# Analyzing paleoecological data: Best practices and current resources

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### Learning Objectives

#### Workshop participants will learn:

- Key elements of paleoecological data
- how to use APIs (Application Programming Interface) for Neotoma and other databases
- how to use the neotoma R package to write scripts to retrieve Neotoma data directly into R for further analysis

## Agenda

- ▶ 1 1:30pm: Getting started
  - ▶ Introductions- why are you in this workshop?
  - Getting set up for the day
- ▶ 1:30 2:00pm: Overview of paleoecological data
- ▶ 2:00 2:30pm: Neotoma web explorer
- 2:30 300pm: Intro to API and JSON queries
- ▶ 3:00 4:00pm: R Neotoma

## Getting started

#### Resources

- Following along today
  - Intro/Background slides can be viewed through these links: https://rawgit.com/NeotomaDB/Workshops/master/ IBS2017/IntroSlides/IntroSlides.html https://speakerdeck.com/jessicablois/ analyzing-paleo-data-intro-slides
  - ► The primary workshop document can be viewed through this link: https://rawgit.com/NeotomaDB/Workshops/master/IBS2017/R/Workshop\_IBS2017\_v0.3.html
- All slides and materials are on GitHub
  - ► The Neotoma Paleoecology Database https://github.com/NeotomaDB
  - ► The Workshops section https://github.com/NeotomaDB/Workshops/

#### Getting started

#### Installations

- Download and install R (available at https://cran.r-project.org/)
- Download and install RStudio Desktop (https: //www.rstudio.com/products/rstudio/download3/)
- 3. Install the following R packages: RJSONIO, jsonlite, RCurl, neotoma
  - Open up R Studio, then type: install.packages(c('RJSONIO', 'RCurl', 'jsonlite'))
  - Install the neotoma package:

```
install.packages('devtools')
devtools::install_github("ropensci/neotoma")
```

# Paleoecological data and the Neotoma Paleoecology Database

- Paleo data for biogeographers
  - taxon occurrences in space and time
  - taxon attributes
  - paleoenvironmental data

#### Taxon occurrences:

- Neotoma Paleoecology Database (multiproxy)
- Paleobiology Database (multiproxy)
- NOW database (mammals)
- ▶ PaleoPortal (contains links to several sites)
- GBIF
- Others?

## Taxon morpohological or functional attributes:

- Sometimes associated with the data in databases (e.g., mammal body size in PBDB)
- ► MOM (late Quaternary mammal body mass)
- ▶ iDigBio
- Modern databases (Pantheria, TRY, BIEN, etc)

#### Paleoenvironmental data:

- ► CCSM3:
  - ▶ Paleo (CCSM3 & ECBilt) to future climate Lorenz et al. 2016
  - ▶ Related: PaleoView from the Fordham lab
  - ► HadCM3 from Singarayer & Valdes, 2010
  - ▶ Worldclim (6000 and 22000 ybp, based on CMIP5)
  - ▶ Others?

# Paleoecological data and the Neotoma Paleoecology Database

 We will discuss attributes of paleo data in the context of Neotoma (www.neotomadb.org), a database that houses different data from the more recent periods of Earth history

#### What is Neotoma?

- ▶ Neotoma is a database consortium: www.neotomadb.org
- Organized around proxy types
  - historically, brought together several major databases or datasets (i.e. FAUNMAP, COHMAP)
  - moving towards direct entry of individual data files
- ► The different databases use a common, extendable platform to ensure compatibility across proxy types
- Each proxy community can develop own standards, e.g. for taxonomy

### The Neotoma ecosystem

- Faunal data
  - FAUNMAP, FAUNMAP2 (in progress)
  - MIOMAP (with Tony Barnosky)
  - ANTIGUA (South America megafaunal dates, in progress, with Tony Barnoksy and Emily Lindsey)
  - ▶ MQMD (Mexico, in progress, with Joaquin Arroyo Cabrales)
- Pollen and plant macros
- Packrat midden database
- Ostracodes, Diatoms
- Isotopes (coming online soon)
- ▶ Use neotoma::get\_table("datasettype") to see all 25 available types

## Scope and strengths of Neotoma

- ▶ Pliocene to present, global
- Chronology tools and storage
- Multiproxy
- Active development community
- Curated database -> high quality data

#### Curated database

- Each proxy group has a set of data stewards, led by one or a few lead stewards
- Anyone can deposit data into Neotoma
- ▶ Before going 'live', data need to be validated by a data steward

## Key elements of paleoecological data

- Fundamental message: user beware. You should understand the taphonomy of your study system in order to accurately infer biogeographic patterns across space and time
  - Occurrence records and taxonomy
  - Orienting occurrences in space
  - Orienting occurrences in time
- Some key taphonomy references
  - ▶ Behrensmeyer AK, Kidwell S, Gastaldo R. 2000. Taphonomy and paleobiology. Paleobiology. 26(sp4):103–47
  - Jackson ST. 2012. Representation of flora and vegetation in Quaternary fossil assemblages: known and unknown knowns and unknowns. Quaternary Science Reviews. 49:1–16

#### Occurrence records and taxonomy

- Each occurrence is associated with a taxonomic identification
- Paleo data are often, though not always, less precise taxonomically than present-day data
- Different proxy types are recorded in different ways
  - Vertebrate data: MNI/NISP/Presence
  - ▶ Pollen data: counts per total pollen count, usually converted to relative abundance

## Spatial precision

- lat-long coordinates, similar to present-day data
- Different proxy types, different taxa, and different depositional environments record different levels of spatial precision
  - ▶ Plant macrofossils vs. pollen
  - Cave deposits vs. fluvial deposits

# Example: Fossil pollen from lake sediments

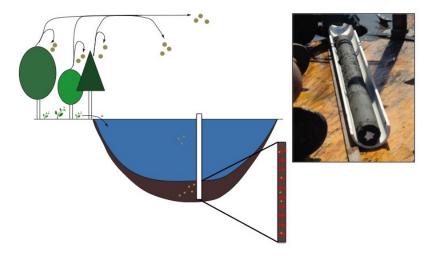


Figure 1:

#### Temporal precision

- Every occurrence is associated with an inference about the time the organism died
- ► There are different dating methods, each with their own assumptions and associated strengths and weaknesses
- Different proxy types and depositional environments will be associated with different amounts of time-averaging

# Key caveats\*

- Errors or omissions in the data
- Updates to the data may not be stored in the database
  - new dates, changes in taxonomy, etc.
- "Garbage in, garbage out"
  - Many of the original databases like FAUNMAP and COHMAP convened a group of experts to assess various aspects of data quality. We need to keep applying that same lens to new datasets
  - Data without associated metadata can only go so far
    - Note: What is considered "good metadata" changes through time!
- When in doubt, record and store as much information as possible.

<sup>\*</sup>for Neotoma and all other databases!

## Getting data out of Neotoma

- Neotoma Explorer
- API
- R
- Database snapshots (housed at www.neotomadb.org/snapshots)

## Major activities

- Adding new data (MIOMAP, ANTIGUA, MQMD)
- Integration with other databases: PBDB/Neotoma cross-database searches
- ▶ DOIs: assign datasets individual DOIs (will satisfy NSF data access guidelines)
- Embargos: tools for embargoing data.
  - will allow users to enter and validate data, get a DOI for paper submission, then data go 'live' when the paper is published
- Governance and Sustainability
  - Recently formed a leadership structure
  - Formalized bylaws and policy
- Education and outreach
  - Partnerships with SERC, Flyover Country, etc.

#### Questions and Discussion

- Thoughts, questions??
- Primary vertebrate contacts:
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- Primary pollen contacts:
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