Bayesian hierarchical GAM to model BBS data

*RESEARCH ARTICLE*

**Improved status and trend estimates from the North American Breeding Bird Survey using a Bayesian hierarchical generalized additive model**

Adam C. Smith1\* and Brandon P.M. Edwards 2

1Canadian Wildlife Service, Environment Climate Change Canada, National Wildlife Research Centre, Ottawa Canada K1A 0H3.

ORCID: 0000-0002-2829-4843

2Department of Mathematics & Statistics, University of Guelph, Guelph Canada.  
ORCID: 0000-0003-0865-3076

\* Corresponding author: adam.smith2@canada.ca

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**Data Depository:** R scripts to download the BBS data and to perform the analyses in this paper and are archived at [www.github.com/AdamCSmithCWS/GAM\_Paper\_Script](http://www.github.com/AdamCSmithCWS/GAM_Paper_Script)

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