

Non-linear growth-temperature
relationship leads to opposite
response to warming in cold versus
warm populations

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- WGGRAFY
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- Co-authors
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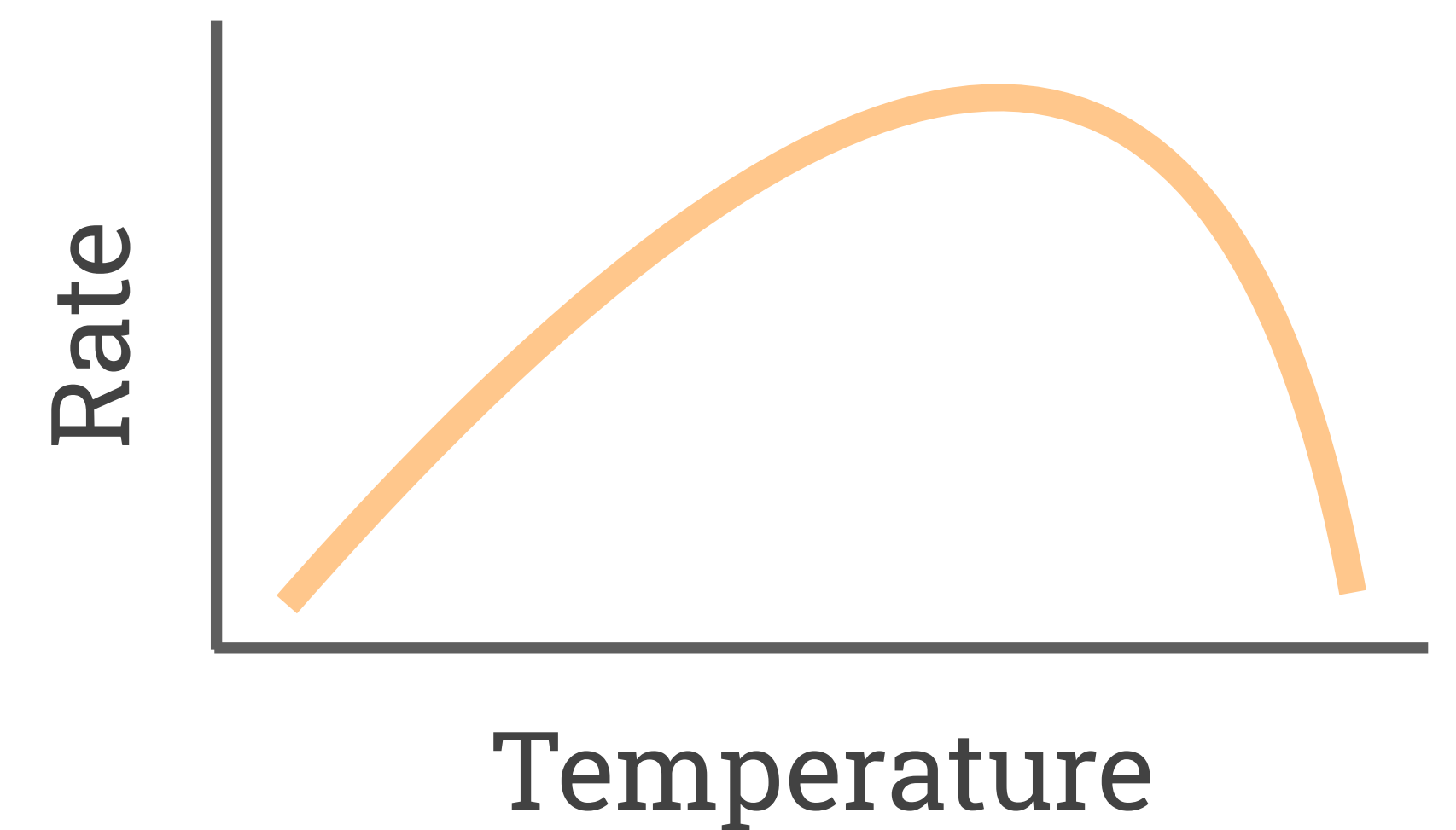
Jan Ohlberger



Anna Gårdmark

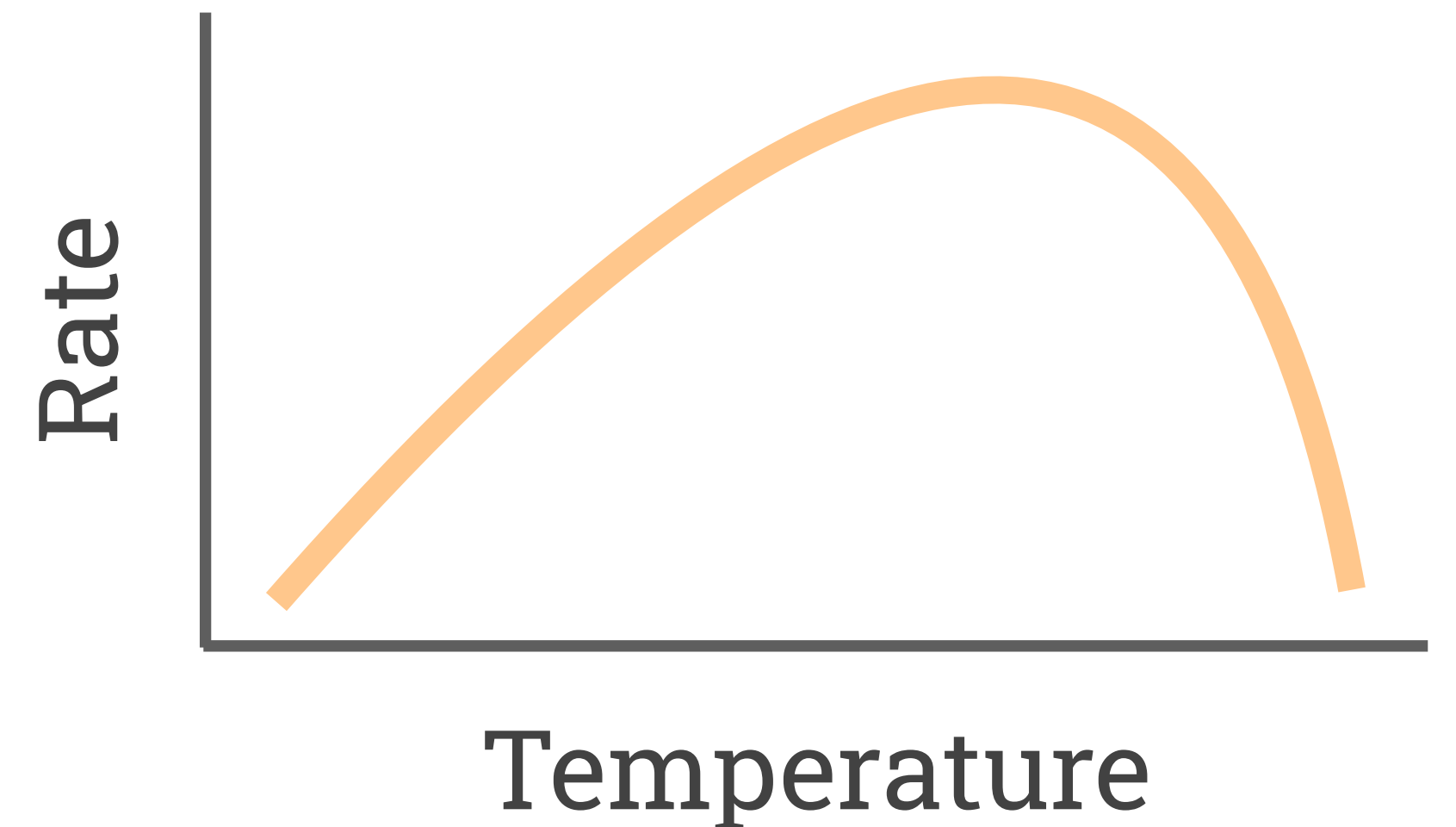
Questions

- Physiological responses to warming are not linear

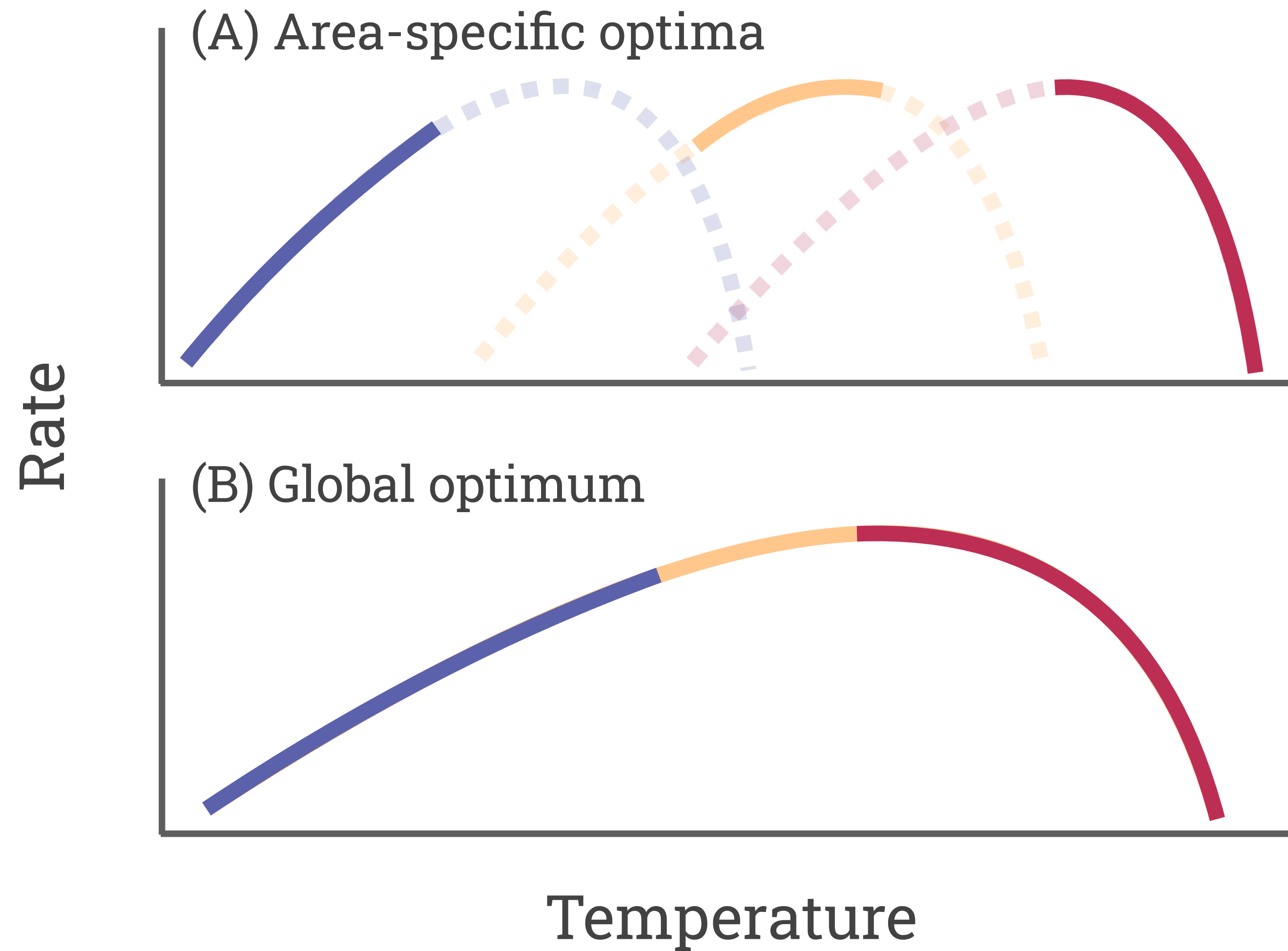


Questions

- Physiological responses to warming are not linear
- Do responses to temperature differ among populations within species?



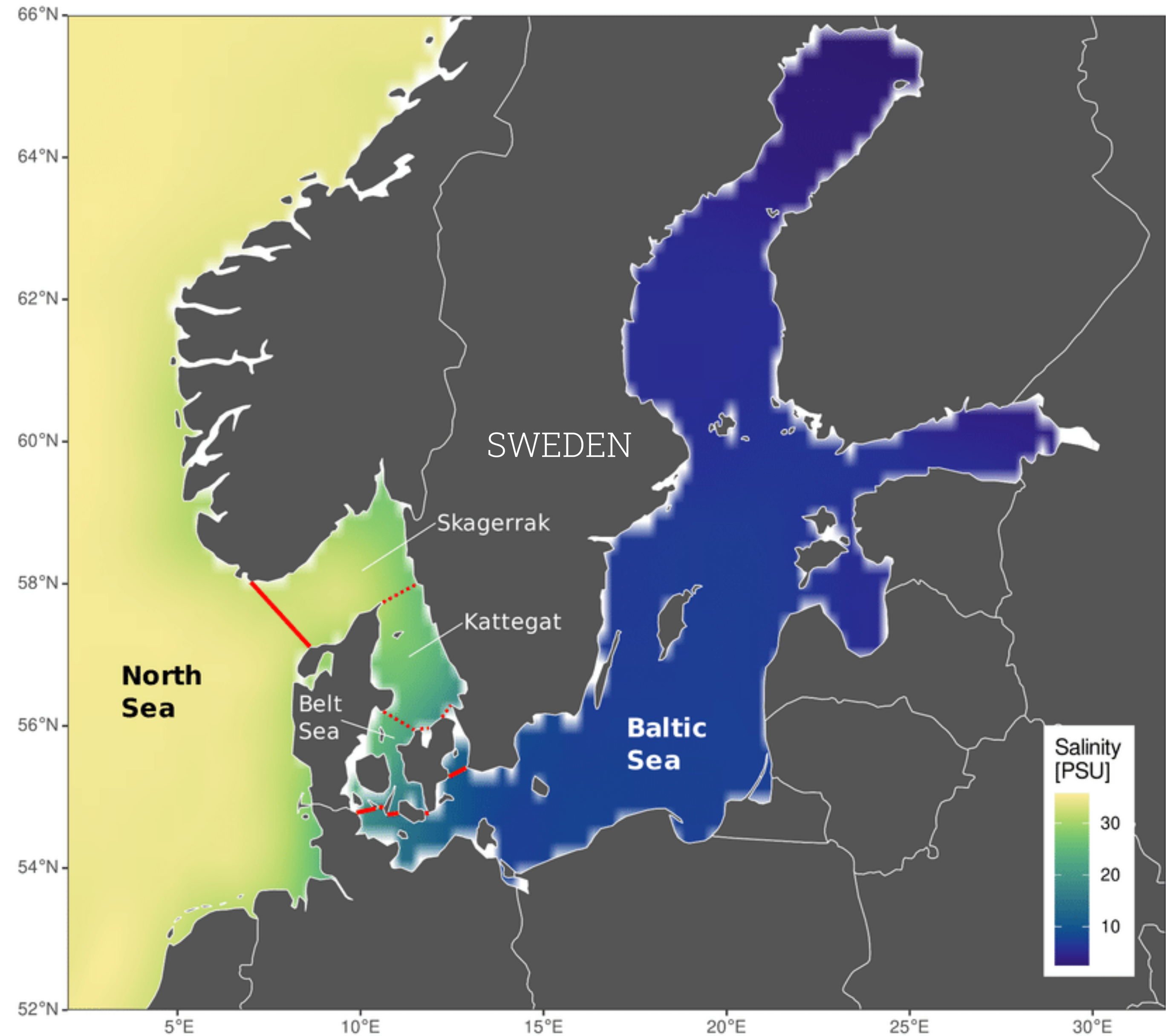
Local adaptation?



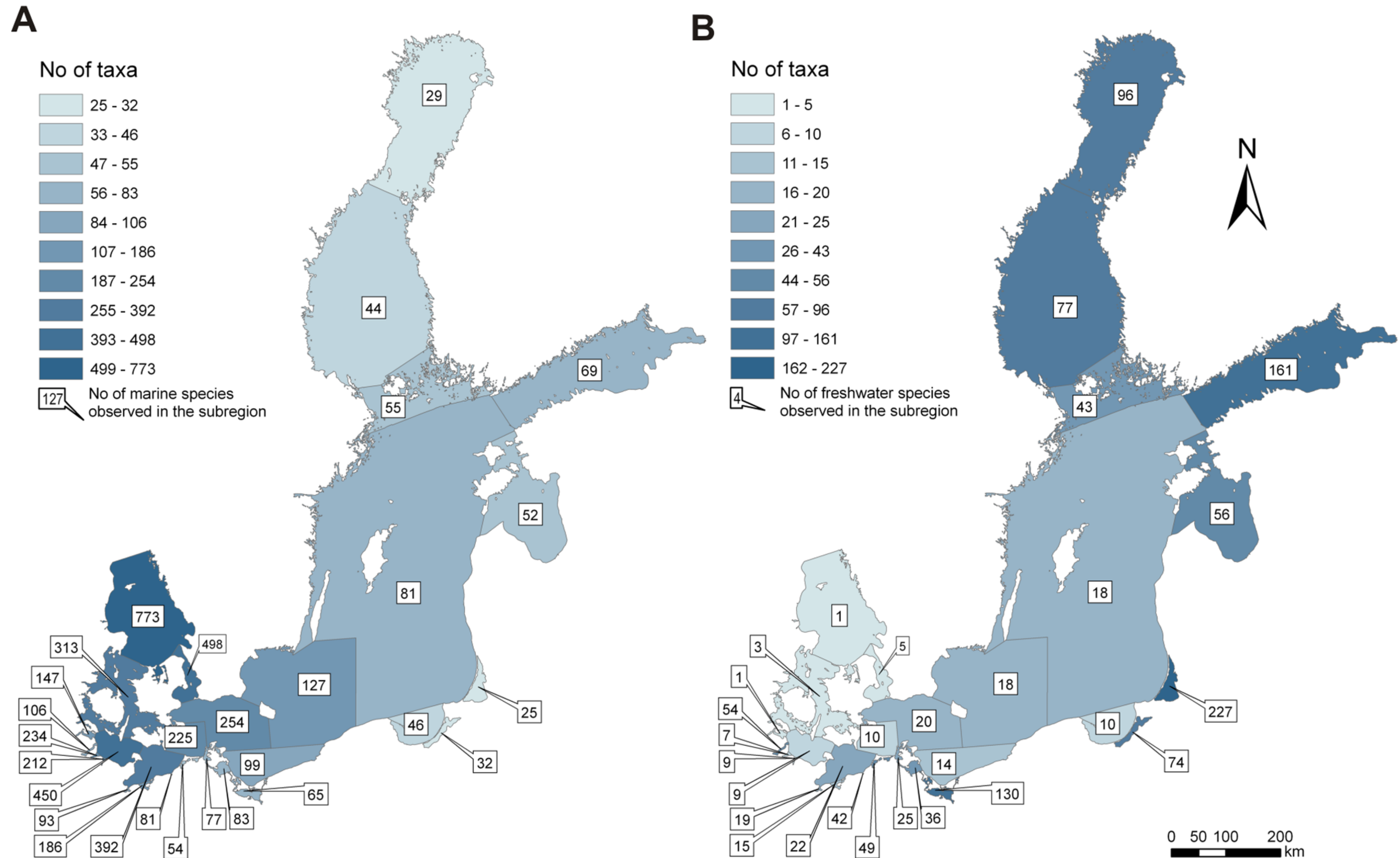
Study system & data

Baltic Sea

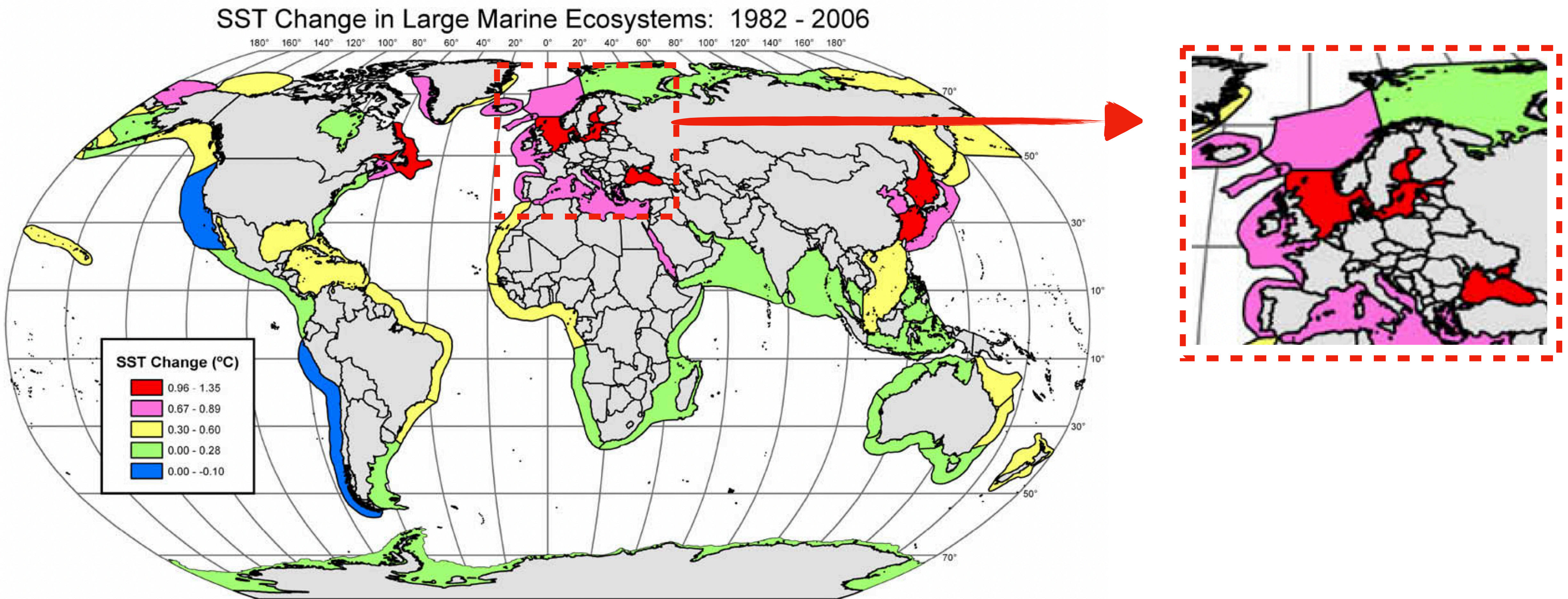
- Shallow, brackish water inland sea



Gradient of freshwater & marine species



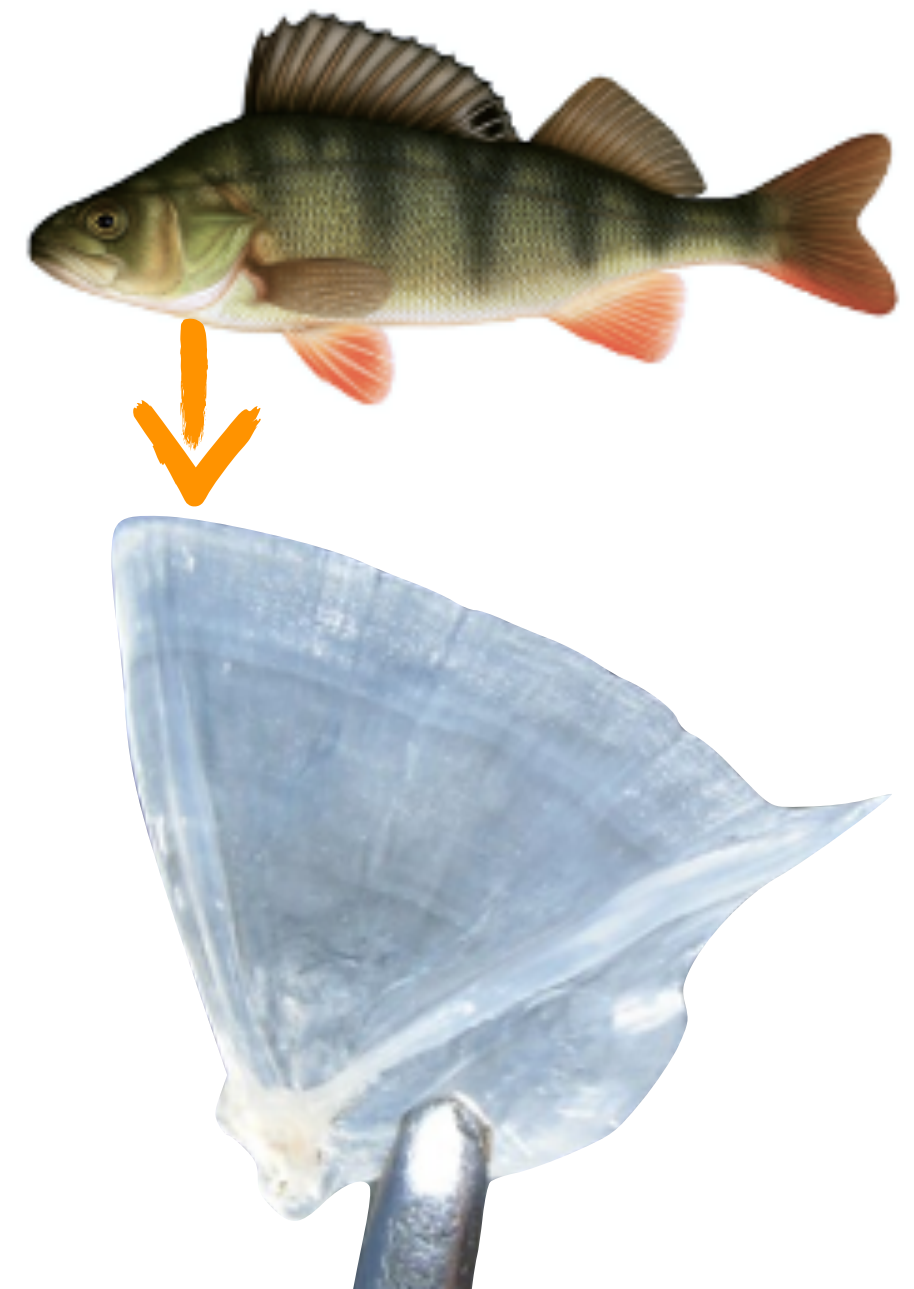
Rapid warming in the Baltic Sea



Biological data

Biological data

- Back-calculated length-at-age from operculum bones
- 145,715 data points
- 24,337 individuals
- 10 stations over 57°–66° Lat
- Oldest cohort 1953
- Average time series length: 32 years

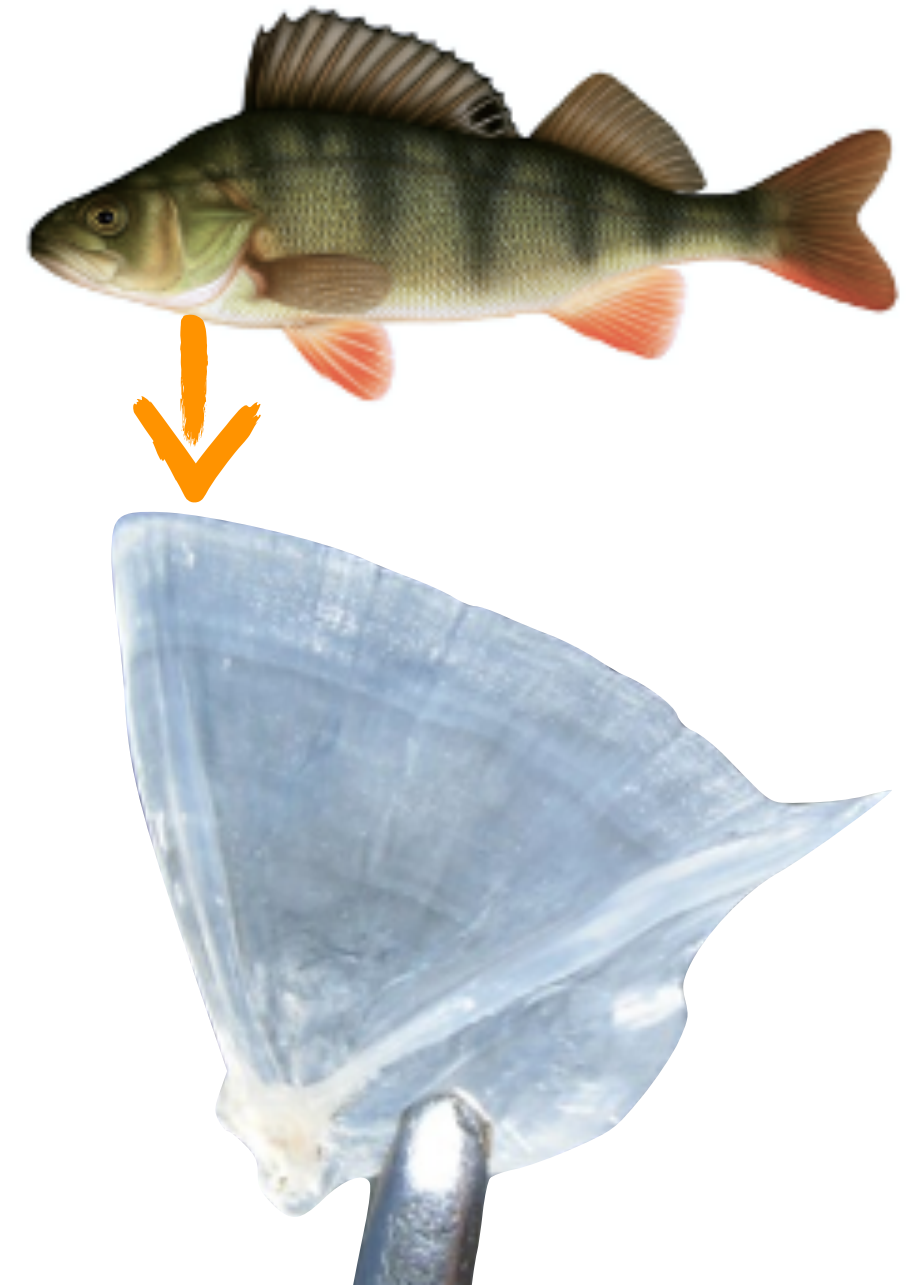


Biological data

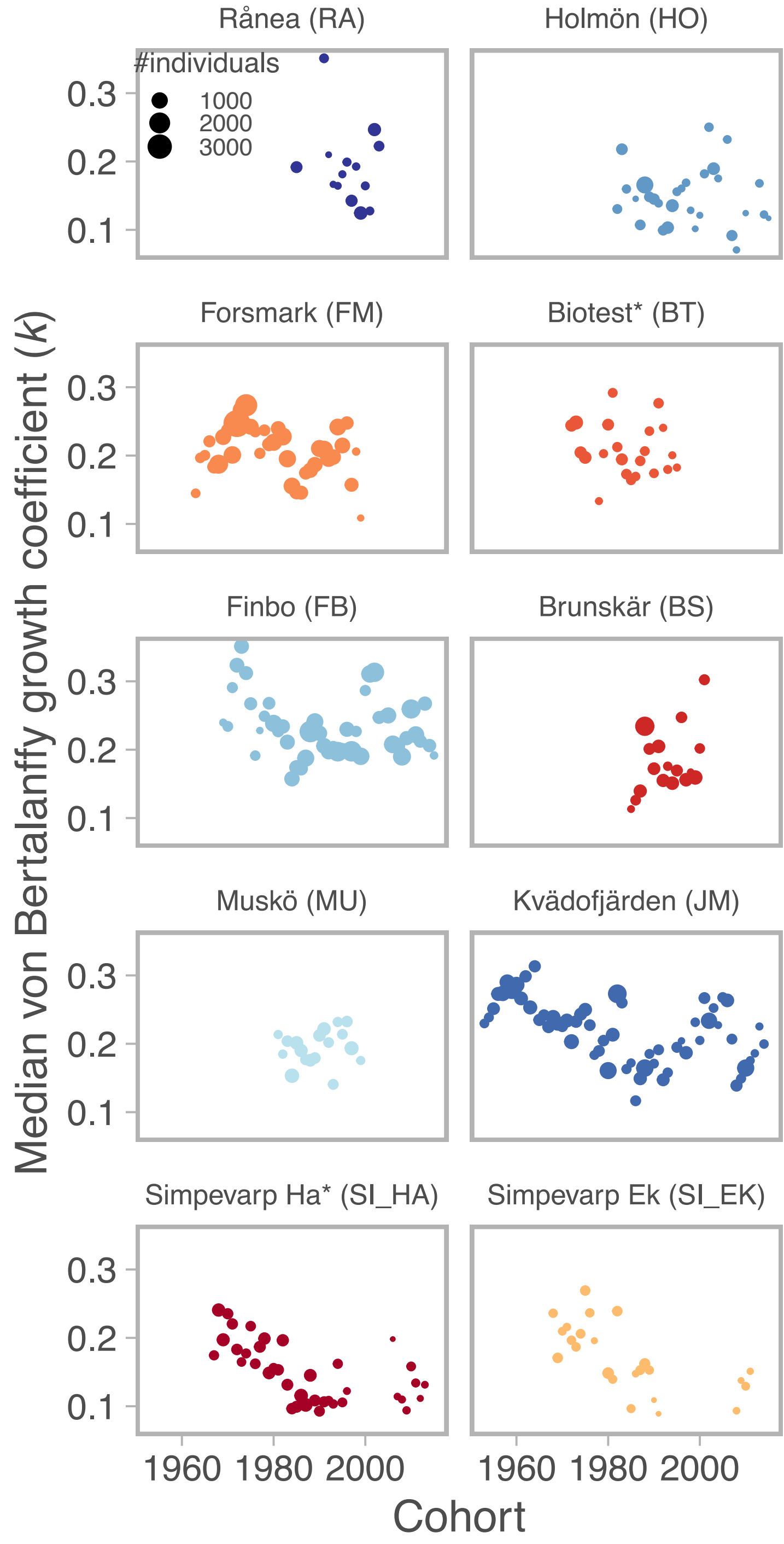
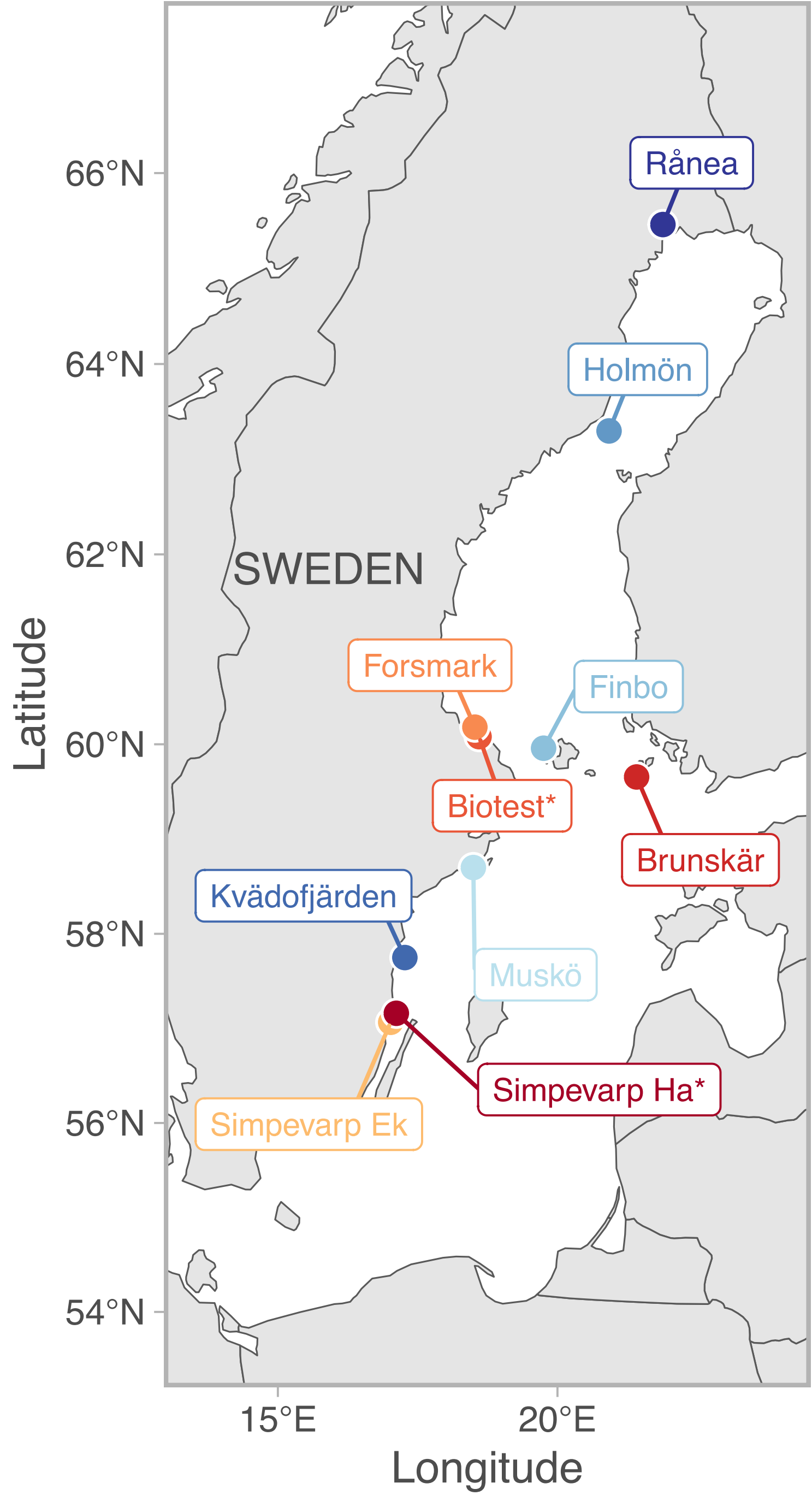
- Fit VBGE models to each individual

$$L_t = L_\infty(1 - \exp(-k \times \text{age}))$$

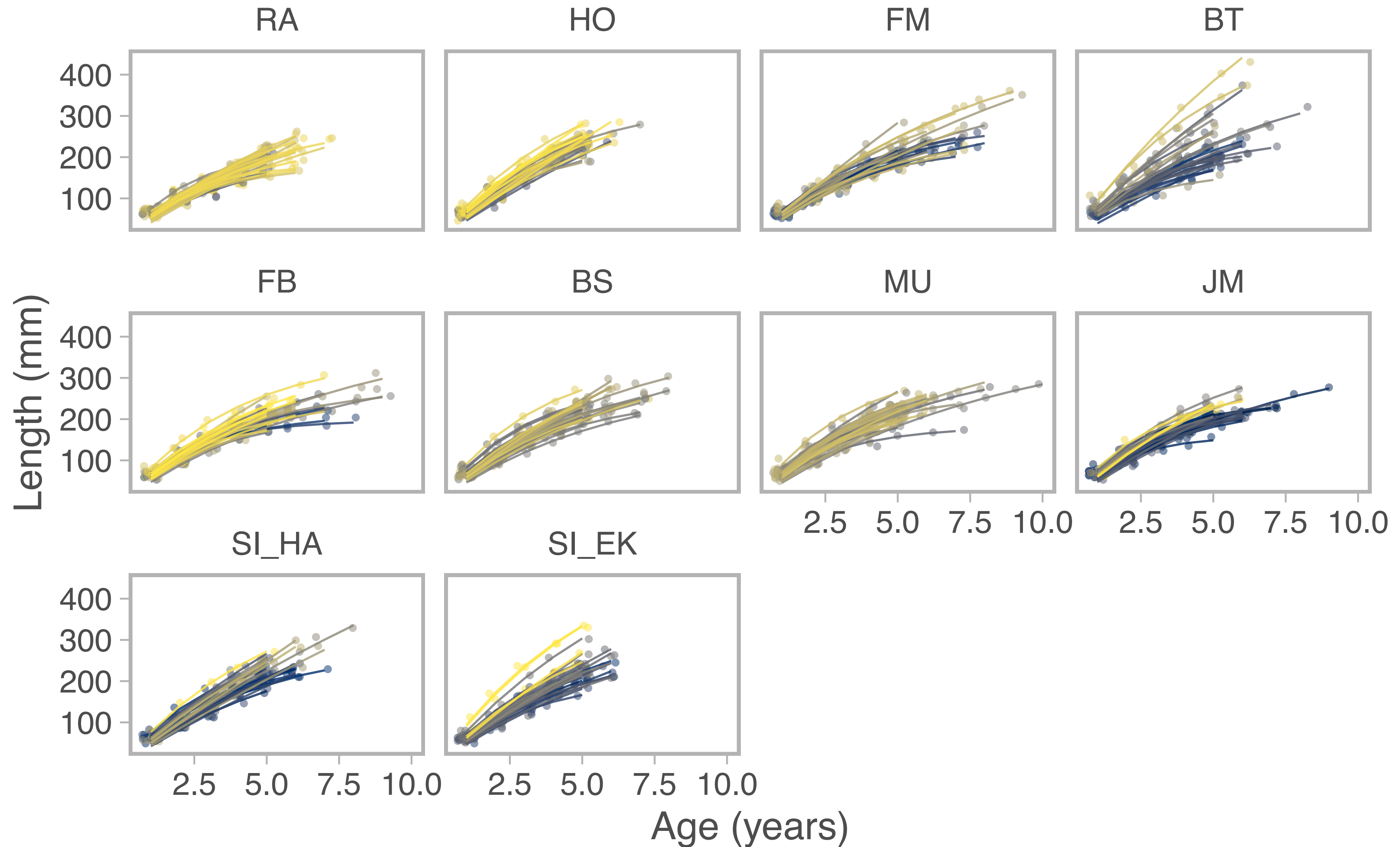
- Calculate median by cohort and area



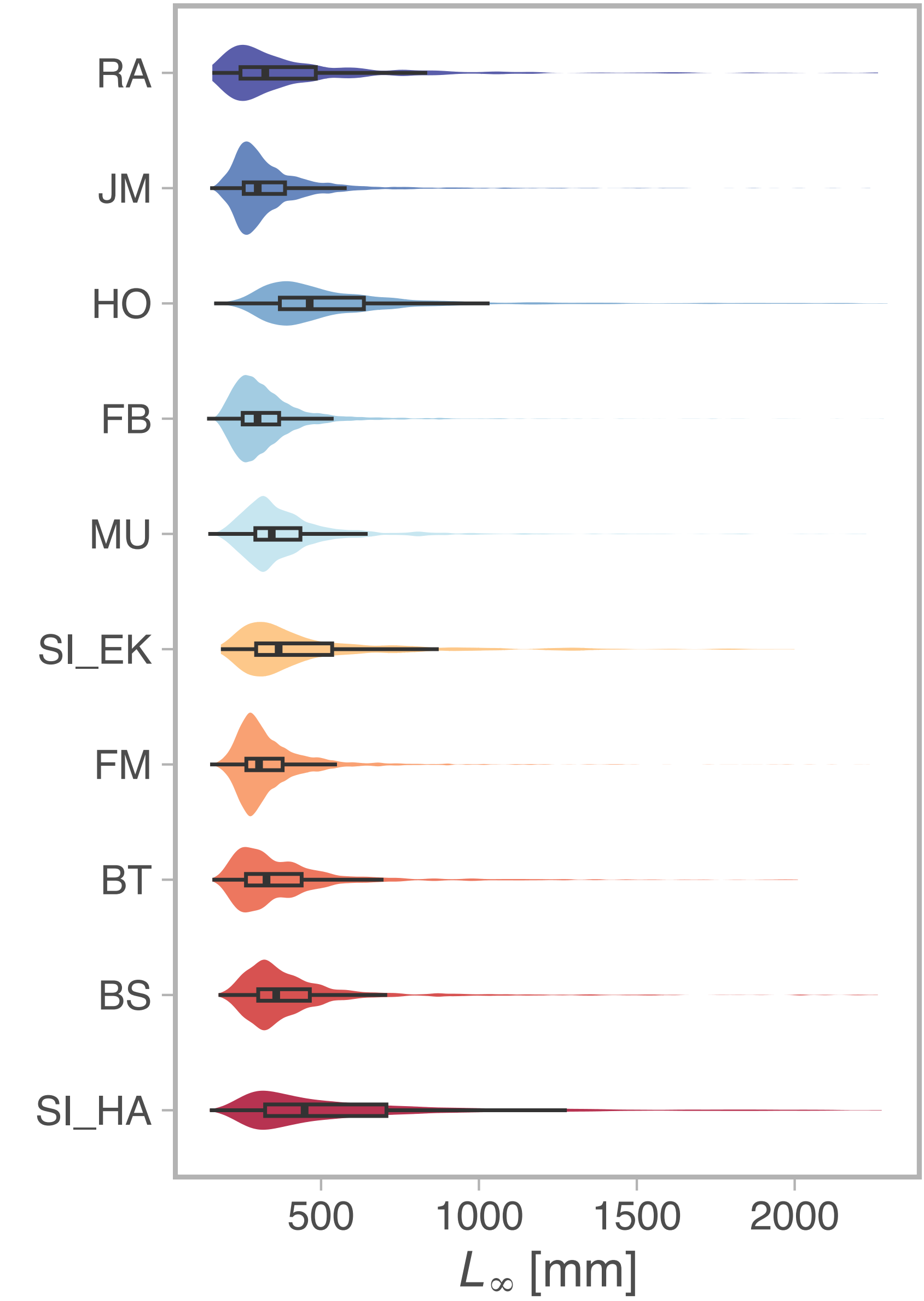
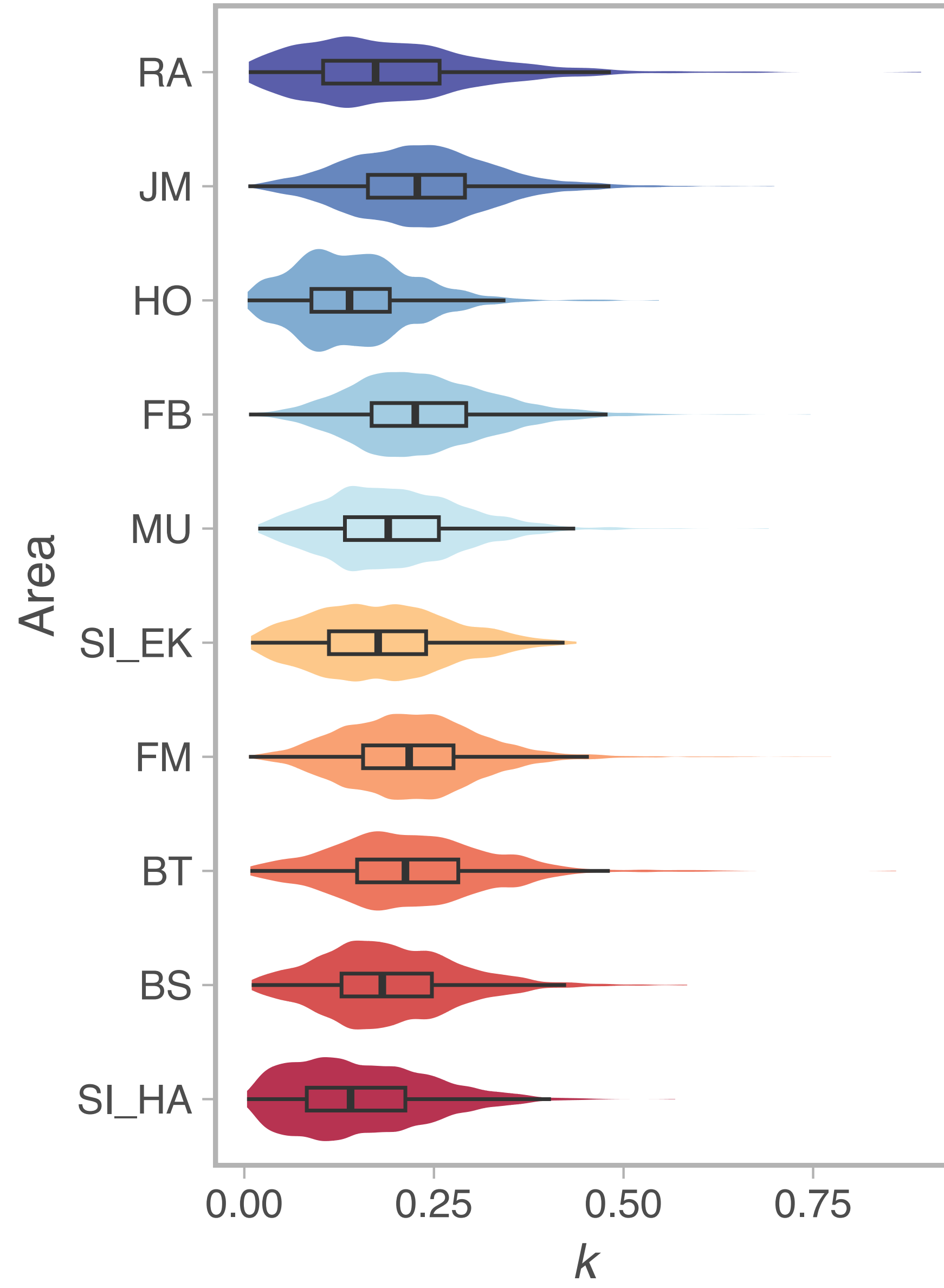
Monitoring stations & sample size



Example VB fits



VB Parameters by area



Temperature data



Temperature data

- Manually measured during fishing
- Temperature loggers (daily)
- ERSST



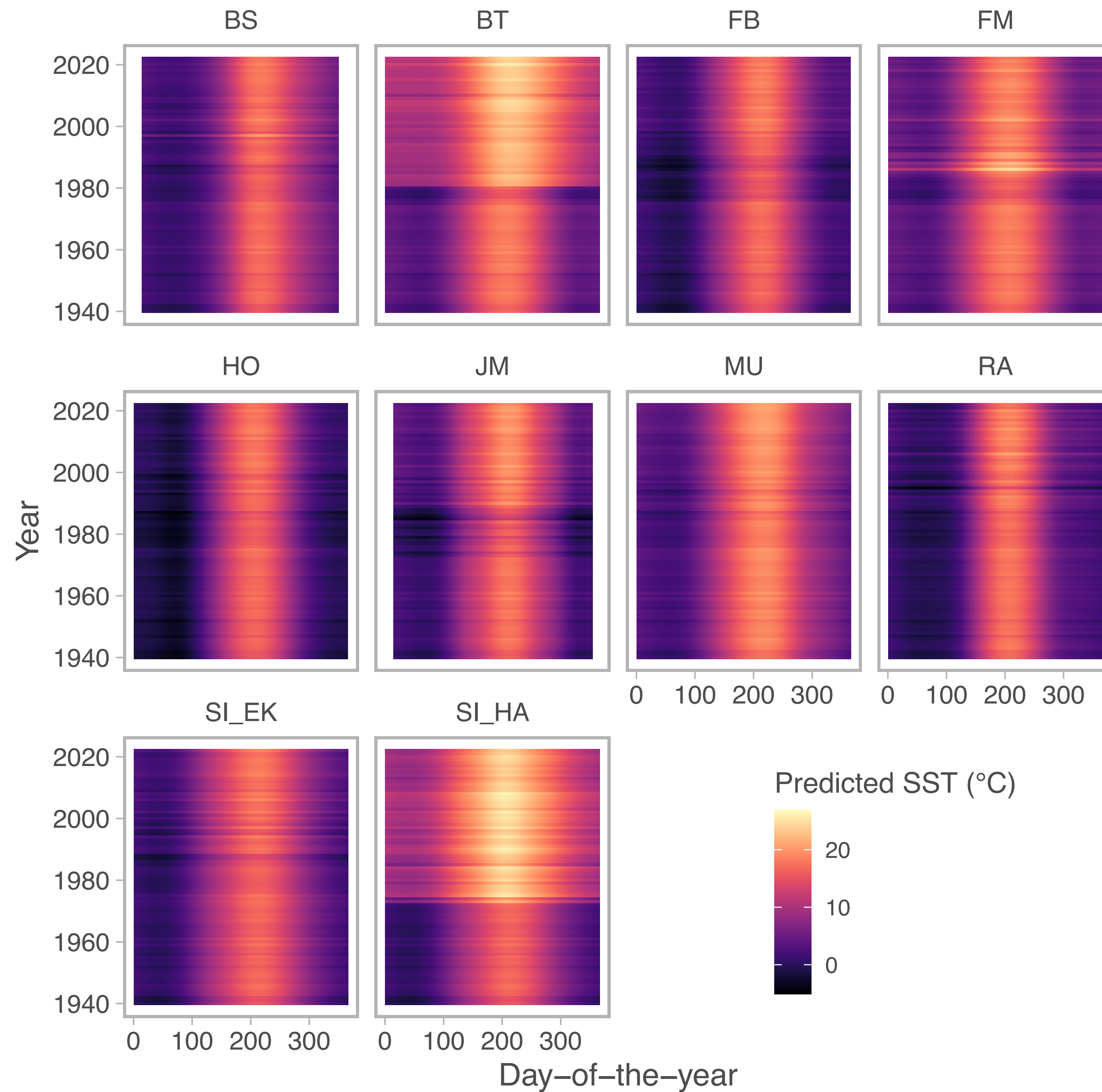
Temperature data

- Fit models to reconstruct time-series of temperature {sdmTMB}
- Predict daily temperatures and calculate annual averages

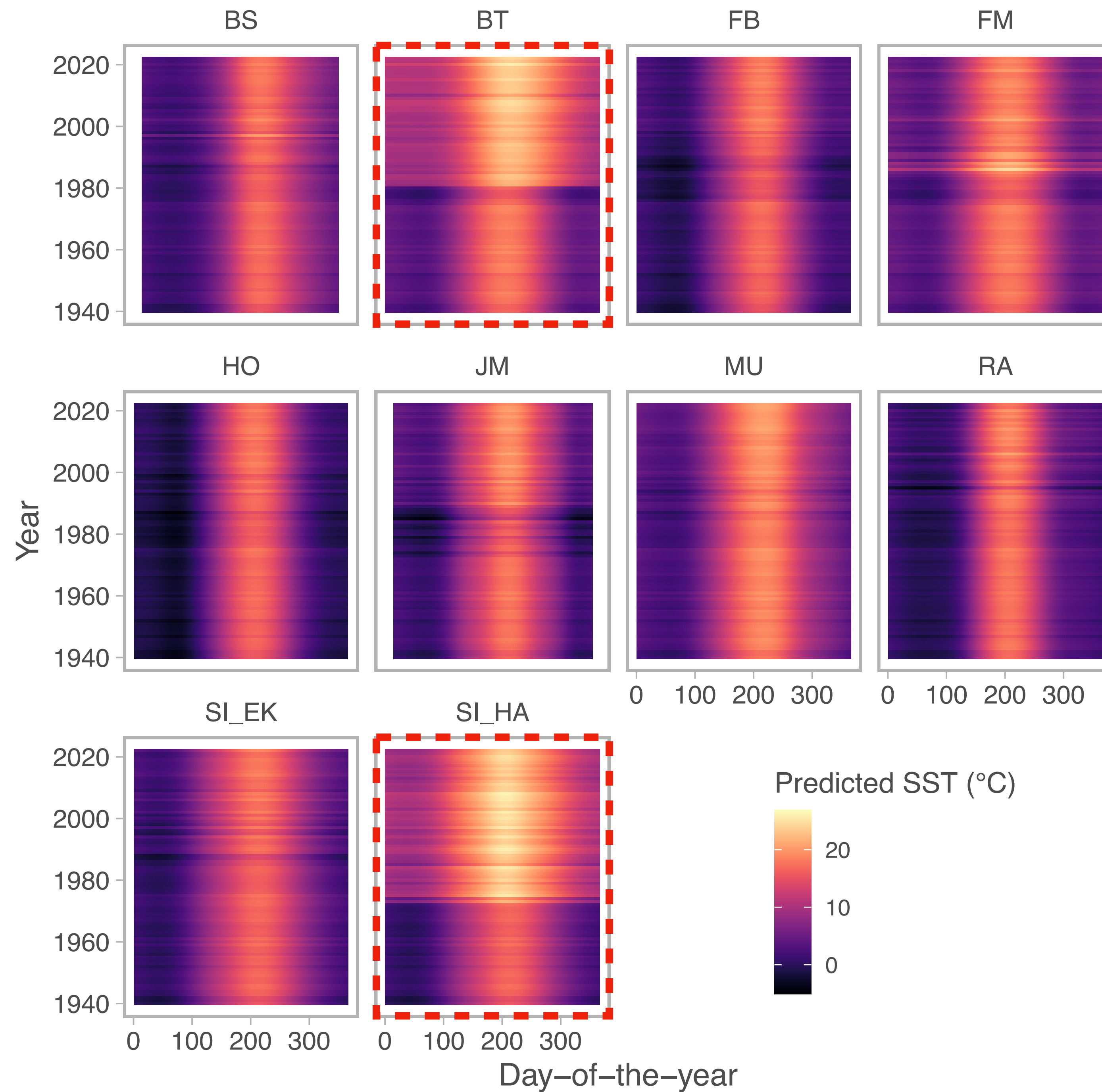
$$SST_i = \text{Student-t}(\nu, \mu_i, \sigma)$$

$$\mu = \alpha_t + s(\text{day}) + \text{source}$$

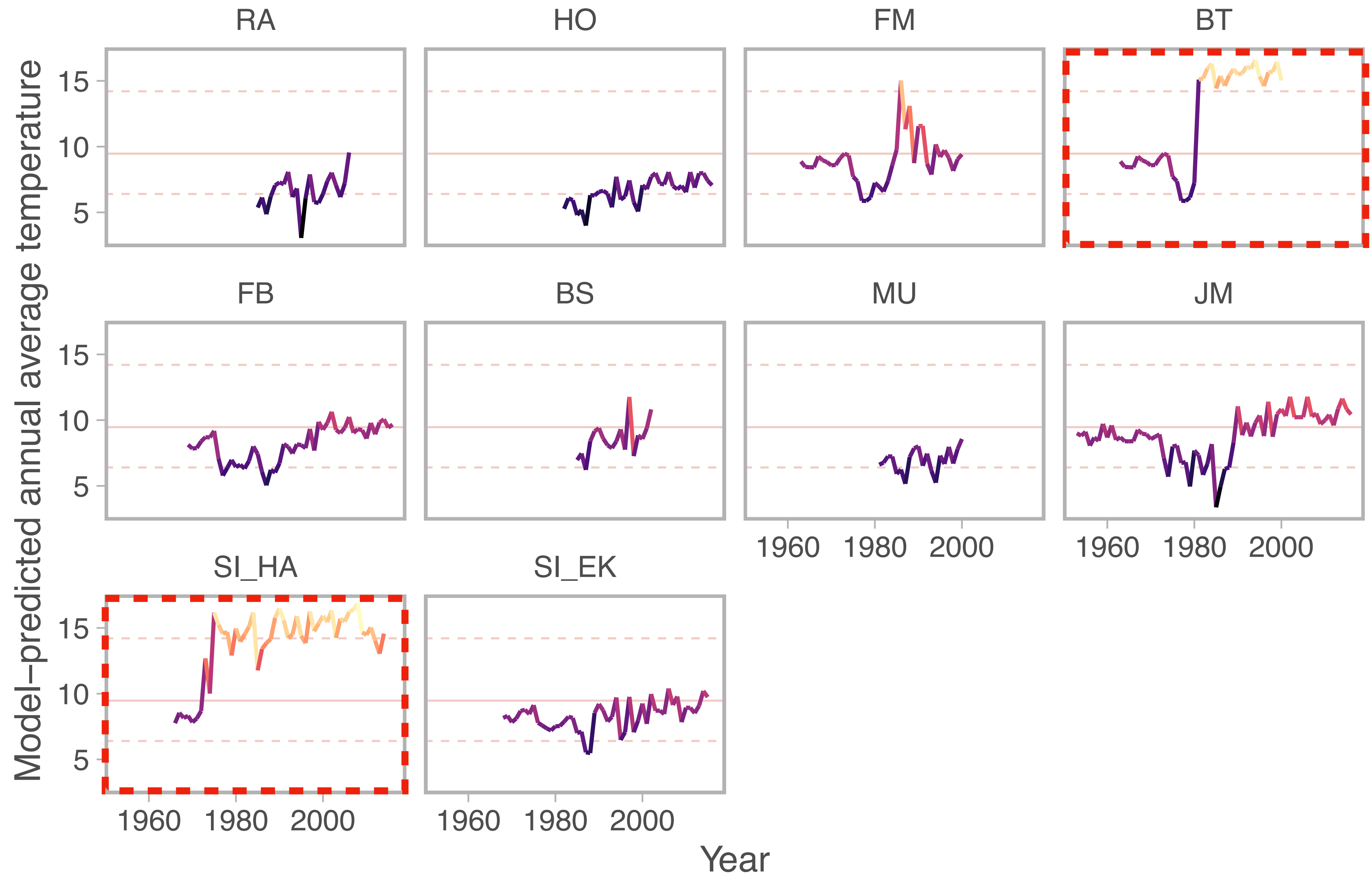
Temperature predictions



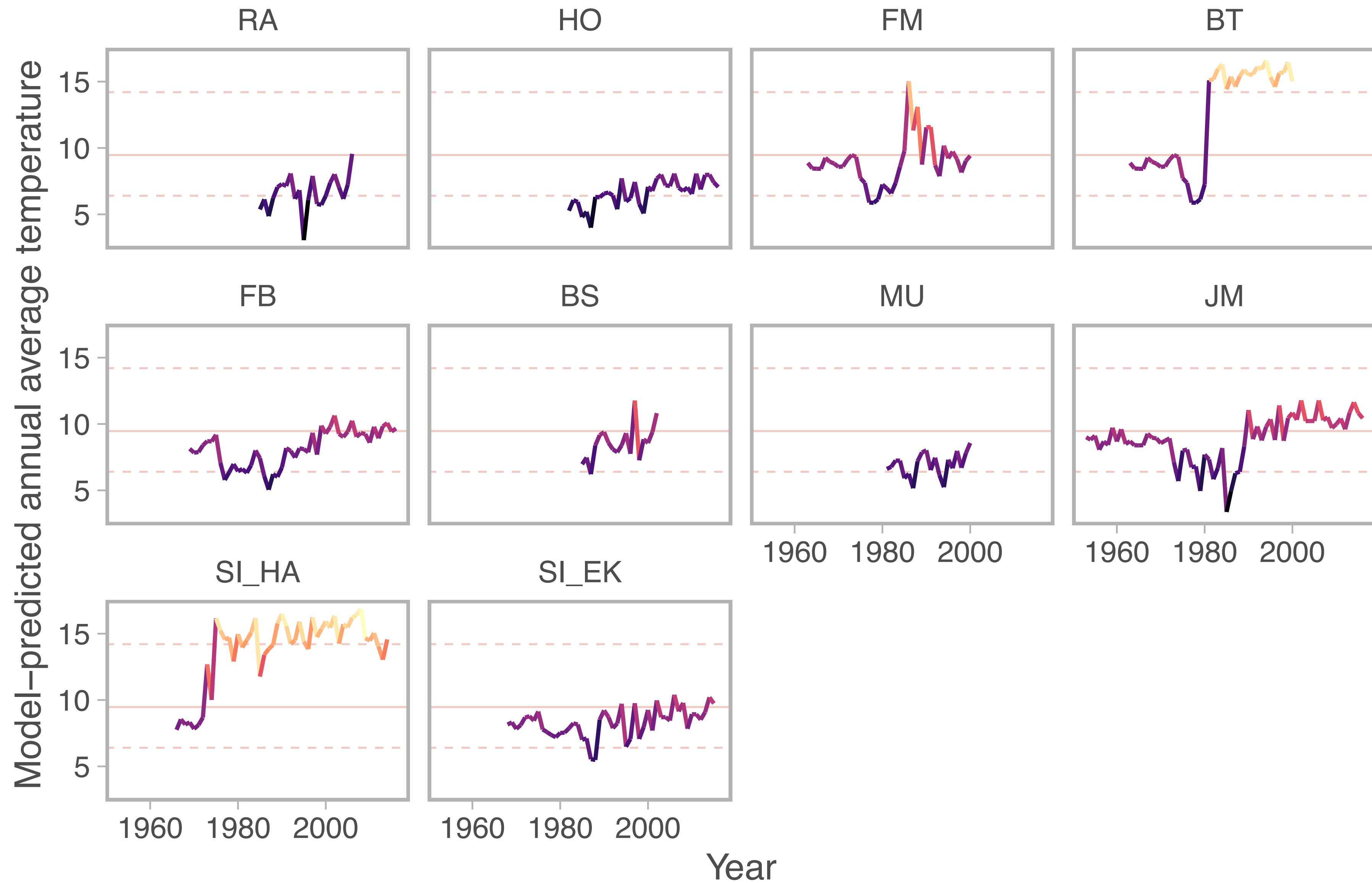
Temperature predictions



Annual average temperatures



Annual average temperatures



Growth~Temperature

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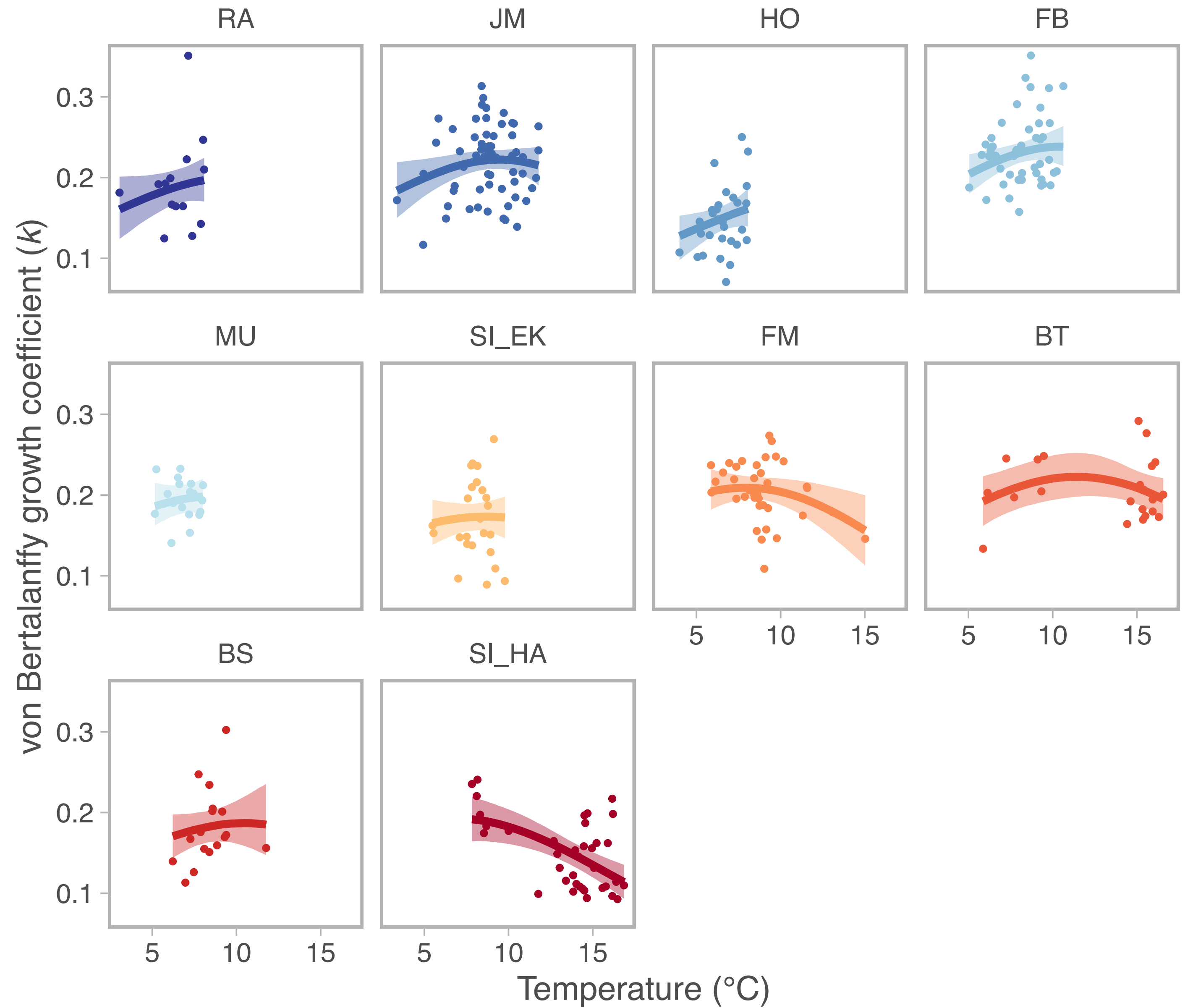
- Fit Sharpe-Schoolfield model to k {brms}

$$k_i = \text{Student-t}(\nu, \mu_i, \sigma)$$

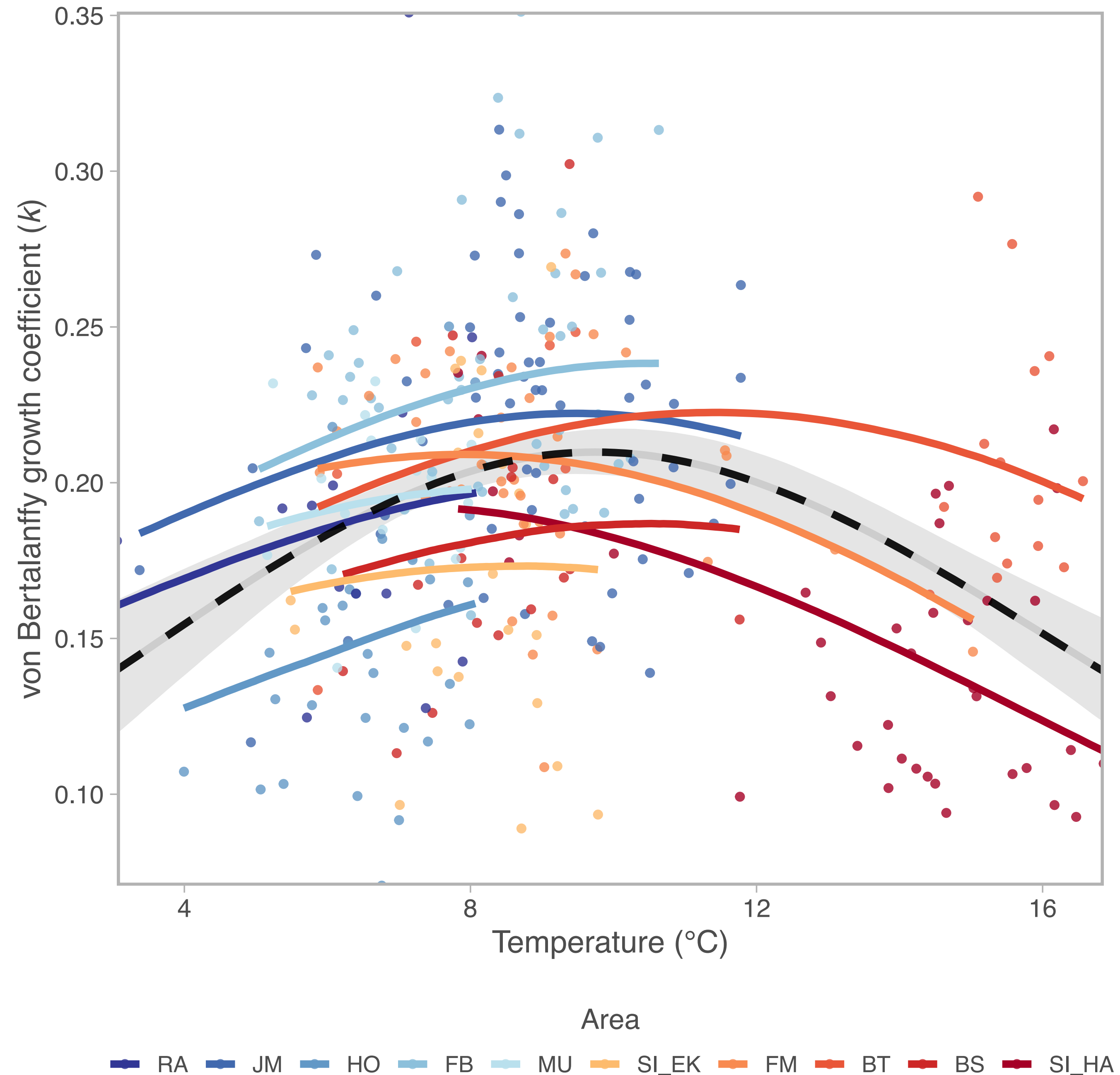
$$\mu = \frac{b(T_c)e^{E(\frac{1}{kT_c} - \frac{1}{kT})}}{1 + e^{E_h(\frac{1}{kT_h} - \frac{1}{kT})}}$$

- Area random effect for all parameters OR global model
- Informative priors

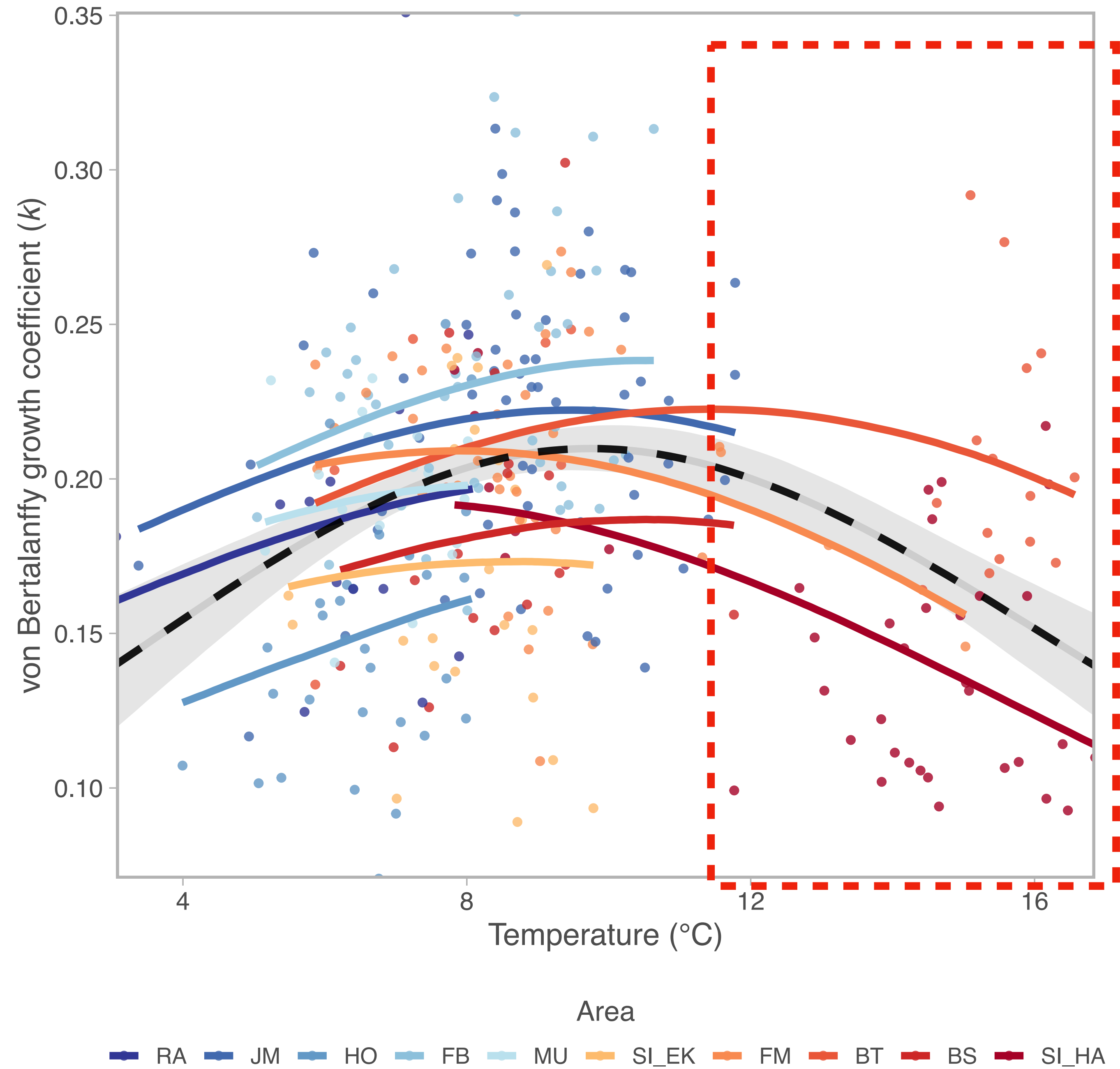
Non-linear growth~temperature by area



Area-specific
predictions align
with the global
prediction

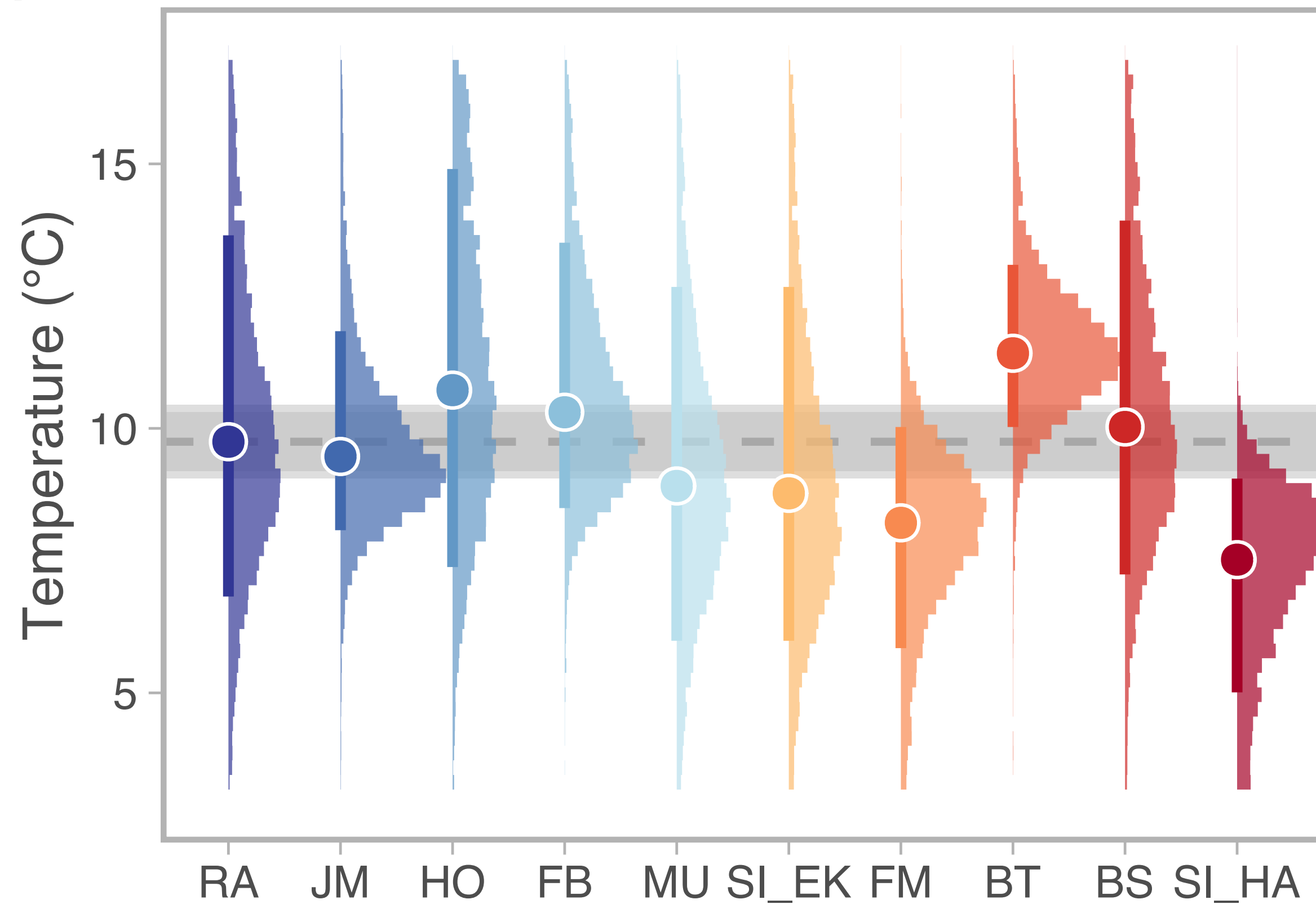


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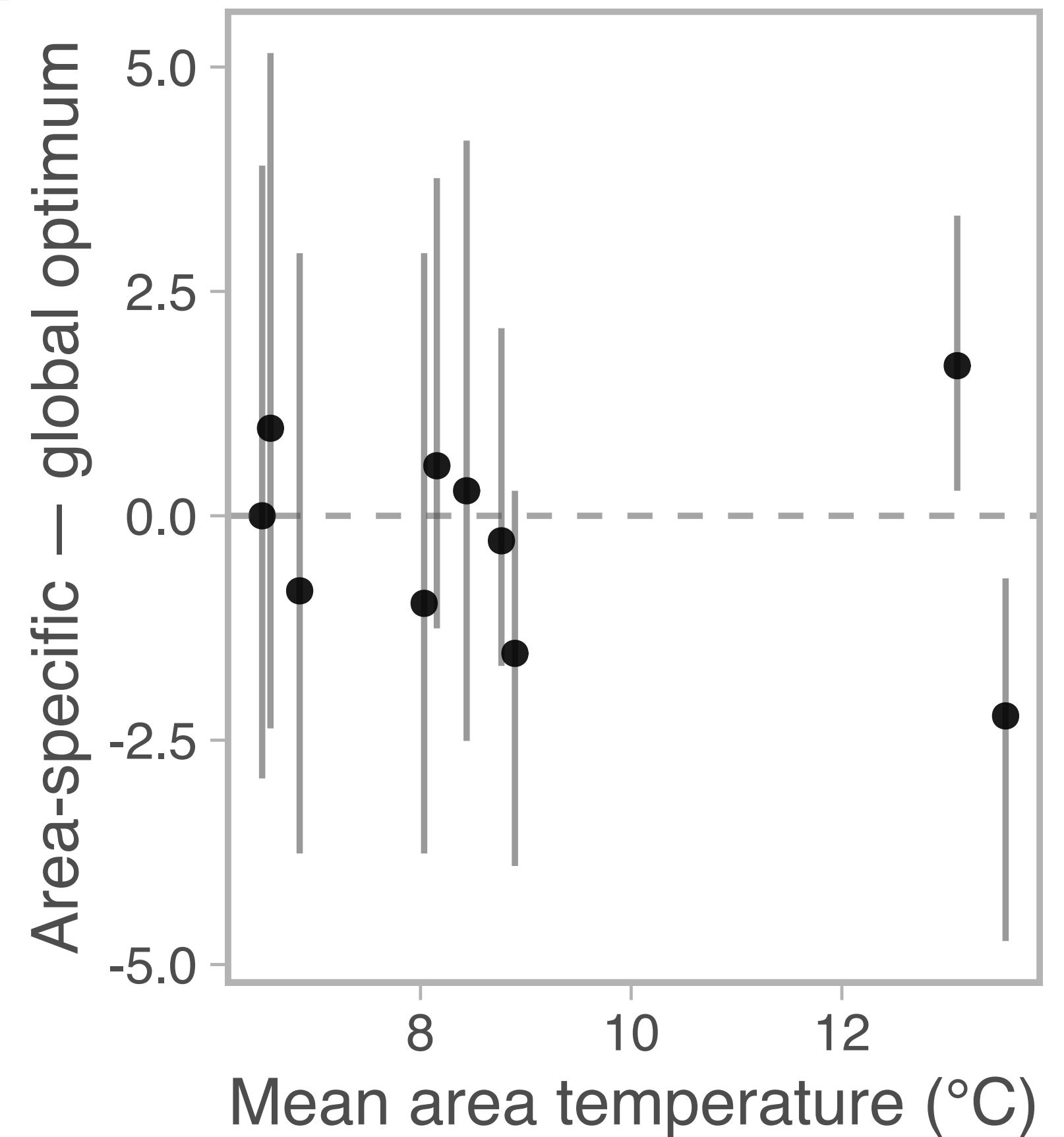


No systematic deviation in area-specific optimum from global optimum

A



B



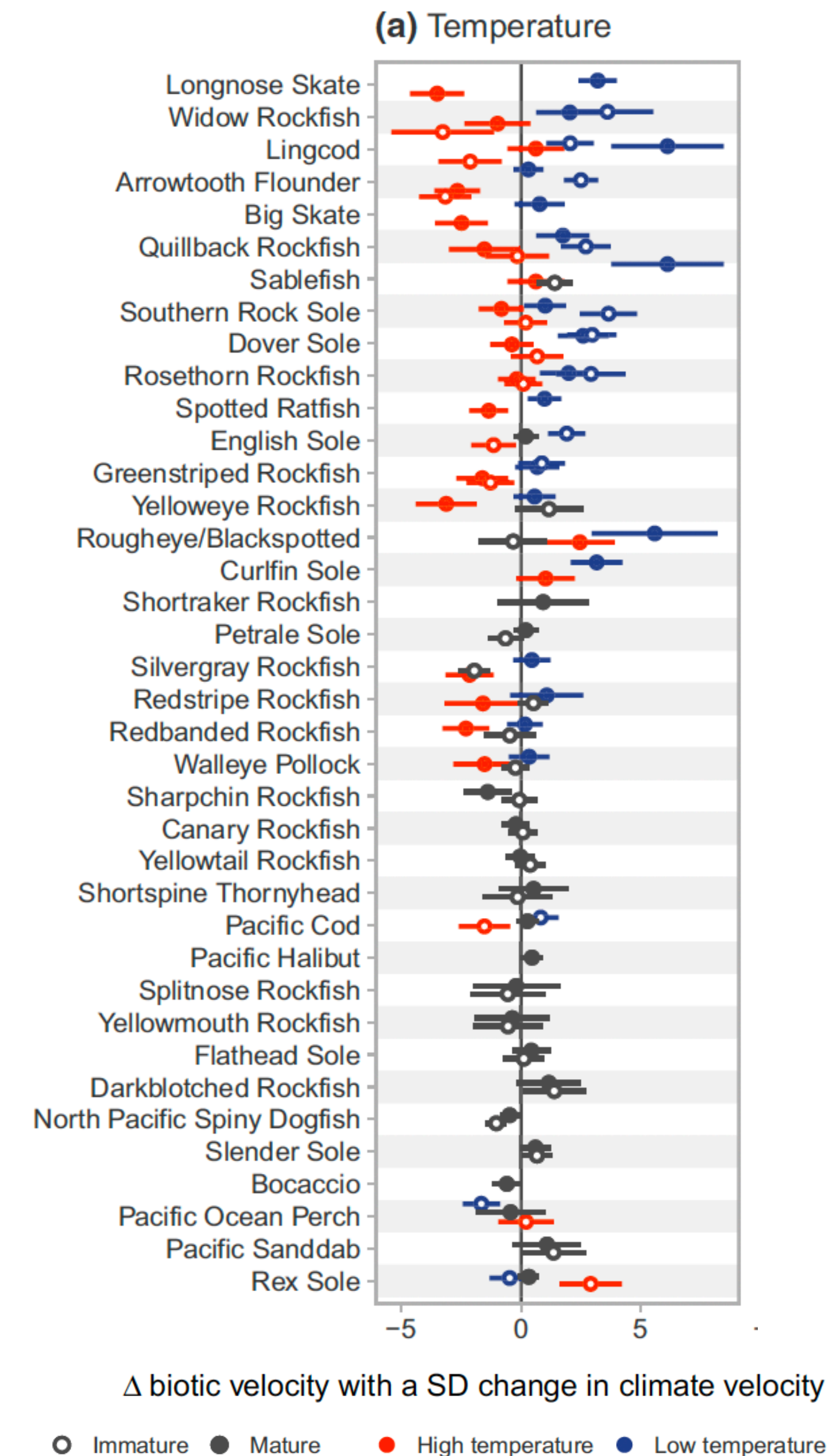
Summary & Outlook

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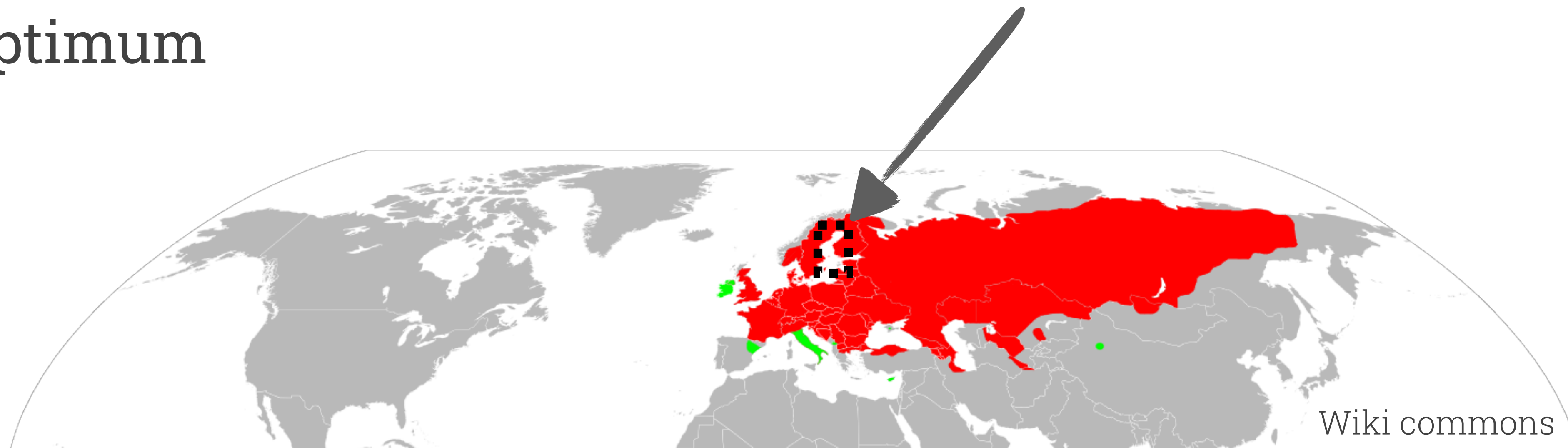


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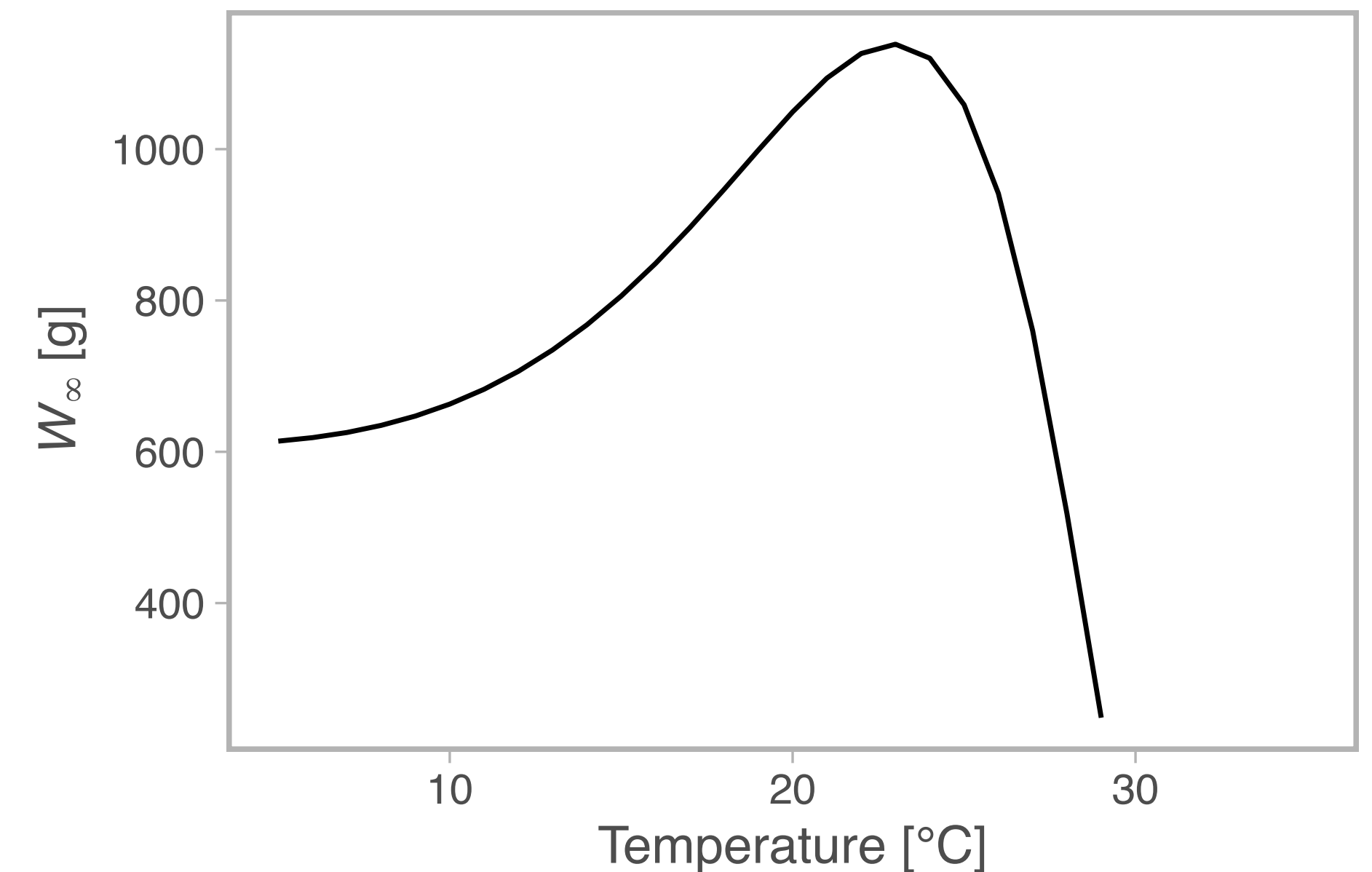
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$$\frac{dW}{dt} = a(T)W^y - b(T)W^z$$

$$W_{\infty} = (a/b)^{1/(z-y)}$$



Thank you for
listening!

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