

SPECIES DISTRIBUTION MODELS: Ecological Explanation and Prediction across Space and Time

This supplement provides additional references for the information in our review, following the same structure as the main article. We have selectively listed papers that will either lead to a useful breadth or depth of others, illustrate a particular concept or application, or represent different environments, model uses or promising new approaches.

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Conceptual And Technical Underpinnings

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Supplemental Material: Annu. Rev. Ecol. Evol. Syst. 2009. 40:677-697

doi: 10.1146/annurev.ecolsys.110308.120159

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Methods for modeling: mathematical form and fitting procedures

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doi: 10.1146/annurev.ecolsys.110308.120159

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doi: 10.1146/annurev.ecolsys.110308.120159

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