# Reconstructing species' range dynamics using SDMs

Francisco Rodríguez-Sánchez

University of Sevilla

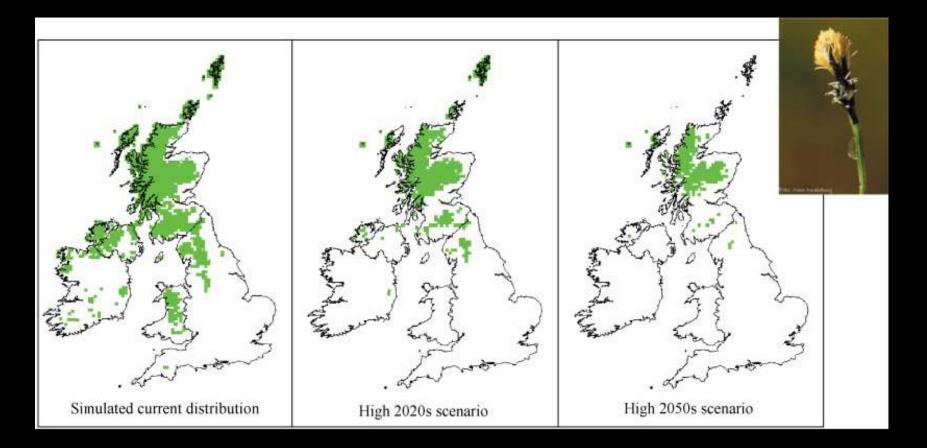
Spain

frodriguez@us.es



*PhD Course on Species Distribution Modelling Sandbjerg, Denmark, August 2010* 

#### Forecasting the effects of global change



Pearson & Dawson (2003) Global Ecol & Biog

#### Hindcasting past species ranges

• Species range dynamics

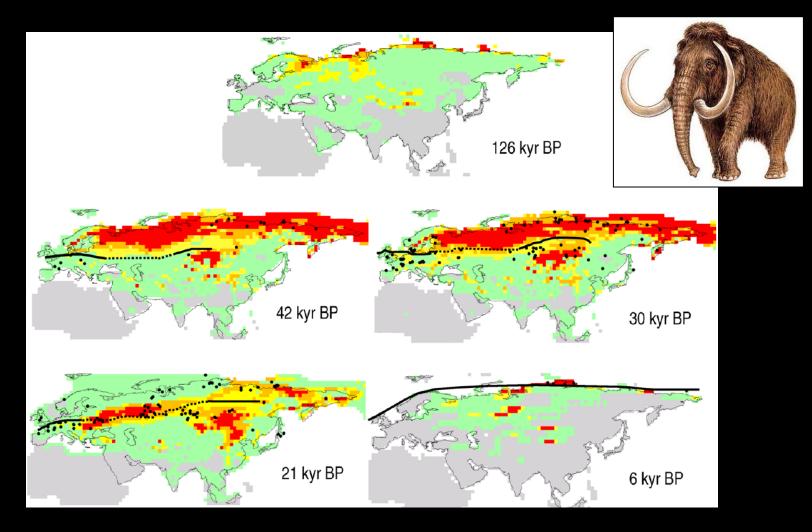
migration, glacial refugia, range limits

Consequences of past climate changes

extinction, range size

Speciation / Differentiation

#### The extinction of the Woolly Mammoth

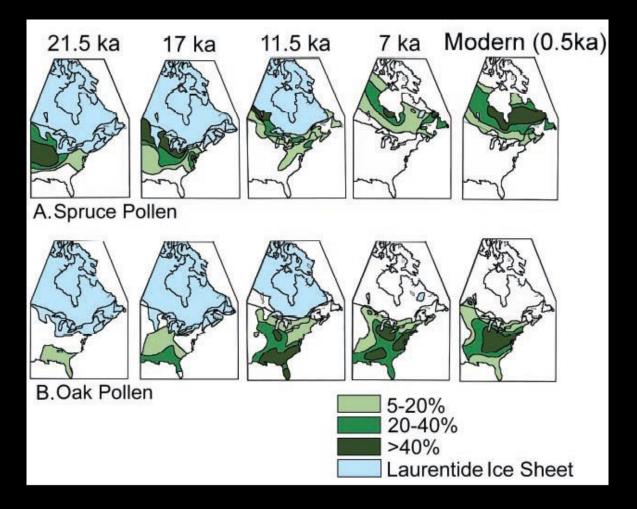


Nogués-Bravo et al. (2008) PLoS Biol

Main approaches to reconstruct species ranges

- 1. Fossil record
- 2. Phylogeography
- 3. Species Distribution Models (SDMs)

# The fossil record

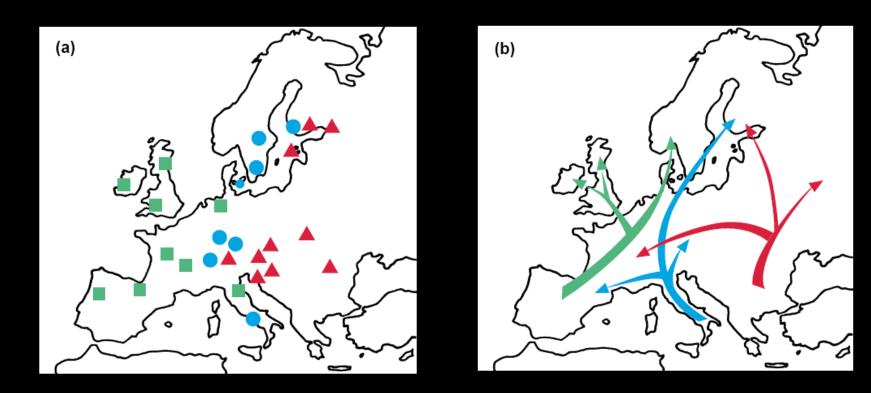


Davis & Shaw (2001) Science

#### Limitations of the fossil record

- Scarcity of data (time-space)
- Low power for rare species
- Uncertainty (spatial, temporal & taxonomic)

# Phylogeography



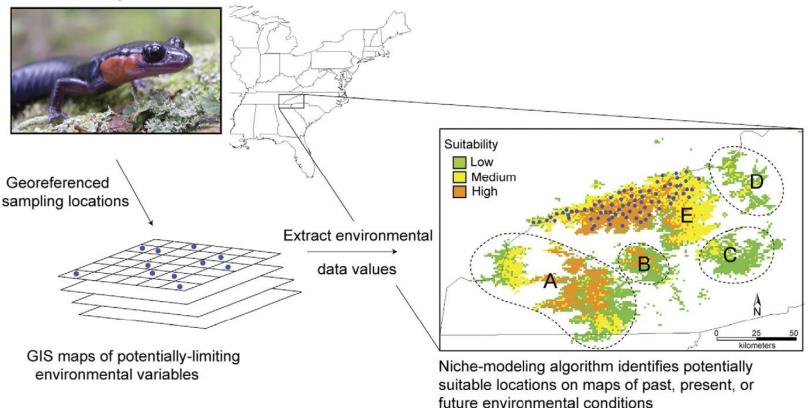
Comes & Kadereit (1998) Trends Plant Sci.

#### Limitations of phylogeographical approaches

- Costly (field sampling & lab work)
- Resolution determined by sampling effort and genetic variation
- Gene trees ≠ Species tree
- Lack of time scale (unless molecular dating)
- Patterns vs processes (but coalescence)

# **Species Distribution Models**

#### Plethodon jordani

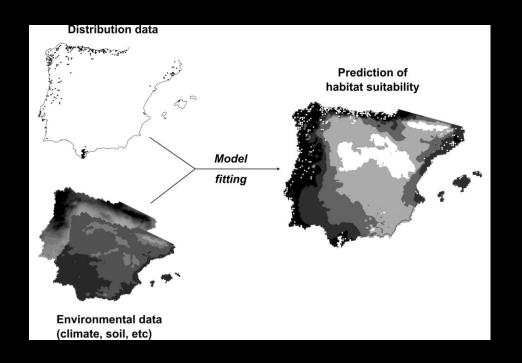


TRENDS in Ecology & Evolution

Kozak et al. (2008) TREE

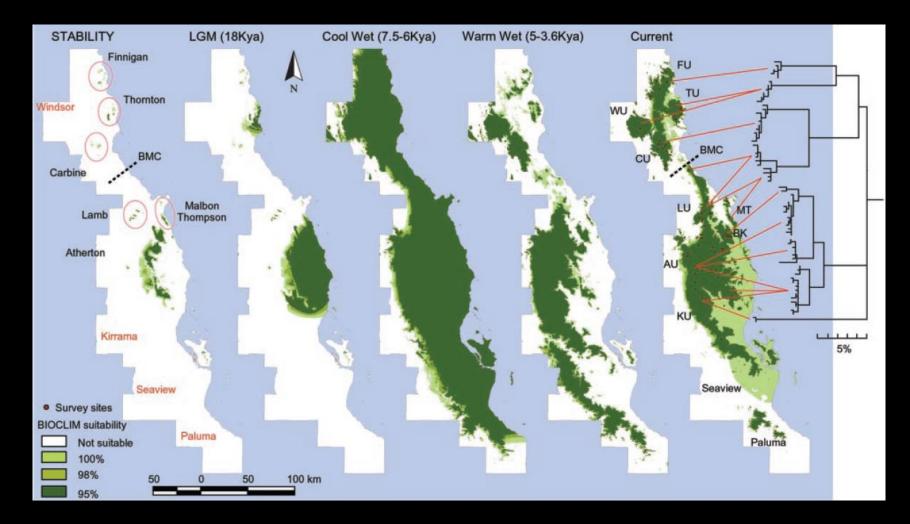
# Projecting SDMs across time

- 1. Calibration: current distribution and climate
- 2. Projection to past or future climates



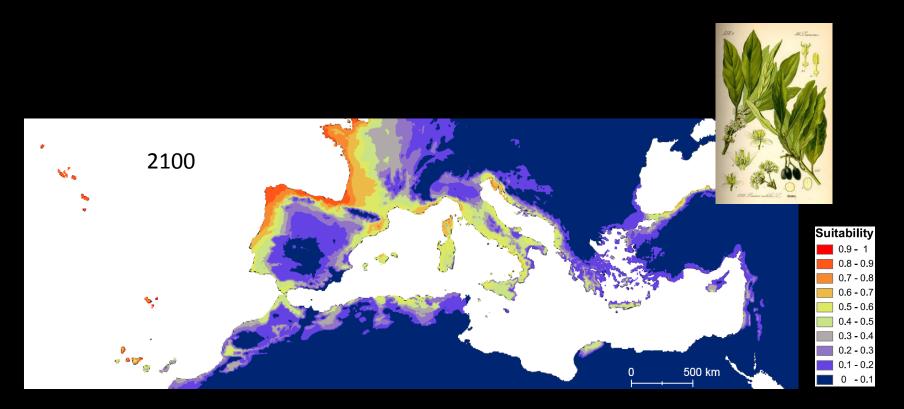
<u>Data sources</u>: Future: IPCC Past: PMIP2, BRIDGE, etc

#### Reconstructing species' range dynamics



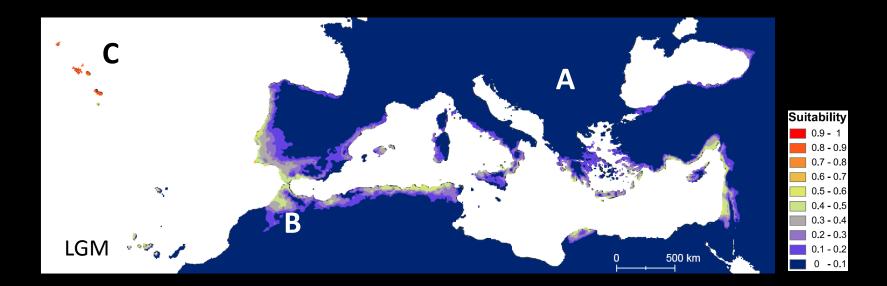
Hugall et al. (2002) PNAS

# Laurus range dynamics over 3 Myr



#### Rodríguez-Sánchez & Arroyo (2008) Global Ecol & Biog

# Interpreting projections from SDMs



- 1. Was the species present in A?
- 2. Was the species present in B?
- 3. Can we be more certain of species presence in C than in B?

#### Issues with projections of SDMs across time

First of all, we need a good model for the present

- Sample size
- Geographic coverage
- Environmental data
- Good predictive ability

#### Issues with projections of SDMs across time

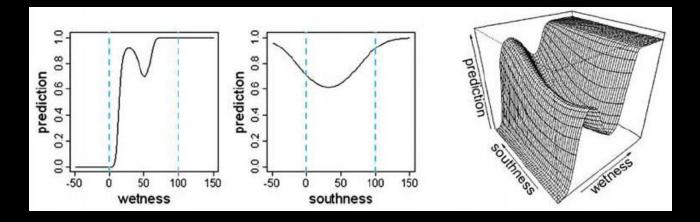
- Choice of predictors
- Equilibrium of species distribution with climate
- Intraspecific niche differentiation
- Constancy of species-environment relationships
- Non-analog climates
- Uncertainty
- Validation

#### **Choice of predictors**

• Proximal vs distal predictors

Minimum temperature vs elevation, aspect...

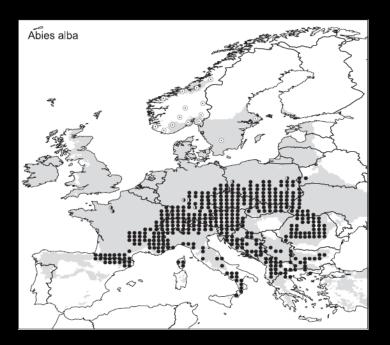
Check response curves



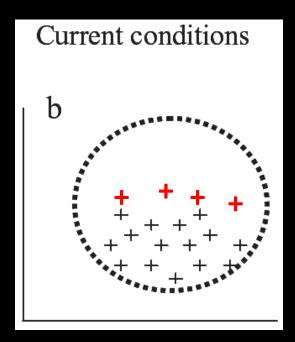
Elith & Graham (2009) Ecography

#### Equilibrium of species distribution with climate

- Dispersal limitation
- Biotic interactions (humans)

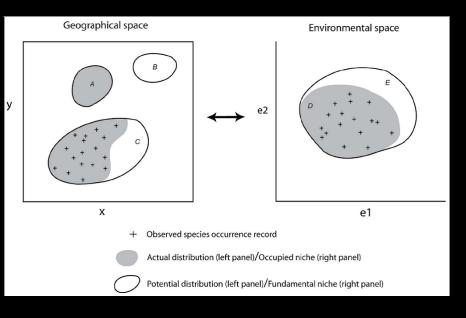


Svenning & Skov (2004) Ecol Lett

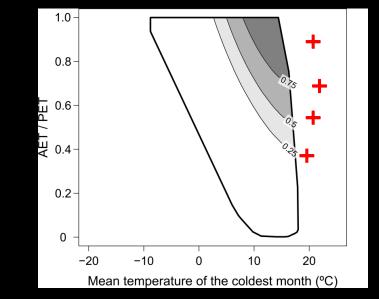


Nogués-Bravo (2009) Global Ecol & Biog

#### Species' niche may be wider than available climate

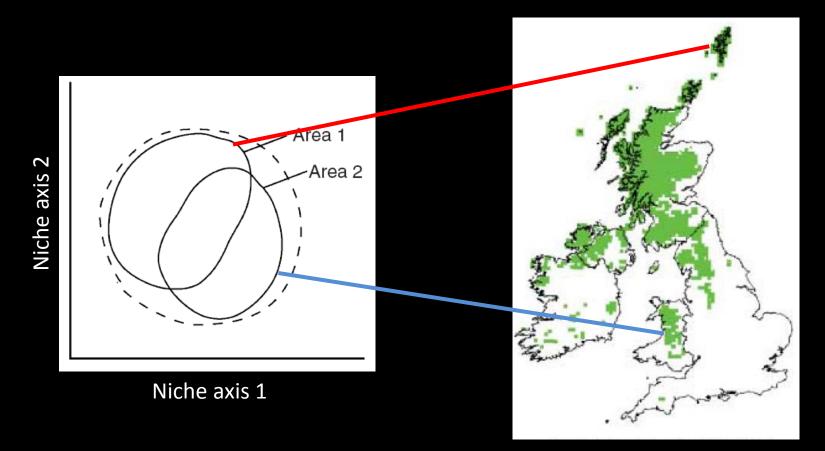


Pearson (2008)



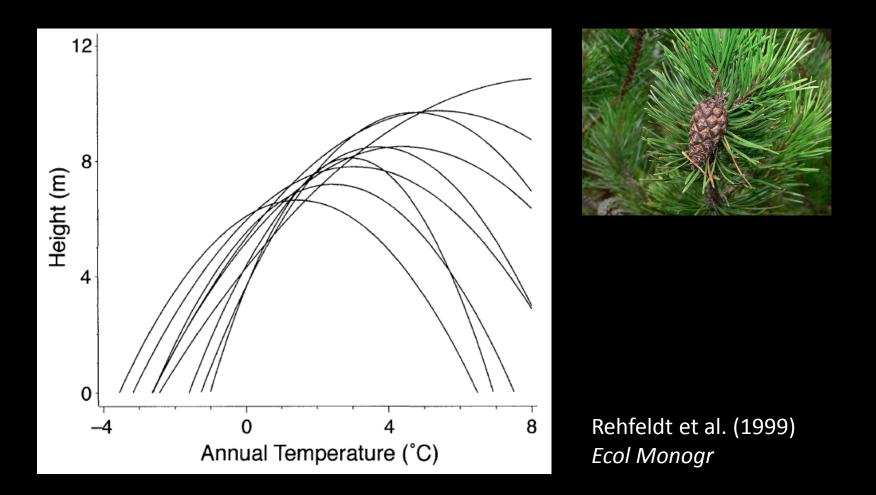
Rodríguez-Sánchez & Arroyo (2010) Clim Ch, Ecol & Syst

#### Ecotypes and global change projections



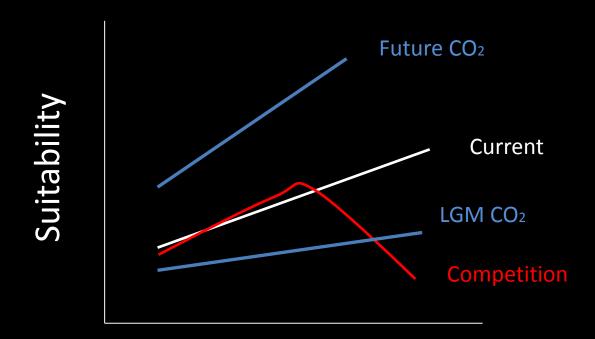
Peterson & Holt (2003) Ecol Lett

#### Intraspecific responses to climate in *Pinus contorta*



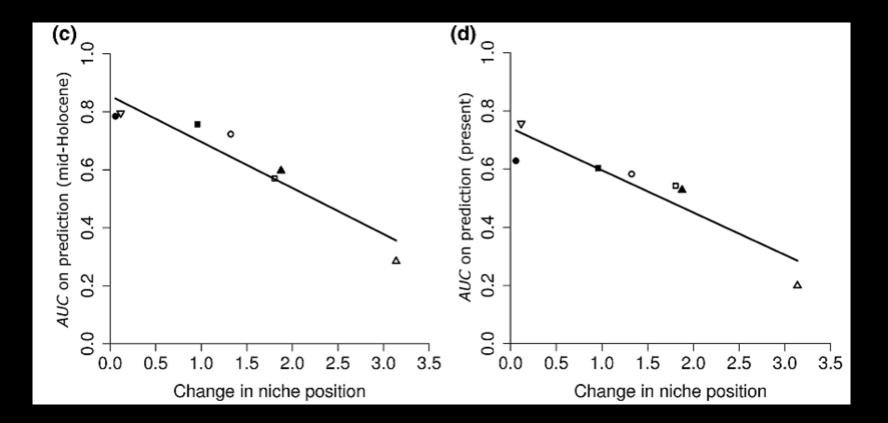
#### Stability of climatic niches through time

Constancy of species-environment relationships



Precipitation

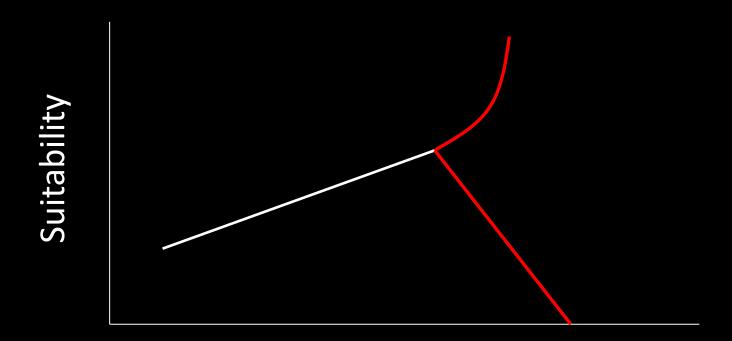
#### Predictive perfomance decreases with larger niche shifts



Pearman et al. (2008) Ecol Lett

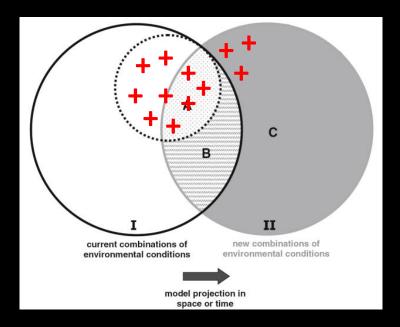
## Non-analog climates

Extrapolation beyond the range of training data



Temperature

## Non-analog climates





Fitzpatrick & Hargrove (2009) Biodiv & Cons

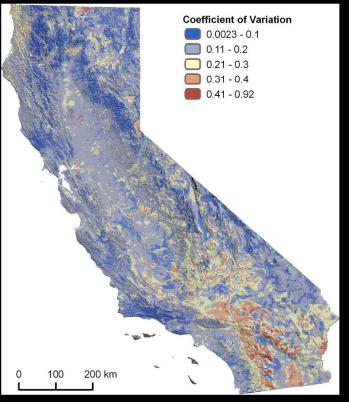
#### Reducing and quantifying uncertainty

- Multiple sources of uncertainty:
  - Occurrence data
  - Environmental data
  - Modelling algorithms
  - Climate scenarios

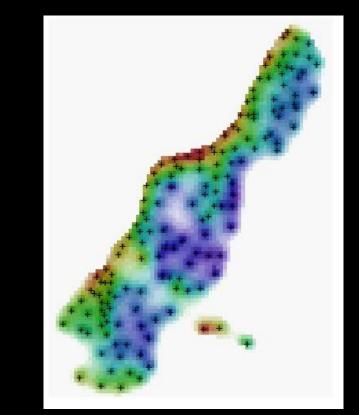
#### Ensemble forecasting

- Araújo & New (2007) TREE
- BIOMOD: Thuiller et al. (2009) Ecography
- Bayesian approaches

#### Provide uncertainty estimates

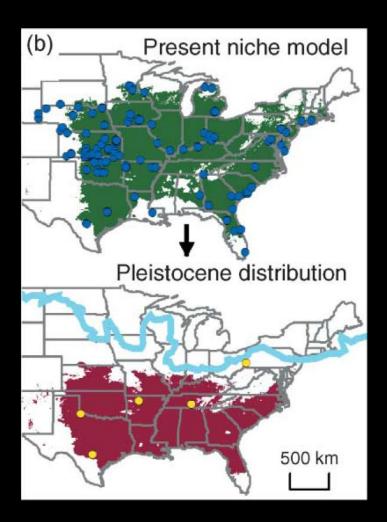


Wiens et al. (2009) PNAS



Hengl (2003)

# Validation with fossil records

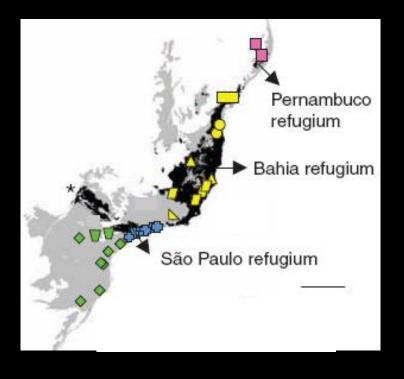




Scalopus aquaticus

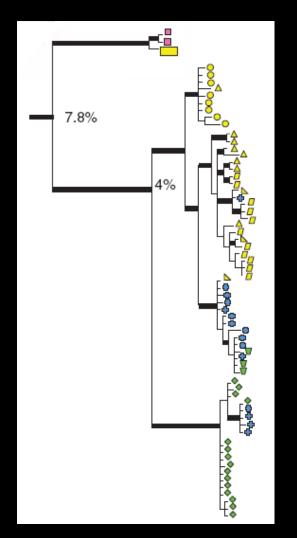
Martínez-Meyer et al. (2004) Global Ecol & Biog

# Integration with phylogeography



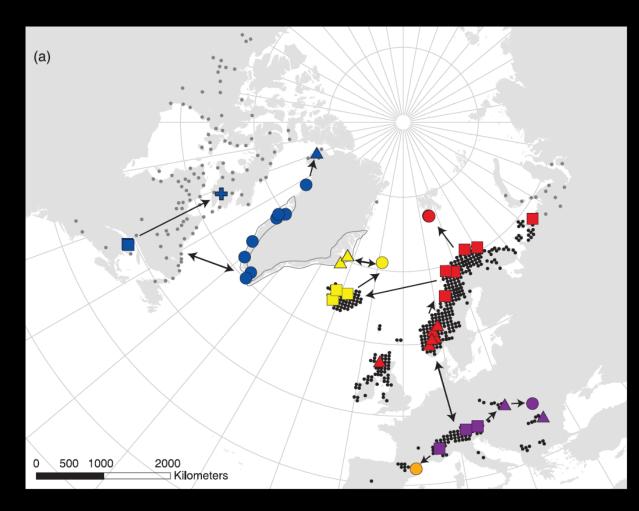


Hypsiboas faber



Carnaval et al. (2009) Science

#### **Three-way integration**

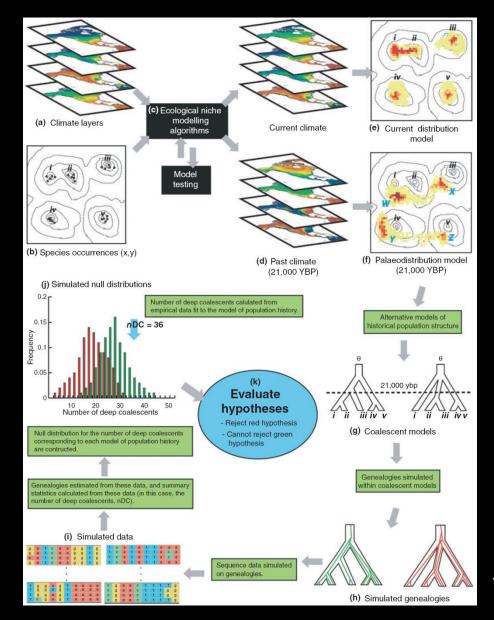




Salix herbacea

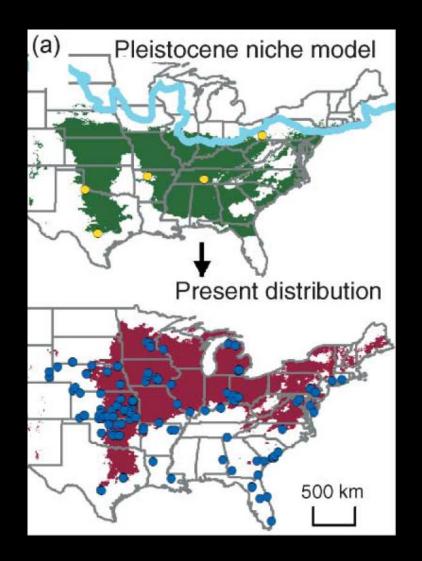
Alsos et al. (2009) Global Ecol & Biog

#### Tight integration: SDMs and coalescence



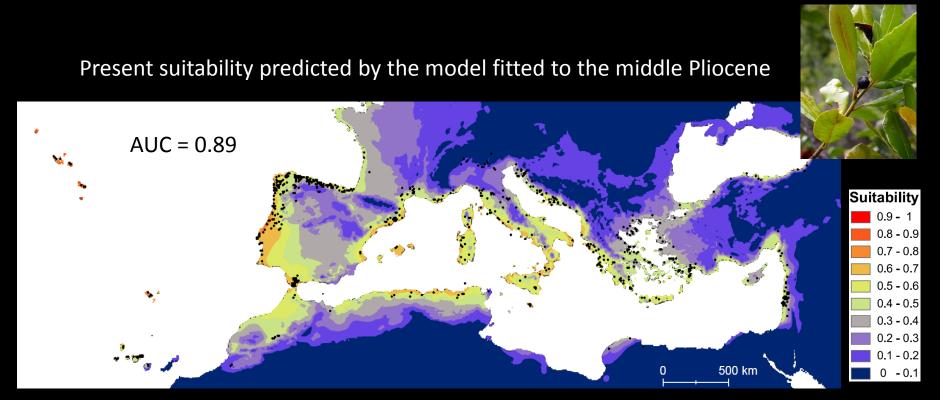
Richards et al. (2007) *J Biog* 

#### Projecting from past to present: validating SDM forecasts



Martínez-Meyer et al. (2004) Global Ecol & Biog

#### Deterministic range dynamics in Laurus



Rodríguez-Sánchez & Arroyo (2008) Global Ecol & Biog

# Insights from simulations

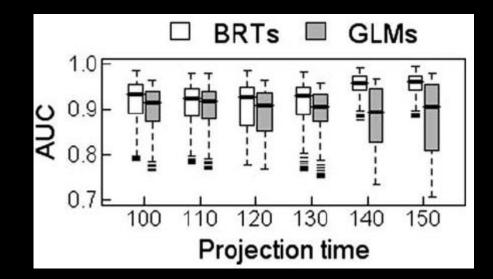


Ecography 32: 733–744, 2009 doi: 10.1111/j.1600-0587.2009.05810.x © 2009 The Authors. Journal compilation © 2009 Ecography Subject Editor: Jens-Christian Svenning. Accepted 7 March 2009

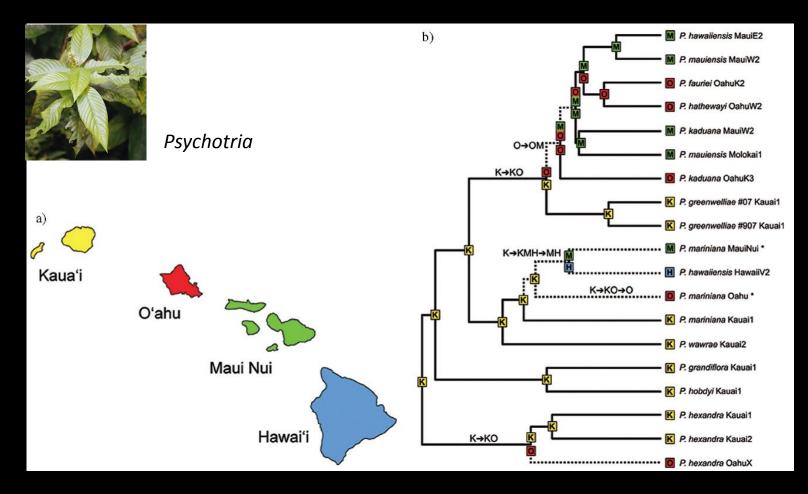
Static species distribution models in dynamically changing systems: how good can predictions really be?

Damaris Zurell, Florian Jeltsch, Carsten F. Dormann and Boris Schröder

- Climate change
- Dispersal limitation
- Parasitoid

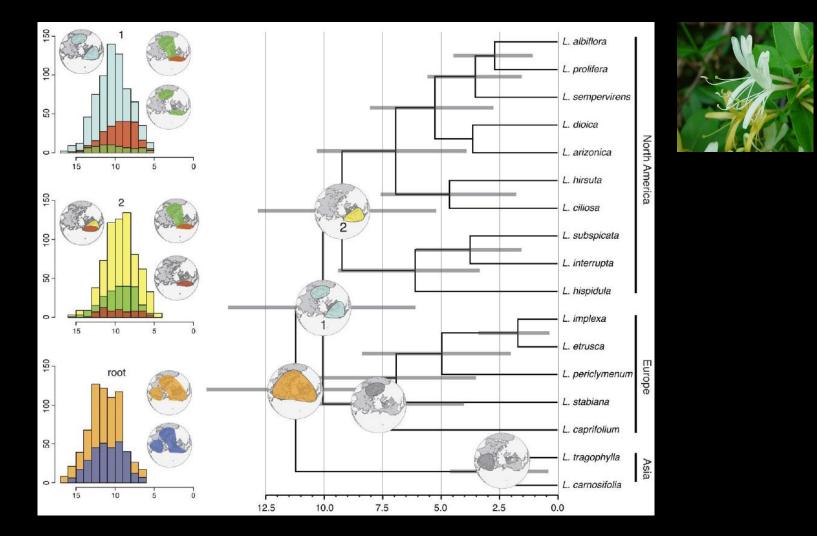


# Phylogenetic approaches: geographic range evolution



Ree & Smith (2008) Syst Biol

#### Speciation and range dynamics in Lonicera



Smith & Donoghue (2010) Syst Biol

# New modelling approaches

#### Diversity and Distributions, (Diversity Distrib.) (2010) 16, 321–330



Moving beyond static species distribution models in support of conservation biogeography

Janet Franklin

Ecography 33: 621–626, 2010

Beyond bioclimatic envelopes: dynamic species' range and abundance modelling in the context of climatic change

Brian Huntley, Phoebe Barnard, Res Altwegg, Lynda Chambers, Bernard W. T. Coetzee, Lesley Gibson, Philip A. R. Hockey, David G. Hole, Guy F. Midgley, Les G. Underhill and Stephen G. Willis

Diversity and Distributions, (Diversity Distrib.) (2009) 15, 590–601



MIGCLIM: Predicting plant distribution and dispersal in a changing climate

Robin Engler and Antoine Guisan\*

BioMove – an integrated platform simulating the dynamic response of species to environmental change

Guy F. Midgley, Ian D. Davies, Cécile H. Albert, Res Altwegg, Lee Hannah, Gregory O. Hughes, Lydia R. O'Halloran, Changwan Seo, James H. Thorne and Wilfried Thuiller

biology **letters** Global change biology

Biol. Lett. doi:10.1098/rsbl.2008.0049 Published online

Predicting extinction risks under climate change: coupling stochastic population models with dynamic bioclimatic habitat models

David A. Keith<sup>1,\*</sup>, H. Resit Akçakaya<sup>2</sup>, Wilfried Thuiller<sup>3</sup>, Guy F. Midgley<sup>4</sup>, Richard G. Pearson<sup>5</sup>, Steven J. Phillips<sup>6</sup>, Helen M. Regan<sup>7</sup>, Miguel B. Araújo<sup>8</sup> and Tony G. Rebelo<sup>4</sup>

# Conclusions

- SDMs can have good predictive ability across time and provide useful insights to ecological & evolutionary questions
- Careful modelling & cautious interpretation (uncertainty). Validate whenever possible
- Keep an eye on developing approaches