

# The changing functional composition of the North American species pool

Peter D Smits, Seth Finnegan

Department of Integrative Biology, University of California – Berkeley

# Foundational assertion of conservation paleobiology

By studying the **past**,  
we can better predict the **future**.

## What are we predicting?

Extinction is hard to predict,  
but is extremely important to conservation.

# Predicting extinction

- ▶ A taxon with a **greater than average** global geographic range is likely to survive for longer than a taxon with **less than average** global geographic range.
- ▶ A taxon's global geographic range can change over time.
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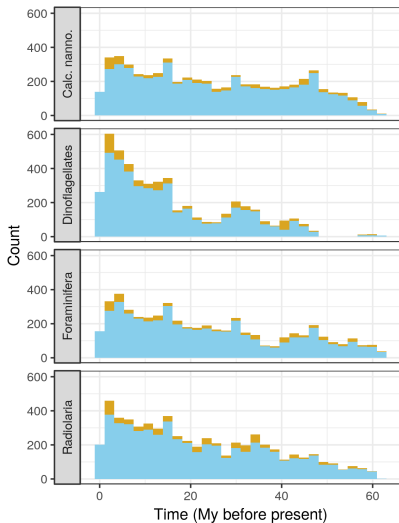
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# Encoding the past

- ▶ Change in geographic range between current observation and previous observation.
- ▶ Average global temperature at time of previous observation (Mg/Ca isotope).
- ▶ Age in millions of years at time of observation.

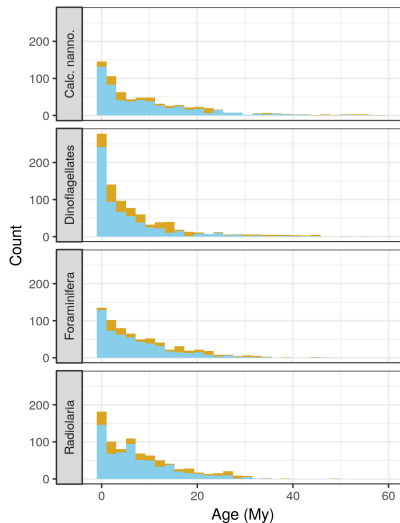
# Data being analyzed

## Occurrences



Occurrence type    Last    Standard

## Age distribution



State    Extant    Extinct



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- ▶ Explore model **adequacy** using posterior predictive distribution.
- ▶ Estimate **predictive performance** using  $k$ -fold cross-validation.

# A conceptual model for predicting extinction

# A statistical model for predicting extinction

# Comparing our models



## Cross-validation results

# Tracking extinction risk over time

## Overall covariate effects

# Covariate effects over time

# Effects of age on extinction risk

# Summary

# Conclusions

# Acknowledgements