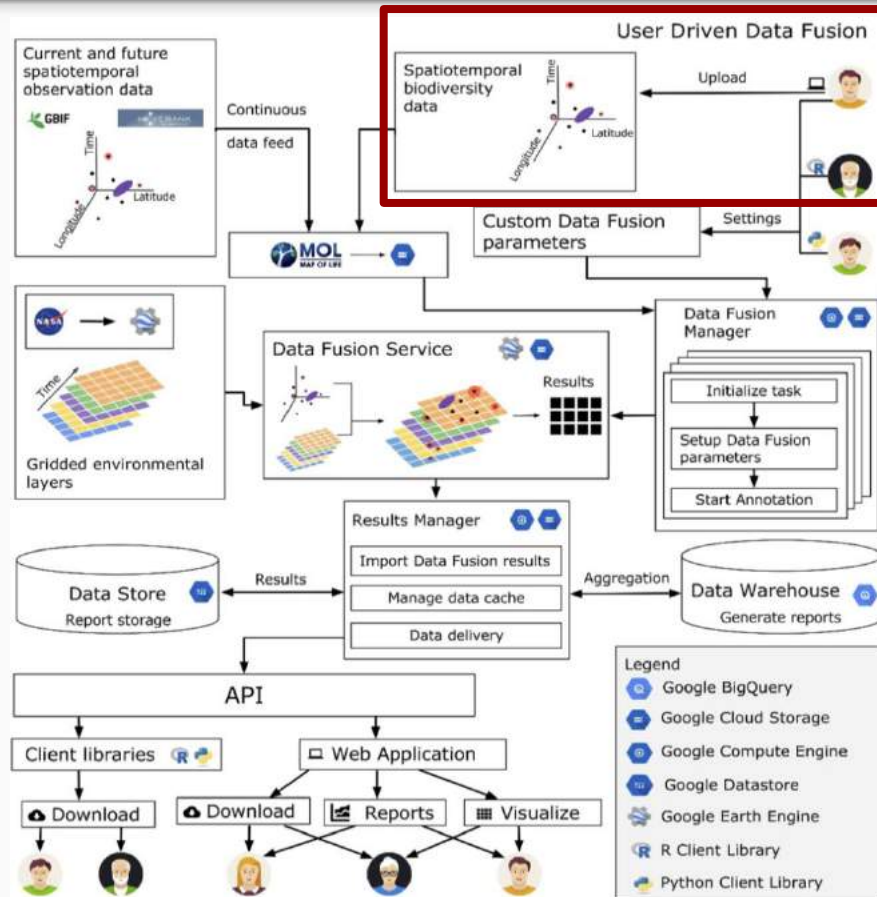
## Data Download

Download the annotated data for further processing

## Survey

Complete a survey about the design and utility of this application

# Project Overview: Data Input





# A simple, step by step upload system

<https://mol.org/upload-dev>



Logged in as: [Adam Wilson](#) en-US es



Species



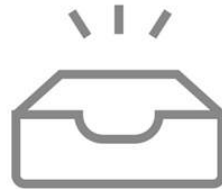
Locations



Indicators



Patterns




You don't have any datasets yet.



Upload Data

# Upload - Locate local file



Logged in as: [Adam Wilson](#) [en-US](#) [es](#)

[Species](#) [Locations](#) [Indicators](#) [Patterns](#)

[< Back to Datasets](#)

1

2

3

4

5

Basic Information — Upload Files — Match Columns — Review Geometry — Metadata

## Basic Information


**Taxonomic Group**  
Mammals

Select from the list of groups currently supported by MOL

**Dataset Type**  
Occurrence

Occurrence or Inventory

Next

 **Instructions**



## Match Columns

We have detected columns that may match Map of Life field names. Please verify that column names were matched correctly using the drop-down menus below.

**Match "scientificName" to:**



scientificname

**Match "family" to:**



family

**Match "decimalLatitude" to:**



decimal\_latitude

**Match "decimalLongitude" to:**



decimal\_longitude

**Match "coordinateUncertaintyInMeters" to:**

Cancel

Done

ed in as: [Adam Wilson](#) en-US es




Indicators



Patterns

Use example  
dataset available  
on website

# Upload - Matching Successful, move to finalization



Logged in as: Adam Wilson ▾ en-US es

Species

Locations

Indicators

Patterns

[< Back to Datasets](#)

✓

✓

3

4

5

Basic Information — Upload Files — **Match Columns** — Review Geometry — Metadata

## Match Columns


Please match the column names in the upload file to the standardized field names used by Map of Life. The following terms are required: **scientificname**, **date**, **decimal\_latitude**, **decimal\_longitude**.

✓ Columns matched!

Match Columns


Back

Next

 Instructions

▼


# Uploader - Review Geometry





Logged in as: [Adam Wilson](#) en-US es


[Species](#) [Locations](#) [Indicators](#) [Patterns](#)


[< Back to Datasets](#)

 [Basic Information](#)

 [Upload Files](#)


 [Match Columns](#)

 **[Review Geometry](#)**

 [Metadata](#)

## Review Geometry


Map Satellite



[Show a menu](#)



# Upload - Dataset Metadata



Logged in as: **Adam Wilson** • en-US es

Species

Locations

Indicators

Patterns

[< Back to Datasets](#)

✓

✓

✓

✓

5

Basic Information — Upload Files — Match Columns — Review Geometry — **Metadata**

## Metadata

Required Info

**Title** ⓘ \*REQUIRED  
Example Badger Dataset

**Description** ⓘ \*REQUIRED  
Example data

**Geographic Coverage** ⓘ \*REQUIRED  
North America

Permissions ⓘ

☐ Make available for MOL internal use in models ⓘ

☐ Make publicly visible ⓘ

☐ Publish data ⓘ

play a menu

Uncheck  
permissions so the  
data isn't published

# Upload - Available Datasets



Logged in as: [Adam Wilson](#) en-US es

 Species

 Locations

 Indicators

 Patterns

## Available datasets

[< Upload Data](#)

Filter by dataset type

All



Example Badger Dataset

 PRIVATE

 QUEUED

Wait until the data are processed

# Upload - Overview



Logged in as: Adam Wilson ▾ en-US es

Species

Locations

Indicators

Patterns

## Example Badger Dataset

< Back to Datasets

Annotate

Harmonize

Delete

This dataset isn't finalized yet! This means: occurrence and inventory datasets will **not show on any MOL apps**.

🔒 This dataset is **private**. Click the **Permissions** tab below to change dataset permissions.

<

Overview

Map

Metadata

Permissions

Published Data

>

GROUPS

1

SPECIES

1

RECORDS

1611

### Species Groups

	Group	Count
	mammals	1

### Species

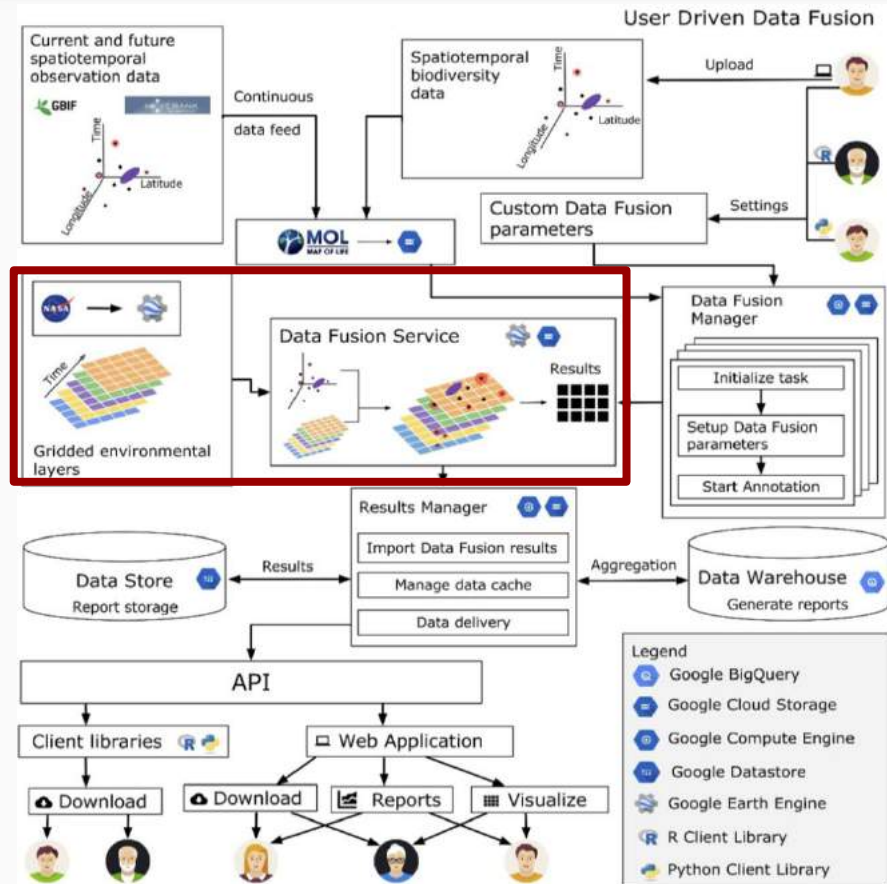
	Species	Count
	American Badger <i>Taxidea</i>	1611

### Latest Records

	Species	Event date
	American Badger <i>Taxidea</i>	2018-08-26

If you don't see the "Annotate" button, confirm you are at [mol.org/upload-dev](https://mol.org/upload-dev)

# Project Overview: Biodiversity-relevant remote-sensing - derived layers



Environmental data availability increasing rapidly

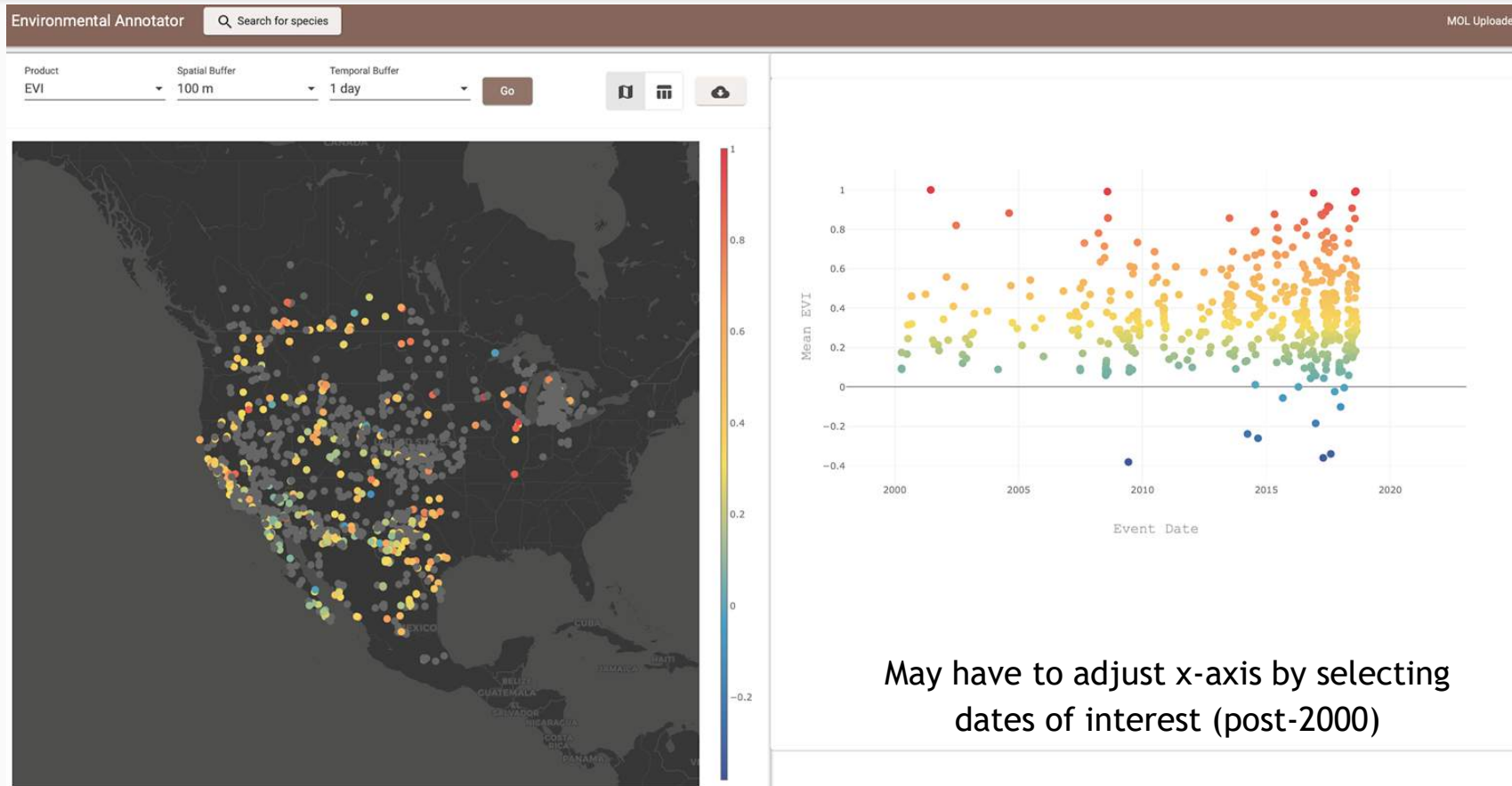
Current:

- MODIS EVI
- CHELSA

Planned:

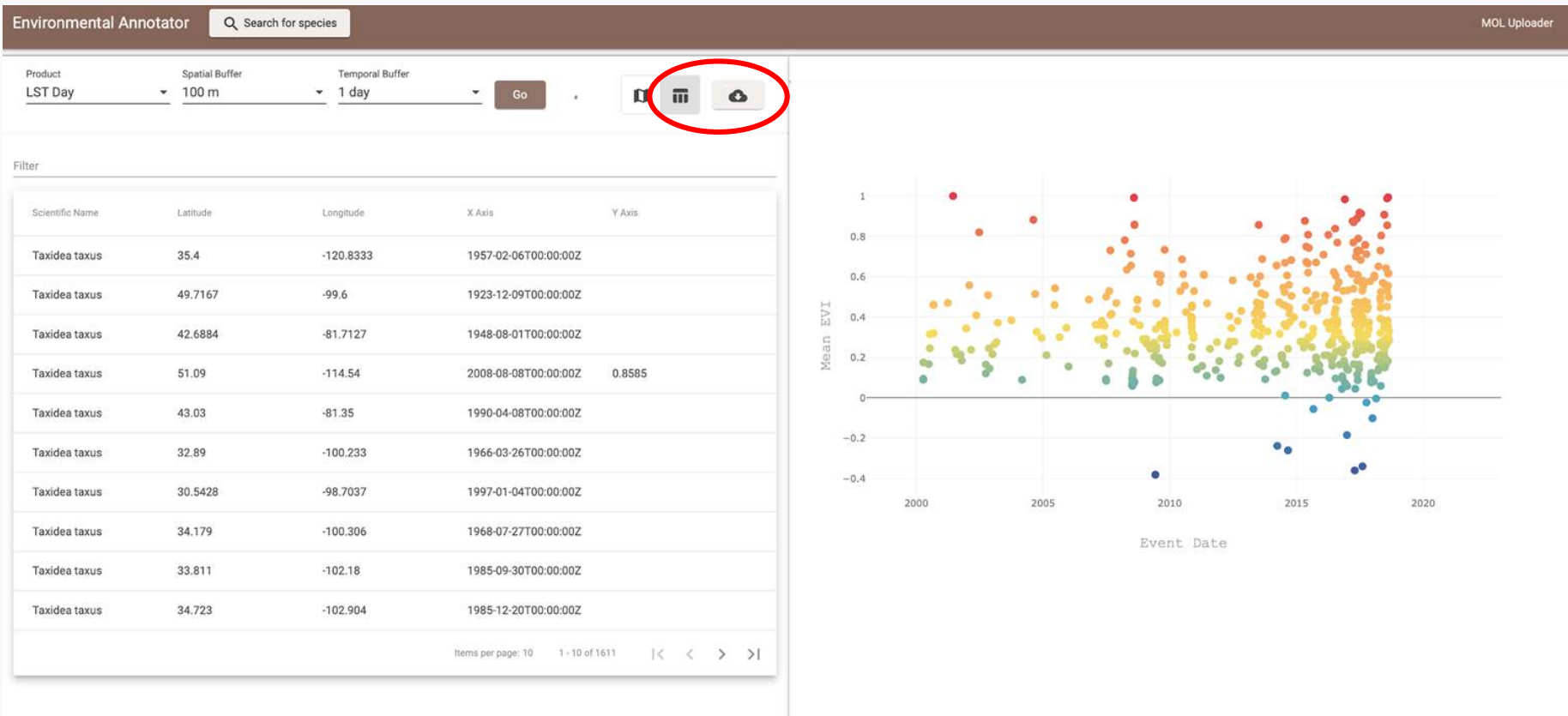
- Radar-derived forest cover
- Evapotranspiration
- Global 30m DEM
- Surface Water

# Environmental Annotator





# Environmental Annotator - EVI

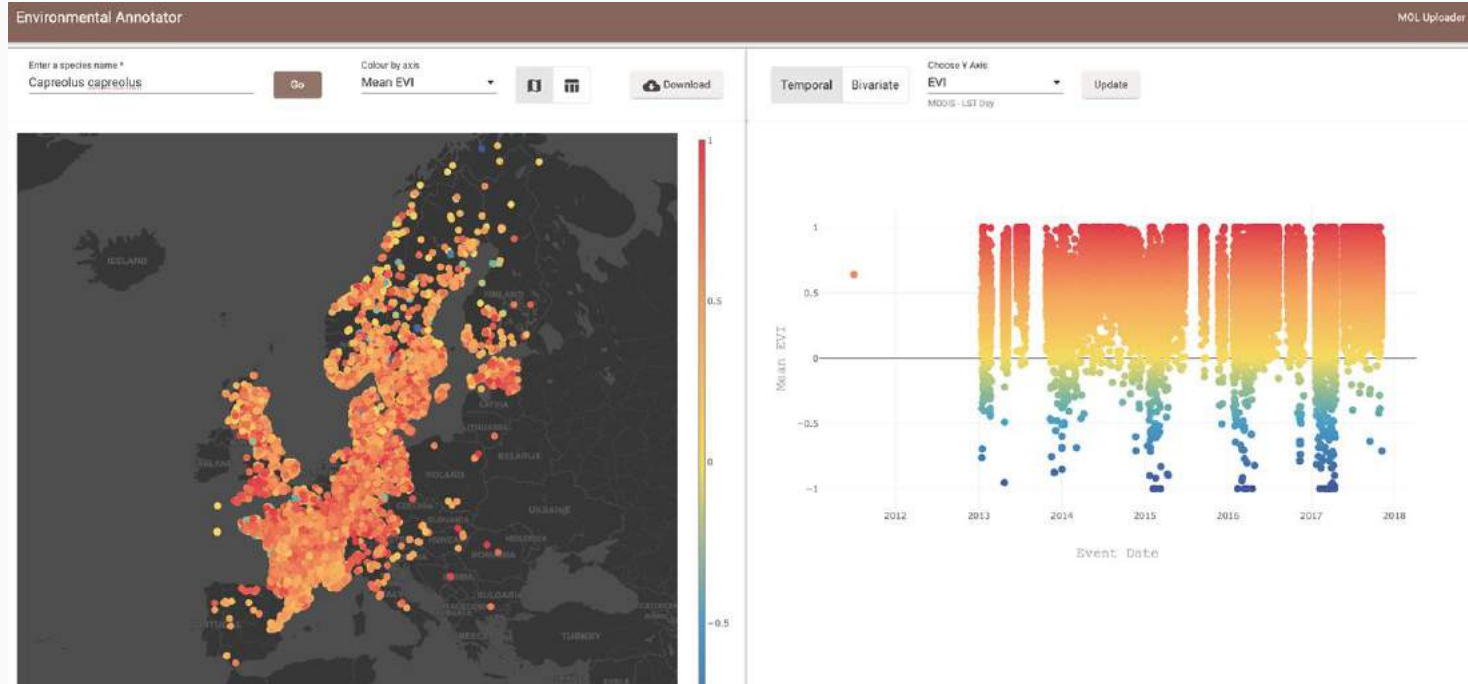


# Environmental Annotator

<https://mol.org/nichemunk>

Roe Deer  
*Capreolus capreolus*

Or select any  
desired mammal  
species.





## Environmental Annotator

MOL Uploader

Enter a species name \*

*Capreolus capreolus*

Go

Colour by axis

MODIS - LST Day



Download

Temporal

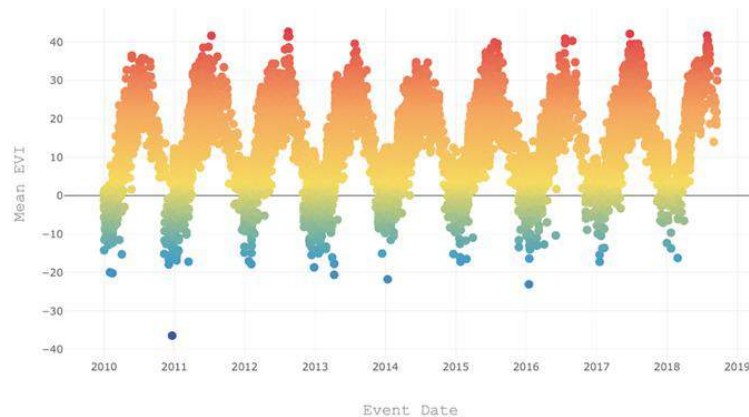
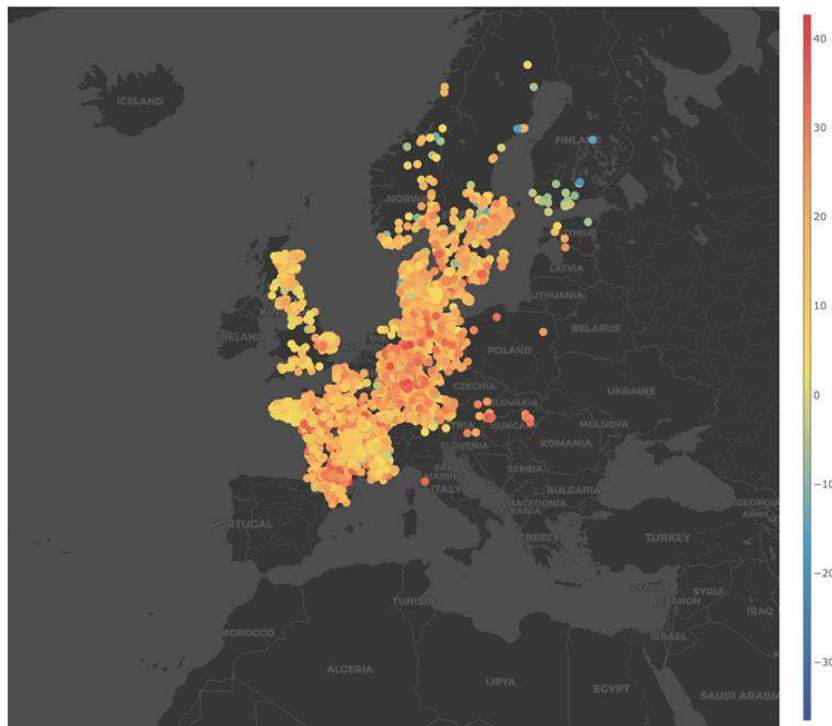
Bivariate

Choose Y Axis

LST - Day

Update

MODIS - LST Day



# Environmental Annotator

## Environmental Annotator

MOL Uploader

Enter a species name \*

Taxidea taxus

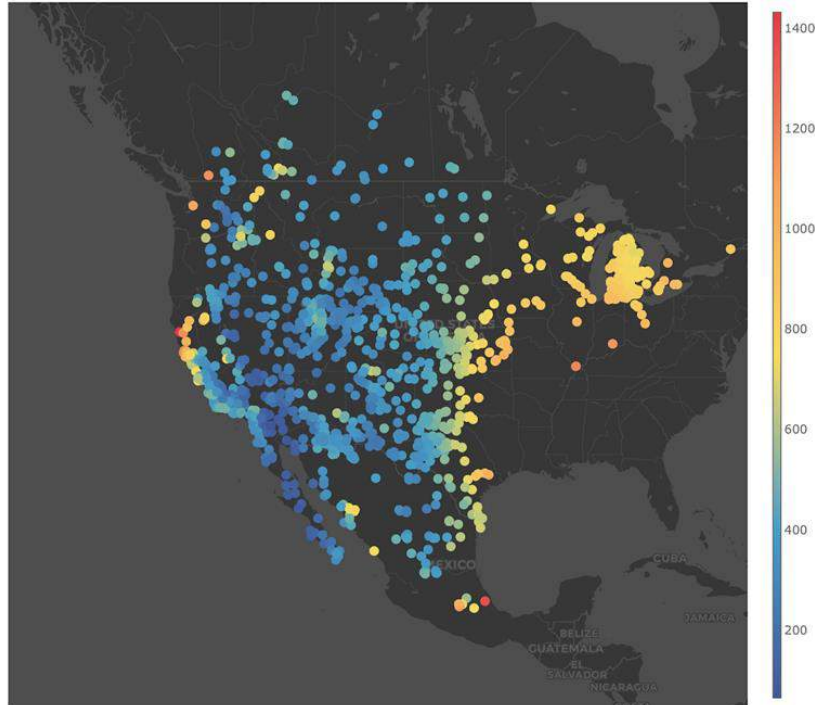
Go

Colour by axis

Annual Mean Precipitation - Mean



Download



Temporal

Bivariate

Choose X Axis

Mean

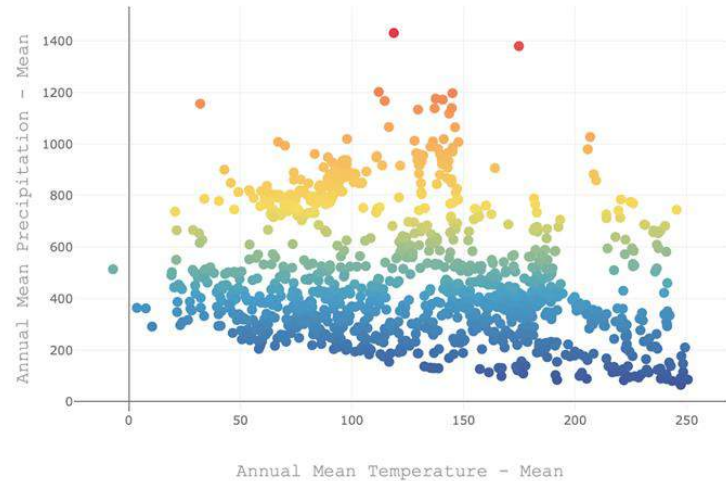
Annual Mean Temperature - Mean

Choose Y Axis

Mean

Annual Mean Precipitation - Mean

Update



# Phase II

## Characterize the available habitat

Background points

## Environmental data availability

Increased options for environmental data products

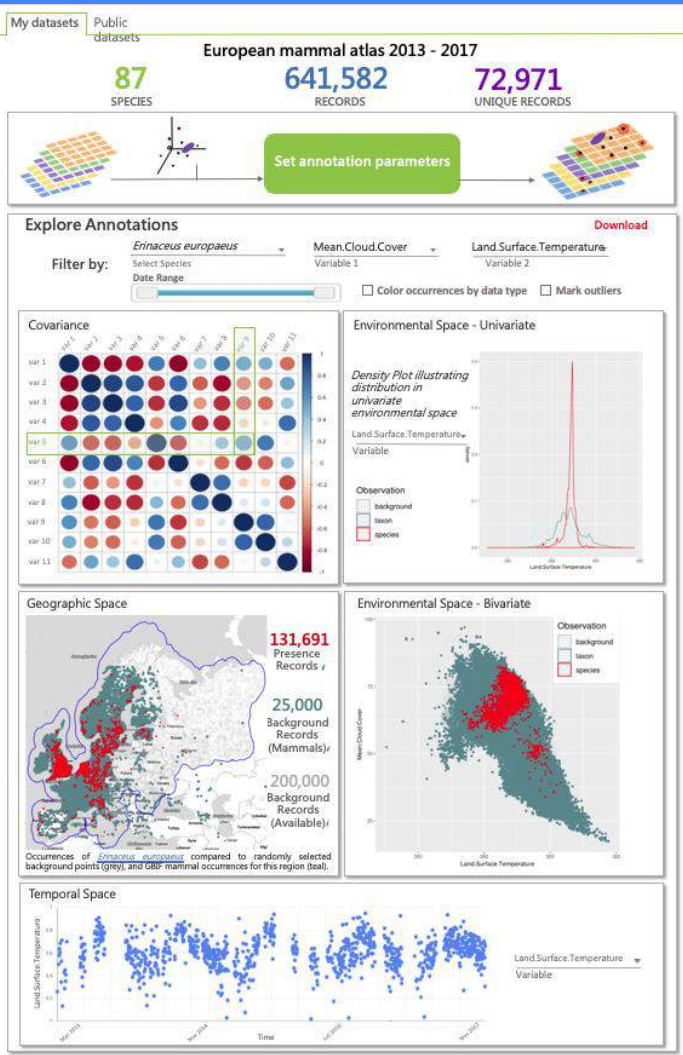


## Spatial and temporal aggregation

Increase the options for spatial and temporal aggregation

## Exploratory Data Analysis and Variable Selection

Preliminary comparisons of environmental datasets to guide user through variable selection





# Products to be included in Phase II

Type	Product	Platform / Sensor / Product	Archive <sup>1</sup>	Resolution <sup>2</sup>		Domain
				Temporal	Spatial	Temporal
Terrestrial	Surface Reflectance	Landsat 4-8	D E G	16 days	30m	1982
		MODIS (MCD43A2)	D G	Daily	250m	2000
		ASTER	D G	16-day	15-30m	2000
		Sentinel 2	D G	10-day	10-60m	2014
		Airbus SPOT ( <u>OneAtlas</u> )	D	Once	1.5m	2015
		Airbus Pléiades ( <u>OneAtlas</u> )	D	Once	0.5m	2015
	Vegetation Indices (NDVI/EVI)	MODIS (MOD13)	G	8-day	250m	2000
		Descartes MODIS 16-day VI	D	16-day	250	2000
	Land Cover	MODIS (MCD12Q1)	D G	Annual	1km	2001
	Land Cover Dynamics	MODIS (MCD12Q2)	D G	Annual	1km	2001
Freshwater	Surface Water	JRC Global Surface Water	G	Monthly	30m	1984
		MOD44W Surface Water	G	Annual	250m	2000
Marine	World Ocean Atlas	Temperature, Salinity, Oxygen; others	E	Decadal	25km	1955
	NOAA OI SST	Sea Surface Temperatures	E	Daily	25km	1981
	Sea Surface Temperatures, Topography, <u>Colour</u>	Sentinel-3	D G	1-2 days	300m - 1km	2014
		MODIS Aqua	G	Daily	1km	2001
		MODIS Aqua	G	Daily	1km	2001
		Various	HYCOM + NCODA	E	~10km	2008
Climate	Various Climate Variables	TerraClimate	G	Monthly	1km	1958
	Temperature	<sup>3</sup> CHELSA / <u>EarthEnv</u>	G	Daily	1km	1979
	Precipitation	<sup>3</sup> CHELSA/ <u>EarthEnv</u>	G	Daily	1km	1979
	Growing Degree Days	CHELSA Derived	G	Monthly	1km	1979
	Land Surface Temperature	MODIS (M* <u>D11A1/A2</u> )	D G	8-day	1km	2000
	Thermal IR	ASTER	D G	16-day	90m	2000
	Cloud Cover	<u>EarthEnv</u>	G	Monthly	1km	2000

# We want your feedback! Please fill out the survey!

## Workshop Feedback

Software Workflows and Tools for Integrating Remote Sensing and Organismal Occurrence Data Streams to Assess and Monitor Biodiversity Change

Select variables and spatial resolutions that are important for your work.

	15m	30m	250m	1km
Vegetation Indices / NPP / GPP	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Land Cover Classification (e.g. forest, urban)	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Continuous Vegetation Fields (e.g. % forest)	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Land Surface Temperature	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>

Please provide feedback on the current prototype and offer suggestions about what else this tool *should* do.

Direct survey link here

<https://forms.gle/pxu69giSBmUvwYDMA>





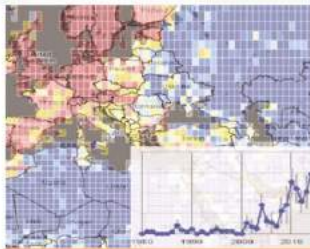
### Map species

Views species range map, inventory, and occurrence data



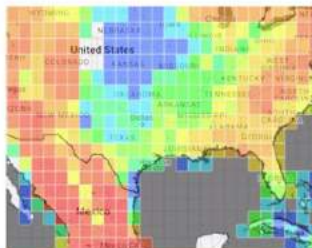
### Species by location

Select a location, filter by distance or group, and view a list of species along with source data



### Indicators

Explore trends in biodiversity knowledge, distribution, and conservation



### Patterns

Explore richness patterns and biodiversity facets



### Datasets

Explore datasets used across MOL



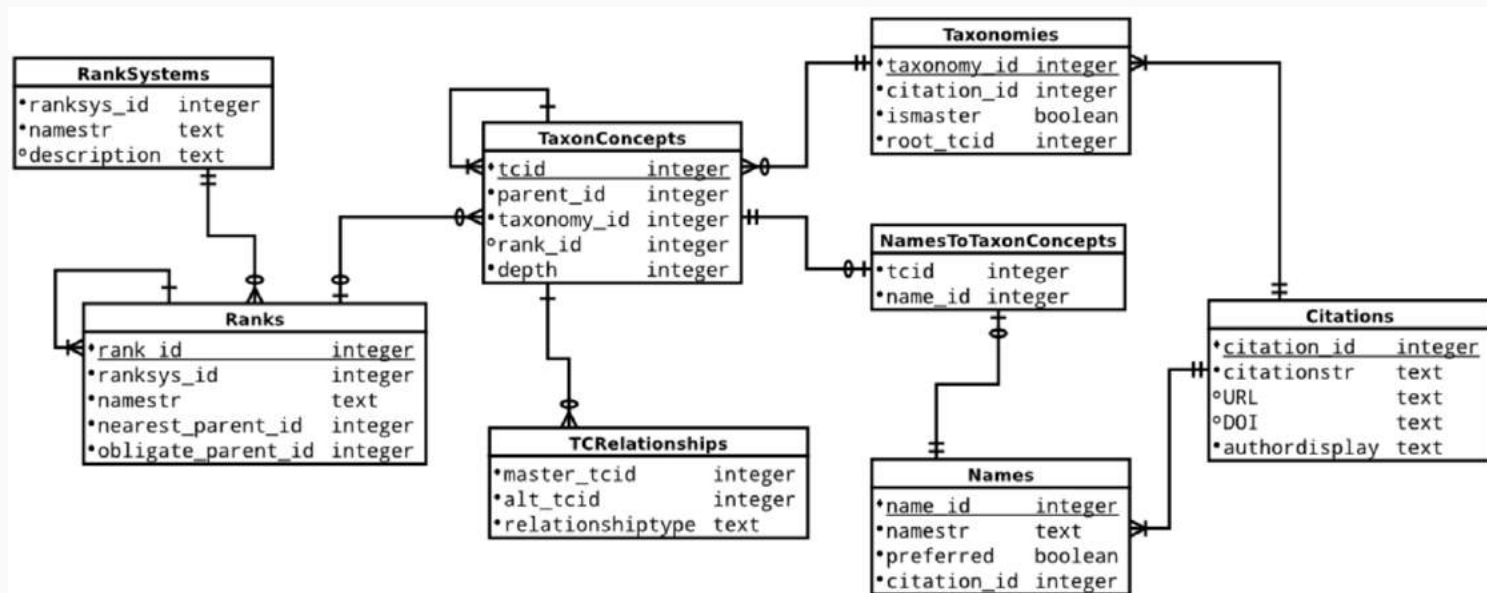
### Mobile App

Discover, identify, and record biodiversity worldwide

Thank you for your attention!

# Management On The Back-End

- MOL has a well developed access control system
- One of the biggest challenges is managing taxonomy/species names
- Taxonomy management - nearly a million names and synonymies
- Prototype tools to help harmonize names



# Environmental Data Products

Satellite and model-derived 1km environmental data at varying temporal resolutions

	Source	Daily	Monthly	Annual	Climatology
Enhanced Vegetation Index	MODIS				
Land Surface Temperature	MODIS				
Air Temperature (Daily Min, Max, Mean)	CHELSA				
Precipitation (Daily Min, Max, Mean)	CHELSA				



Available in the current prototype