

# Correlates of Vertebrate Extinction Risk in Canada

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*Species status assessments are often hindered by a paucity of demographic, abundance, or distributional data. Although extinction-risk correlates have been identified, their wide applicability may be compromised by differences in the variables examined, modeling technique, and phylogenetic or distributional scale. Here, we apply a common analytical approach to examine 14 possible extinction-risk correlates for mammals, fishes, and birds throughout Canada. Among mammals, risk is positively and strongly correlated with road density and age at maturity for land animals and weakly with body size for sea dwellers. Delayed maturity is of primary importance to predicting risk status in fishes, with small body size of secondary importance in freshwater environments. For birds, road density is the dominant correlate of risk. Logistic regression in a multimodel framework offers an instructive means of identifying risk correlates and of applying them in a practicable, empirically defensible manner, thus enhancing support for species-independent risk criteria.*

*Keywords:* life history, mammals, fishes, birds, human impact, COSEWIC

**I**nternational concerns about global and regional reductions in the abundance of plants and animals have hastened efforts to identify correlates of extinction risk in a wide variety of species (Purvis et al. 2000a, 2000b). Such correlates are particularly important in that they can enable the rapid assessment of poorly understood species groups on the basis of their similarities to more heavily studied taxonomic or geographic neighbors. Concomitant with this work is the question of whether extinction-risk correlates are likely to differ among species groups or whether the correlates are sufficiently similar that one might be justified in applying risk-assessment criteria and associated thresholds to assessments of species status that are independent of taxonomic affiliation (Mace et al. 2008).

The study of extinction-risk correlates has, to date, been focused primarily on vertebrates. Body size, for example, is positively associated with extinction risk in many groups—for instance, birds (Bennett and Owens 1997); terrestrial mammals (Cardillo et al. 2005); marine mammals (Dulvy et al. 2003); and marine fishes (Jennings et al. 1998), although both small- and large-bodied freshwater fishes may be at greater risk (Olden et al. 2007). Age at maturity is also linked to extinction probability—for example, in freshwater fishes (Parent and Schriml 1995), terrestrial mammals (Purvis et al. 2000b), and marine fishes (Denney et al. 2002)—almost certainly because of its negative association with maximum population growth rate (Cole 1954). Litter or clutch size (fecundity in fishes) has divergent associations with extinction probability in some groups—negative correlation in land mammals (Purvis et al. 2000b), positive association in birds (Jiguet et al. 2007)—or none at all in others,

such as marine fishes (Hutchings 2001). Unsurprisingly, narrow distributional range (e.g., Purvis et al. 2000b, Long et al. 2007) and low abundance (e.g., Purvis et al. 2000b, O'Grady et al. 2004) have also been associated with greater risk of extinction. We present a summary of these and additional life-history, ecological, and behavioral correlates in table 1.

Prominent among anthropogenic correlates of risk are those that affect habitat (Dulvy et al. 2003, Venter et al. 2006, Schipper et al. 2008), one generic (albeit indirect) metric of which is road density within a species' range (Chu et al. 2003). For some taxonomic groups, such as freshwater fishes, physical alterations to habitat may make it difficult to reliably distinguish the biological correlates of extinction risk from those associated with habitat degradation (Duncan and Lockwood 2001, Reynolds et al. 2005a, Olden et al. 2007). A second dominant correlate is exploitation pressure effected by unsustainable rates of fishing or hunting (Dulvy et al. 2003, Hutchings and Reynolds 2004, Schipper et al. 2008).

Notwithstanding the considerable strengths of the analyses undertaken to date, because most have been restricted to a single taxonomic class or subclass (table 1), it is unclear how broadly applicable the results might be across different taxonomic groups within a specific conservation or management region in which species status assessments are often undertaken. Generality may also be compromised by an inconsistency in analytical techniques, by inconsistent choices of potential extinction-risk correlates (and differing units of measurement), and by differences in the habitats or distributional scales of the species of interest (e.g., temperate, tropical, marine, freshwater, terrestrial, coral reef environments). There is also the question of how

**Table 1. Life-history, ecological, and behavioral correlates of extinction risk in vertebrates.**

Positive correlate of extinction risk	Taxonomic group	Sources
Large body size	Terrestrial mammals	Cardillo and Bromham 2001, Cardillo 2003, Cardillo et al. 2005, Davidson et al. 2009
	Marine mammals	Dulvy et al. 2003
	Freshwater fishes	Olden et al. 2007
	Marine fishes	Jennings et al. 1998, Denney et al. 2002, Dulvy et al. 2003, Reynolds et al. 2005b, Field et al. 2009
	Birds	Bennett and Owens 1997, Norris and Harper 2004
Small body size	Freshwater fishes	Reynolds et al. 2005a, Olden et al. 2007
Age at maturity	Terrestrial mammals	Purvis et al. 2000b
	Freshwater fishes	Parent and Schriml 1995
	Marine fishes	Denney et al. 2002, Myers and Worm 2005, Reynolds et al. 2005b
Small litter or clutch size	Terrestrial mammals	Purvis et al. 2000b
	Birds	Bennett and Owens 1997, Krüger and Radford 2008
Small distributional range	Terrestrial mammals	Purvis et al. 2000b
	Freshwater fishes	Reynolds et al. 2005a
	Birds	Long et al. 2007, Manne et al. 1999
Low latitudinal midpoint	Freshwater fishes	Reynolds et al. 2005a
Low density or population size	Terrestrial mammals	Purvis et al. 2000b, Davidson et al. 2009
	Birds	O'Grady et al. 2004
Trophic position	Terrestrial mammals	Purvis et al. 2000b
Low natal dispersal/migration	Birds	Jiguet et al. 2007

different scales of examination (e.g., spatial, taxonomic) might affect the influence of extinction-risk correlates. Differences in ecology or life history also predispose species to respond differently to various threats. With birds, for example, habitat specialists appear to be particularly vulnerable to habitat loss (Owens and Bennett 2000).

In light of the limitations to achieving generality associated with performing multiple analyses on different traits across scales, we adopted a common analytical and statistical approach in order to examine a common suite of potential extinction-risk correlates across a wide range of vertebrates, including terrestrial and marine mammals, freshwater and marine fishes, and birds. We constructed predictive models of risk status that accounted for the influence of life history (e.g., age at maturity, clutch or brood size, body size), distribution (e.g., latitude, aquatic depth), and anthropogenic disturbance (e.g., road density, fishing; table 2). Spatially, our analysis was restricted to species in Canadian aquatic and terrestrial environments. The primary reason for focusing on Canadian ecosystems lies in the breadth and wealth of available data on more than 600 species at risk. The information is published by COSEWIC (Committee on the Status of Endangered Wildlife in Canada; [www.cosewic.gc.ca](http://www.cosewic.gc.ca)), the national independent body legally responsible, under the Species at Risk Act, for advising the federal minister of the environment on species that warrant inclusion on the national list of species at risk. Our work builds on that undertaken by Venter and colleagues (2006), who charac-

terized threats across taxonomic groups within Canada by directly comparing at-risk and not-at-risk species.

### Data sources and analysis

The vertebrate species included in our study were those assessed by COSEWIC as being at risk as of March 2008. For the purposes of our analysis, we combined species assessed as extinct, extirpated, endangered, threatened, or of special concern into a single “at-risk” category. To form a comparison data set of sufficient but similar size, we used lists of species in Canada (e.g., [www.wildspecies.ca](http://www.wildspecies.ca)) to randomly select 50 “not-at-risk” species for each of the five vertebrate groups. Taxonomic affiliation is unlikely to have a significant effect on our results, given that the species assessed as being at risk and not at risk were not generally taxonomically biased (see tables S1–S5 in the supplementary online materials at [dx.doi.org/10.1525/bio.2011.61.7.8](https://doi.org/10.1525/bio.2011.61.7.8)). We used online databases (table 2) to collate data on candidate extinction-risk correlates for the not-at-risk species; for the at-risk species, we consulted COSEWIC status reports and recovery strategies ([www.sararegistry.gc.ca](http://www.sararegistry.gc.ca)) and supplemented these data using online databases. Where multiple values were present, we recorded the mean. Where values for both male and female members of a species were available, we recorded the values for the female members. Data on amphibians and reptiles were excluded because of either a paucity of life-history information or an insufficient number of species with which to compare the at-risk and

**Table 2. Ranks assigned to potential correlates of extinction risk.**

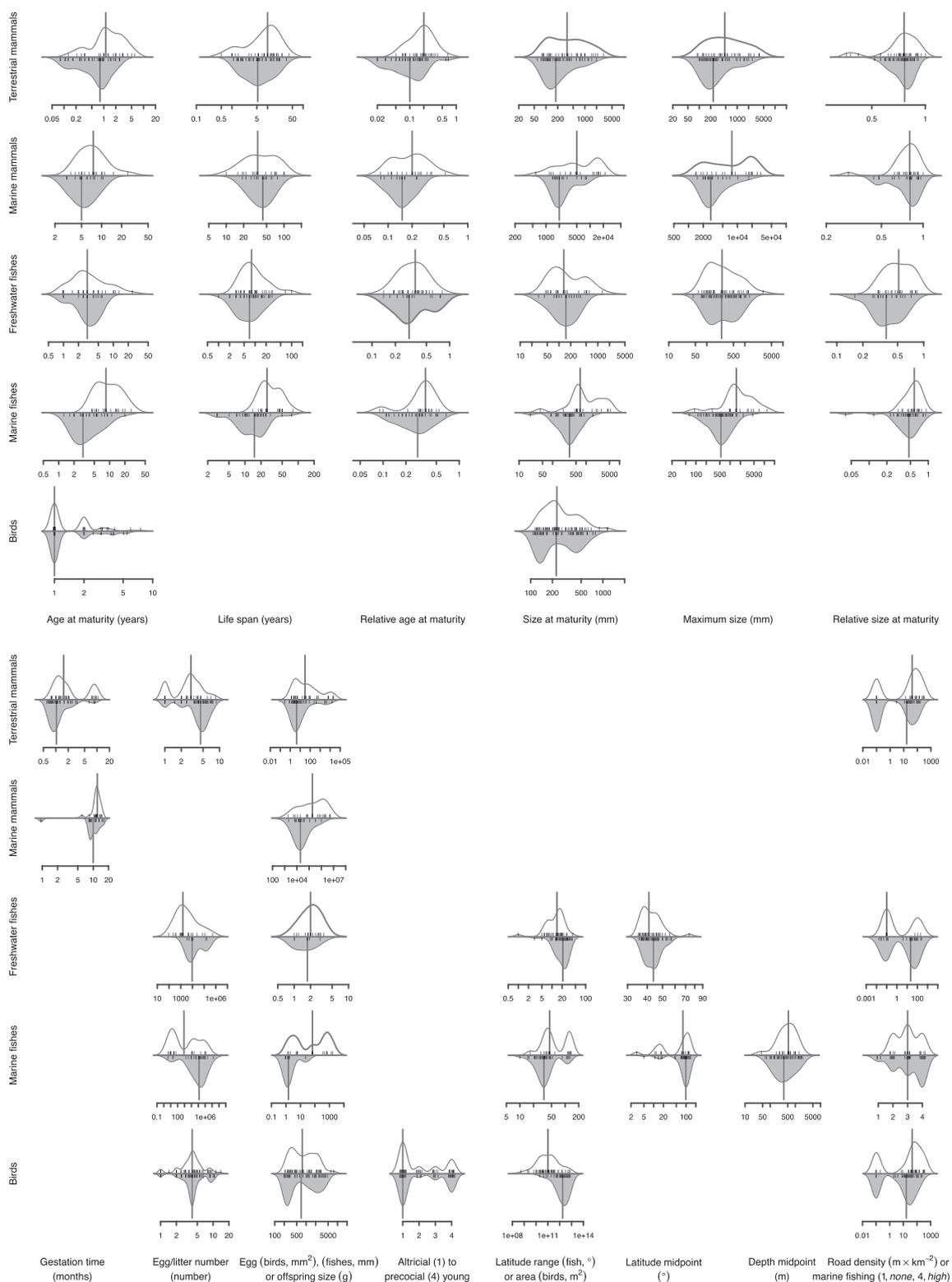
Potential correlates	Terrestrial mammals	Marine mammals	Freshwater fishes	Marine fishes	Birds	Description
Age at maturity	1	2	1	1	2	Age at maturity (in years)
Life span	c	c	c	c	d	Maximum reported age (in years)
Size at maturity	c	c	c	c	2	Length or height at maturity (in millimeters)
Maximum size	2	1	2	2	d	Maximum length or height (in millimeters)
Gestation time	2	2				Gestation average (in months)
Number of eggs or litter size	2	d	d	d	2	Number of eggs or offspring
Size of eggs or offspring	c	c	d	d	c	Egg diameter (fish, in millimeters), egg length x height (birds, in millimeters squared), or offspring mass (mammals, in grams)
Altricial or precocial					2	Altricial or precocial young
Latitude midpoint			3	3		Midpoint between the maximum and minimum latitudes (in degrees)
Depth midpoint			d	2		Midpoint between the maximum and minimum depths (in meters)
Road density	1		d		1	Median road length in range (in meters per square kilometer)
Fishing intensity				3		Commercial fishing intensity (from FishBase: 1, no interest; 2, subsistence or minor commercial; 3, commercial; 4, highly commercial)
<b>Data sources</b>	AnAge database ( <a href="http://www.genomics.senescence.info/species">www.genomics.senescence.info/species</a> ), Animal Diversity Web ( <a href="http://www.animaldiversity.ummz.umich.edu">www.animaldiversity.ummz.umich.edu</a> )	AnAge database ( <a href="http://www.genomics.senescence.info/species">www.genomics.senescence.info/species</a> ), Animal Diversity Web ( <a href="http://www.animaldiversity.ummz.umich.edu">www.animaldiversity.ummz.umich.edu</a> )	FishBase ( <a href="http://www.fishbase.org">www.fishbase.org</a> ), Scott and Crossman 1973	FishBase ( <a href="http://www.fishbase.org">www.fishbase.org</a> ), Scott and Crossman 1973	Birds of North America Online ( <a href="http://www.bna.birds.cornell.edu/bna">www.bna.birds.cornell.edu/bna</a> ), Patuxent Bird Identification InfoCenter ( <a href="http://www.mbr-pwrc.usgs.gov/infocenter">www.mbr-pwrc.usgs.gov/infocenter</a> ), Natureserve ( <a href="http://www.natureserve.org">www.natureserve.org</a> )	

Note: Data-deficient variables (d) and collinear variables (c; variance inflation factor  $\geq 5$  or  $r \geq .7$ ) are shown here but were not included in candidate model sets. Numbers indicate relative importance ranking for each variable, according to summed Akaike weights of models containing that variable (a rank of 1 identifies the variables of greatest importance; values within a relative importance of 0.1 of the next most important variable are denoted with the same rank). In the case of the collinear variables, we chose those that had the most support in the literature and were the easiest to collect reliably.

not-at-risk groups. Frequency distributions of the candidate extinction-risk correlates, which we illustrate as beanplots for visual-comparative purposes (figure 1; Kampstra 2008), show all the data, including those deemed to be either excessively collinear (see below) or of insufficient sample size or data quality to include in the modeling process (table 2). We did not include range size in our models, given that it is frequently used in classifying species as at risk (figure S1), and we were concerned that our results might then be confounded by the listing criteria.

As a proxy for human disturbance of terrestrial habitat, we calculated road density as the median length of

roads, in meters per square kilometer, from road network coverage maps available from GeoGratis (Government of Canada; [www.geogratis.ca](http://www.geogratis.ca)) within the species' Canadian terrestrial ranges. For the marine fishes, we used a discrete metric of human impact reported in FishBase ([www.fishbase.org](http://www.fishbase.org)), called *commercial fishing intensity*, which we grouped into four classes: (1) no interest, (2) subsistence fishery or minor commercial interest, (3) commercial interest, and (4) high commercial interest. The lack of range maps for 55% of the freshwater fish species in our data set (Scott and Crossman 1973) prevented us from including nearby road density as a potential correlate for



**Figure 1.** Beanplots of potential correlates of extinction risk for five groups of vertebrate species in Canada. The short vertical lines indicate species for which data are available. The estimated density of the distribution of values is shown for at-risk (white) and not-at-risk (gray) species in the form of curved polygons (beans). The median of each distribution is shown with a long vertical black line. Note the log-distributed horizontal axes. Missing plots were either data deficient (depth midpoint for freshwater fishes, range area for terrestrial and marine mammals, life span and maximum size for birds) or not applicable (all others). Relative age at maturity is the age at maturity divided by life span. Relative size at maturity is the size at maturity divided by maximum size. Abbreviations: g, grams; m, meters; mm, millimeters;  $m \times km^{-2}$ , meters per square kilometer; °, degrees.

freshwater fishes in the predictive modeling portion of our analysis. The few existing data on metrics of past harvest intensities for Canadian marine mammals prevented us from including a metric of human-associated extinction risk for this taxonomic group.

We constructed predictive models of species risk status (at risk versus not at risk) using generalized linear models with a binomial family and a logit link in a multimodel framework. The resulting logistic regression can be expressed as

$$\text{logit}(p_i) = \log\left(\frac{p_i}{1-p_i}\right) = \beta_0 + \beta_1 x_{1,i} + \dots + \beta_k x_{k,i},$$

where  $p_i$  is the estimated probability of being at risk for a given species  $i$ ,  $\beta_0$  is an intercept, and  $\beta_1$  through  $\beta_k$  are the coefficients of independent variables  $x_{1,i}$  through  $x_{k,i}$ . The  $k$  covariates used to fit the models were selected on the basis of their potential importance as extinction-risk predictors, as it was determined by previous research (see table 1), and the ease with which they could be measured reliably. We excluded collinear variables (for which the variance inflation factor was greater than five; Menard 1995) and variables that were highly correlated ( $r \geq .7$ ) with one another (table 2). Finally, we used variables for which values were available for at least 50% of both the at-risk and the not-at-risk species. We fit all candidate models with the  $k$  covariates as main effects and generated averaged predictive models by ranking the models by their Akaike information criterion with a correction for small sample sizes ( $AIC_c$ ; Sugiura 1978, Burnham and Anderson 2002) and averaging the coefficients on the basis of their Akaike weights (see the supplementary online materials for full details of the multimodel analysis).

### Model evaluation

We evaluated the predictive performance of the models by carrying out 10-fold cross-validations (Stone 1974, Kohavi 1995). For each taxonomic group, we divided the data into 10 subsets, retaining 1 subset for validation while fitting each candidate model to the remainder of the data. We repeated the process for each subset before repeating the entire 10-fold cross-validation procedure 1000 times to obtain an average misclassification rate (MR) for each candidate model. Ten-fold cross-validation is commonly used in this sort of investigation because lower-fold (two- or five-fold) validations often introduce greater variation because of the limited size of the training data and because higher-fold validations (e.g., the leave-one-out method) can introduce increased bias (Kohavi 1995). Receiver operating characteristic curves provide a measure of model performance at different prediction cutoffs. The area under such curves (AUC) represents the probability that a given species will be categorized correctly. We report the MR and AUC values both for comparison with the  $AIC_c$  ranking and as a method for comparing model performance across taxonomic groups.

Given that the International Union for Conservation of Nature (IUCN) Red List criteria are used as a starting point for discussion of a species' status in COSEWIC assessments, that the Red List criteria indirectly use generation time as a method to scale time-based life-history parameters, and that generation time is related to age at maturity (Cole 1954), we conducted two additional analyses to ensure that any correlates identified here were not purely a consequence of their having been used to assess species status. First, we tested whether generation time was positively related to scaled population decline for at-risk species within one taxonomic group (marine fishes), the taxonomic group for which magnitude of population decline is most often used as a basis for assessing status (figure S1). Second, given that the IUCN Red List criteria are not used to assess whether species are of special concern, we tested the sensitivity of our results by comparing special-concern species with not-at-risk species (i.e., excluding extinct, extirpated, endangered, and threatened species).

### Analysis of relative life-history traits

As an additional exploratory analysis, we also tested for differences in relative age at maturity (age at maturity divided by life span) and relative size at maturity (size at maturity divided by maximum size) between the at-risk and the not-at-risk species. We reasoned that the differences in somatic and reproductive investment indicated by these variables could affect risk status. For example, those species that mature late relative to their life spans might not readily be able to depend on a lengthy reproductive period of life to offset greater mortality. We did not include these relative measures at our predictive modeling stage for two reasons. First, we lacked strong prior empirical support for doing so (these measures had not been examined previously). Second, their inclusion would have generated an excessive number of candidate models, given our data set sizes, and would have reduced our capacity to make valid predictive inferences (Burnham and Anderson 2002). We excluded birds from this part of the analysis because of uncertain and imprecise determinations of maximum natural life spans (which can exceed 50 years in pelagic seabirds; Holmes and Austad 1995) and maximum body sizes for all but a small number of species. We fit logistic regressions modeling risk status as a function of relative life-history traits within each taxonomic group.

### Results of the analysis

The candidate extinction-risk correlates in our analyses were generally—although not always—characterized by unimodal distributions (figure 1). In addition to allowing for a visual comparison of median and modal values between the at-risk and not-at-risk species, the beanplots illustrate the breadth of data that were typically available for each of the 14 potential correlates within each vertebrate group. After removing the species with incomplete data for all investigated variables in our models, our sample sizes ranged from 14 to 40 for the not-at-risk species and from 16 to 29 for the at-risk species (table S6).

Based on the values of the Akaike weights ( $w_i$ ) and  $\Delta_i$  ( $AIC_{c(i)} - AIC_{c(\min)}$ , where  $AIC_{c(i)}$  is the  $AIC_c$  value for model  $i$  and  $AIC_{c(\min)}$  is the smallest  $AIC_c$  value in the set of models, our analyses revealed support for more than one model within each of the five taxonomic groups (largest  $w_i = 0.44$ , between two and four models with  $\Delta_i < 2$ ; table 3). As a consequence, we incorporated all of the candidate models (including those with  $\Delta_i \geq 2$ ) into the averaged model for each group of species (figures 2 and 3; table S7). The resultant models for terrestrial mammals and marine fishes performed well ( $AUC = 0.80$ – $0.93$ ,  $MR = 0.22$ – $0.34$ , for models with  $\Delta_i < 2$ ; table 3), whereas the predictive models were less accurate for the marine mammals (best two models,  $AUC = 0.67$ – $0.74$ ,  $MR = 0.34$ – $0.35$ ), freshwater fishes ( $AUC = 0.55$ – $0.77$ ,

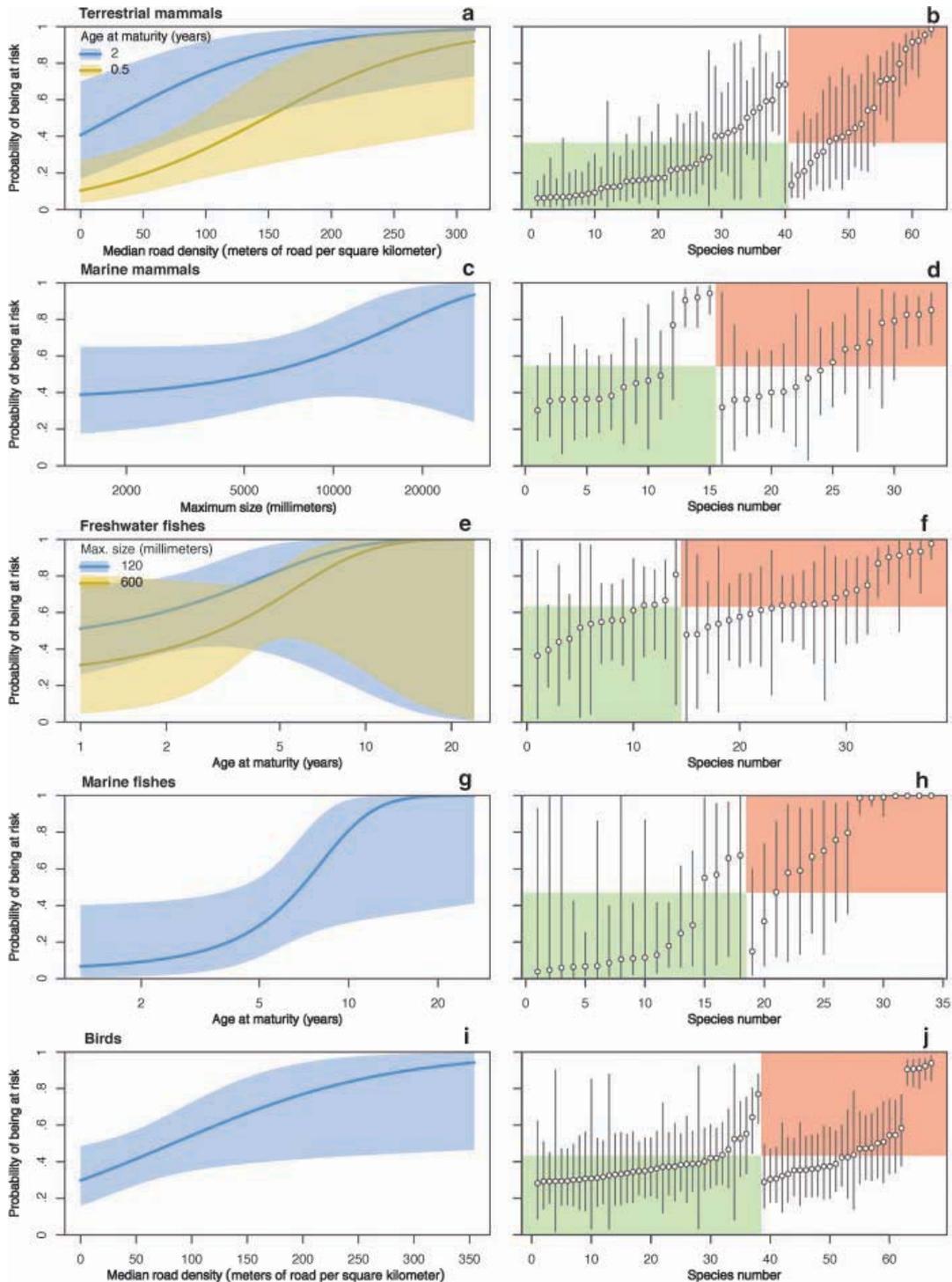
$MR = 0.36$ – $0.42$ ), and birds (best two models,  $AUC = 0.66$ – $0.70$ ,  $MR = 0.39$ – $0.43$ ; table 3). The misclassification rate based on the averaged predictive models was lowest for the marine fishes ( $MR = 0.18$ ) and highest for the marine mammals ( $MR = 0.39$ ; figure 2).

Among all of the variables examined, age at maturity was the most consistently important (and positive) correlate of risk status, ranking among the most important variables for the terrestrial mammals, freshwater fishes, and marine fishes (figures 2a, 2e, 2g, and 3; table 2; table S7). Although there was some evidence that risk declined with maximum size in the freshwater fishes, there was less evidence of a link between maximum size and status for the marine fishes, for which the data suggested a weakly positive association

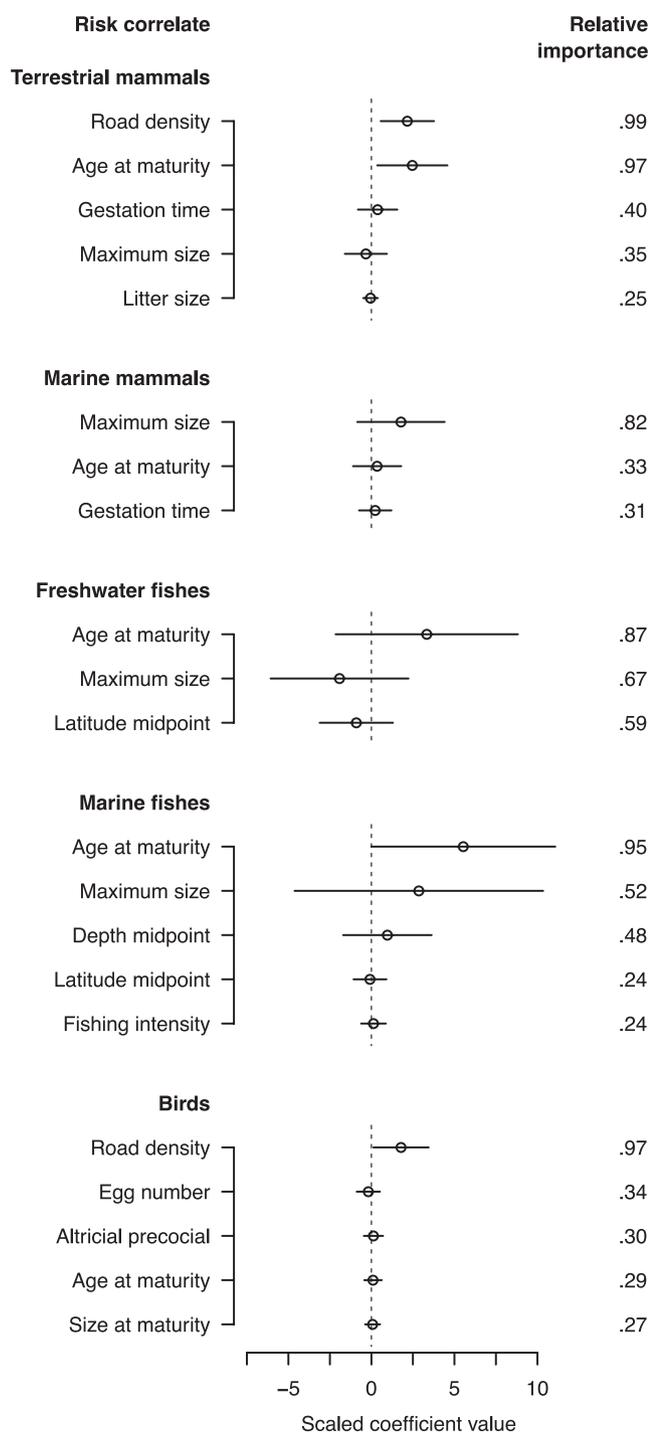
**Table 3. Summary of the logistic regression models having the greatest support for each of the five vertebrate groups under study.**

Model	$l(\theta)$	$K$	$AIC_c$	$\Delta_i$	$w_i$	MR	AUC
Terrestrial mammals							
am, rd	-31.39	3	69.18	0.00	0.32	0.32	0.80
am, gt, rd	-30.94	4	70.58	1.40	0.16	0.34	0.82
ms, am, gt, rd	-29.93	5	70.91	1.73	0.13	0.33	0.83
ms, am, rd	-31.22	4	71.13	1.95	0.12	0.33	0.80
Marine mammals							
ms	-19.29	2	42.98	0.00	0.44	0.35	0.67
ms, gt	-19.03	3	44.88	1.91	0.17	0.34	0.74
Freshwater fishes							
ms, am, lm	-20.51	4	50.23	0.00	0.41	0.37	0.77
ms, am	-22.52	3	51.75	1.51	0.19	0.36	0.66
am	-23.89	2	52.11	1.88	0.16	0.42	0.55
Marine fishes							
ms, am	-12.54	3	31.87	0.00	0.15	0.28	0.90
am	-13.78	2	31.95	0.08	0.14	0.30	0.90
ms, am, dm	-11.31	4	32.00	0.13	0.14	0.23	0.93
am, dm	-12.74	3	32.27	0.40	0.12	0.22	0.91
Birds							
rd	-41.85	2	87.88	0.00	0.22	0.40	0.66
en, rd	-41.37	3	89.12	1.23	0.12	0.40	0.70
ap, rd	-41.44	3	89.26	1.37	0.11	0.41	0.68
am, rd	-41.53	3	89.44	1.56	0.10	0.43	0.66
sm, rd	-41.59	3	89.57	1.68	0.09	0.39	0.67

am, age at maturity; ap, altricial or precocial young; dm, depth midpoint; en, egg number; fi, fishing pressure; gt, gestation time; lm, latitude midpoint; lr, latitude range; ls, litter size; ms, maximum size; ra, range area; rd, road density; sm, size at maturity.  $AIC_c$ , Akaike's information criterion with a correction for finite sample sizes; AUC, area under the receiver operating characteristic curves;  $K$ , the number of parameters;  $l(\theta)$  the value of the maximized log-likelihood function; MR, 10-fold cross-validated misclassification rates averaged over 1000 runs;  $w_i$ , Akaike weight;  $\Delta_i$ ,  $AIC_{c(i)} - AIC_{c(\min)}$ , where  $AIC_{c(i)}$  is the  $AIC_c$  value for model  $i$  and  $AIC_{c(\min)}$  is the smallest  $AIC_c$  value in the set of models. The models are ordered by decreasing  $w_i$  and only those with  $\Delta_i < 2$  are shown.



**Figure 2.** Panels (a), (c), (e), (g), and (i) show the predicted risk status for five groups of vertebrate species calculated from averaged logistic models. Estimates (dark blue and yellow lines) and 95% unconditional confidence intervals (shaded areas) are shown. The variable with the greatest relative importance (according to the sum of the Akaike weights of the models containing each variable) is shown across its range of values on the horizontal axis (note the log-distributed horizontal axes). Other variables were set to their median values. Where two variables were of similar relative importance (within .1 on a scale of 0 to 1), the second most important variable is shown with separate lines set at approximately the first and third quartile values. Panels (b), (d), (f), (h), and (j) show the classification of the five data sets based on the averaged model. Estimates (circles) and unconditional confidence intervals (lines) are shown. The bottom left green panel indicates correctly classified not-at-risk species. The top right red panel indicates correctly classified at-risk species. Species are ordered by increasing predicted probability of being classified as at risk.



**Figure 3. Scaled model parameter estimates (circles) with 95% unconditional confidence intervals (lines) from averaged predictive logistic models of risk status for the five taxonomic vertebrate groups under study. The parameters are ordered within each vertebrate group by their relative importance (indicated on the right) to the averaged model on a scale of 0 to 1. In this figure, the data were scaled within each vertebrate group by subtracting the mean and dividing by two standard deviations (Gelman 2008) to allow for comparison among parameters and across groups.**

(relative importance = .83 and .52, respectively). For the marine mammals, maximum body size was the most important (and positive) predictor of risk status (figures 2c and 3), although there was relatively low confidence in this assessment and the performance of the averaged model was relatively poor (figure 2d).

Among the distribution-related variables, there was weak evidence that the marine fishes inhabiting deeper waters and the freshwater fishes in lower latitudes were more likely to be at risk (figure 3). In the taxonomic groups for which metrics of anthropogenic impact were readily available (terrestrial mammals, marine fishes, and birds), road density was associated with increased risk of extinction in the terrestrial mammals and birds (figures 2a and 3).

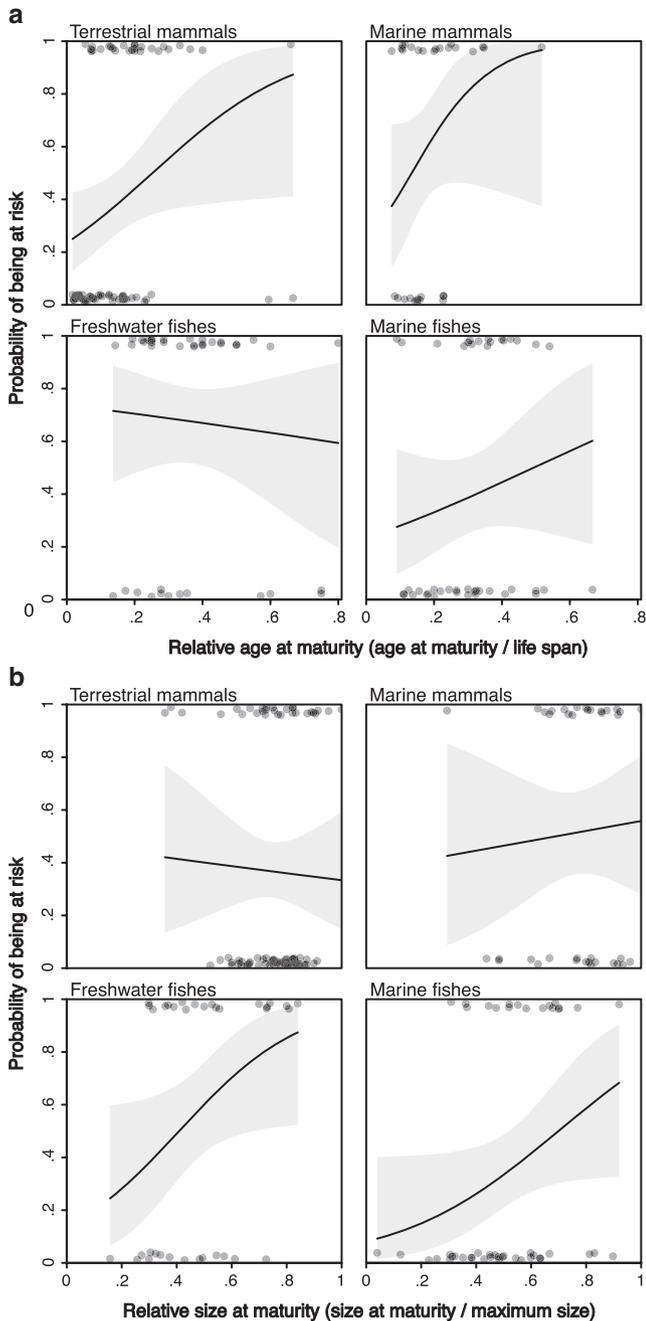
Our data did not support the hypothesis that generation time was directly related to the reported magnitude of population decline (figure S2). Our main conclusions for the terrestrial mammals, freshwater fishes, and marine fishes were not altered when we compared only the species of special concern with the not-at-risk species (figures S3, S4, and S5). For the marine mammals, maximum size (the most important correlate within the taxonomic group) changed from being a weakly positive correlate to being a weakly negative correlate, but the revised confidence interval was wide and included the original estimate (figure S5). The positive road density coefficient for birds became weaker (figure S5).

Our additional exploratory analyses testing for the influence of two relative life-history traits identified patterns consistent with the results obtained from the averaged predictive models. Controlling for differences in life span, (relative) age at maturity was greater for the at-risk species than for the not-at-risk species in the terrestrial mammals (coefficient estimate = 4.66, 95% confidence interval = 0.27–9.05; figures 4a and 5). Controlling for differences in maximum size, (relative) size at maturity was greater for the at-risk species than for the not-at-risk species in the freshwater fishes (coefficient estimate = 5.50, 95% confidence interval = 0.71–10.28) and the difference was nearly significant for the marine fishes (figures 4b and 5).

### Correlates of risk status

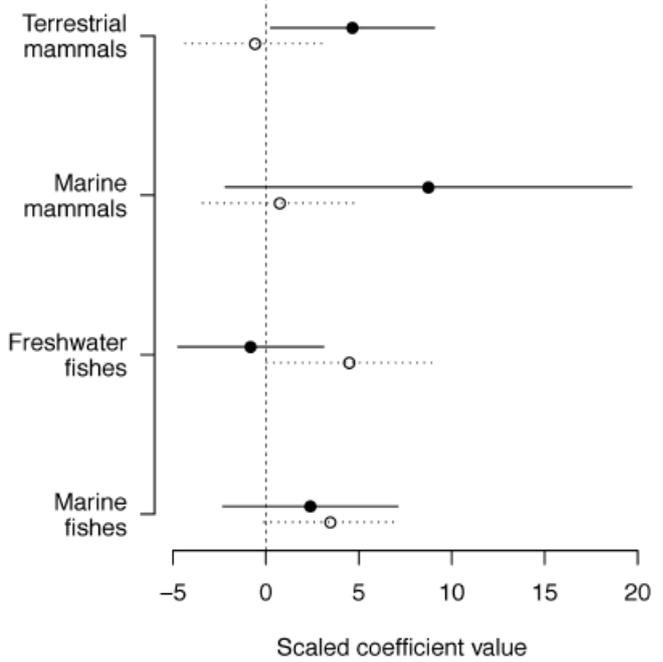
The present study is both exploratory and confirmatory in nature. It is exploratory in the sense that one objective was to determine which correlates of risk status would emerge from a large data set on a previously unexamined group of species within a spatially delimited region across a wide range of vertebrates (figure 1). Furthermore, we explored possible links between risk status and two relative life-history metrics that—to our knowledge—had not been previously examined in this context. It is confirmatory in the sense that we tested a subset of previously hypothesized correlates of risk and confirmed many as being of primary importance for predicting risk status of vertebrates in Canada (figures 2 and 3).

The relative importance of the extinction-risk correlates of species at risk in Canada differed among our five groups of terrestrial and aquatic vertebrates. Road density and age at maturity were the most important (and positively



**Figure 4.** Estimates and uncertainty for the effect of relative age (a) and size (b) at maturity on the probability of a species being classified as at risk. The black lines represent fitted logistic regressions, the shaded areas represent 95% confidence intervals, and the dots represent the individual species represented by the data to which the models were fit (a small amount of vertical jittering was added for clarity).

associated) determinants of at-risk status in the terrestrial mammals. For the freshwater and marine fishes, age at maturity (positive correlate) was of primary importance and maximum size (negative correlate) was of secondary importance. For the marine mammals, larger individuals may bear a greater risk than smaller individuals. In the birds,



**Figure 5.** Scaled coefficients of relative age at maturity (solid symbols) and relative size at maturity (open symbols) with 95% confidence intervals from logistic regressions predicting probability of a species being at risk. The data were scaled within each vertebrate group by subtracting the mean and dividing by two standard deviations to allow for comparison among parameters and across groups.

the primary determinant of at-risk status was greater road density. Although some of these correlates are consistent with previous work (table 1), others are not, and we discuss these similarities and dissimilarities in greater detail below.

We found strong evidence for high road density and late age at maturity as predictors of terrestrial mammal risk status. Road density, our metric of terrestrial anthropogenic impact, has frequently been correlated with risk in terrestrial mammals (Cardillo et al. 2004, 2005, 2008, Benítez-López et al. 2010). The finding that late age at maturity correlates with risk concurs with Purvis and colleagues' (2000b) work. However, in contrast to some studies (Purvis et al. 2000b, Cardillo et al. 2005, Davidson et al. 2009), we found less evidence in Canadian terrestrial mammals that risk status increases with body size. Although the beanplot for maximum size (figure 1) suggests that at-risk terrestrial mammals tend to be larger and maximum size was correlated with age at maturity ( $r = .64$ ), there was less evidence for its importance when it was compared with other correlates in the multimodel analysis (figure 3). Although we used maximum length in our analysis rather than mass (to ensure that we had consistent units across taxa in our analyses), it is unlikely that our results can be explained by a different unit of measure, given the high correlation ( $r = .96$ ) that exists between the logarithm of maximum length and the logarithm of maximum mass in our data set. Substituting body mass for body length in our multimodel-averaged analysis did not affect our conclusions.

For the marine mammals, there was little evidence that any of the variables in our data set were associated with risk status, other than the limited effect that we documented for body size. The lack of dominant extinction-risk correlates at the taxonomic scale considered here would, however, justify efforts to explore the existence of such correlates at a finer taxonomic scale. Analyses that distinguish pinnipeds and cetaceans from one another, for example, may well yield further insights into the identification of factors affecting risk. We would also note that the low classification success in our model for marine mammals might be attributable to a comparative lack of information on past and present anthropogenic factors that might affect risk status (e.g., historically intensive exploitation rates, current levels of incidental catch).

Our analyses provided some evidence that older age at maturity and smaller maximum body size are positive correlates of extinction risk in freshwater fishes. In contrast to the (weak) positive correlation of larger maximum body size with risk status for marine fishes, the opposite effect may be evident for freshwater fishes because of higher levels of habitat loss and degradation (Olden et al. 2007). Although we detected some evidence that smaller maximum body size was associated with greater risk, this pattern was only evident after removing incomplete rows of data (such as those used in the multimodel analysis; figure S6) and not with the complete data set (figure 1). Although the distribution of the data (figure 1; figure S6) does not rule out Olden and colleagues' (2007) hypothesis that both large and small freshwater fishes are at greatest risk, the form of the predictive logistic regression model did not allow us to investigate the hypothesis explicitly (figure 2e). There was little evidence of the effect of latitude midpoint that Reynolds and colleagues (2005a) had documented for freshwater fishes in Europe. This may be attributable to the relatively narrow latitudinal range occupied by Canadian freshwater fishes at risk, most of which are located adjacent to the US border in the west and in southwestern Ontario and to southeastern Quebec in the east (Hutchings and Festa-Bianchet 2009).

The capability of our models to predict risk status in marine fishes was better than that in any other taxonomic group. Age at maturity was the most important correlate of risk, a finding concordant with the results of previous studies (Denney et al. 2002, Reynolds et al. 2005b). Commercial fishing interest was of minimal influence as a risk correlate, an observation contrary to expectations that fishing mortality affects extinction probability in marine fishes (e.g., Hutchings 2001, Hutchings and Reynolds 2004). This discrepancy can almost certainly be attributed to the imperfect degree to which present or past fishing mortality is reflected by the four-point measure of current fishing interest analyzed here. A more comprehensive analysis of the extinction risks posed by fishing would include an examination of the degree to which magnitude of population decline and current population status relative to some conservation-based target were correlated with temporal changes in levels of fishing mortality.

Our data suggested a pronounced association between small range area and bird species endangerment consistent with the findings of previous studies (Manne et al. 1999; Long et al. 2007). However, range area may be confounded with the explicit determinants of the COSEWIC decisionmaking process (figure S1), and so it was not included as a predictor in our formal analysis. Accordingly, we found that road density was the most influential (positive) correlate of bird risk status. Elevated road densities seem to have negative effects on the local population densities of many bird species (Fahrig and Rytwinski 2009, Benítez-López et al. 2010). For many birds that are already at low numbers—in particular, ecological specialists adapted to narrow habitat niches (Owens and Bennett 2000)—the progression to endangerment is therefore more likely as road density and its associated habitat disruption increase. Collectively, the precedence of road density in predicting bird species' endangerment over other intrinsic life-history parameters (large body size, Norris and Harper 2004; small clutch size, Krüger and Radford 2008) suggests that in Canada, habitat loss (i.e., a reduction in niche availability) is the most important process driving bird endangerment.

### Implications for species status assessment

Our study of the biological and anthropogenic correlates of extinction risk in Canadian vertebrates represents a logical taxonomic and analytical extension of previous research. To achieve an arguably greater degree of spatial and taxonomic generality, we undertook analyses across five large and diverse groups of vertebrates that were consistent in the variables considered, the models applied, and the spatial scale examined. Although one might argue that with such an approach, the importance of some extinction-risk correlates for certain species might not be detected, our intent was to attain a level of generality across taxonomic groups able to inform national (e.g., COSEWIC) and international (e.g., IUCN) efforts to apply consistent methodologies and criteria to assess extinction risk across widely diverse taxa. In this regard, age at maturity was the most important correlate of at-risk status among the 14 life-history, distribution, and anthropogenic variables examined here, a finding supportive of the scaling of the IUCN's various decline-related criteria and thresholds to species and population generation times.

One unavoidable caveat associated with our work is that the correlates of risk that we have identified are based on past rather than future conditions. This means that changes to extinction risks posed by climate change (which has been identified as a threat to an increasing number of species in Canada, such as Peary caribou, *Rangifer tarandus pearyi*; polar bear, *Ursus maritimus*; and beach pinweed, *Lechea maritima*; [www.sararegistry.gc.ca](http://www.sararegistry.gc.ca)) will not have been accounted for in our analyses. Although some of the correlates of risk evaluated here may be relatively robust to climate change (e.g., road density), others (such as geographical range) may be more susceptible to climate-related influences, particularly in a country such as Canada, in which significant changes in terrestrial biodiversity attributable to global warming are anticipated (Lawler et al. 2009).

From an assessment perspective, we suggest that there may be considerable promise in the logistic modeling approach adopted here. First, functions such as those depicted in figure 2 serve to illustrate qualitatively, for different groups of species, how different variables are related to the probability of those species being at risk. Second, one could use the values associated with the risk-status functions (defined by the forward or backward S-shaped part of the curves in figure 2) to define trait thresholds in species status assessments. For example, for marine fishes inhabiting Canadian waters, using the data accumulated to date, one could apply a threshold age at maturity of 5 to 10 years to distinguish species that may be at heightened extinction risk. The extent to which one would adhere strictly to such thresholds would depend on the slope of the curve (the shallower the slope, the broader the range of values encompassing the threshold) and on the width of the 95% unconditional confidence intervals associated with the model (the greater the width, the greater the uncertainty in the threshold).

In summary, we draw three primary conclusions from our analyses. From a methodological perspective, there is utility in applying consistent analytical techniques (and consistent units of measurement) to studies of extinction-risk correlates across multiple taxonomic groups within a single spatially discrete region. Second, the correlates identified here may prove helpful in undertaking assessments for data-limited species within the context of a precautionary approach to assessing extinction risk. That is, all else being equal, species of concern for which a correlate of risk suggests heightened extinction probability might be afforded a higher protection status than those for which a correlate does not. Third, we suggest that logistic regression offers an instructive means of identifying correlates of extinction risk and of applying them in a practicable, readily understandable, and empirically defensible manner in species status assessments. Broad-scale examinations such as the one we have undertaken here may also serve to enhance empirical support for the broadly articulated and widely applied extinction-risk criteria often used by international and national assessment organizations.

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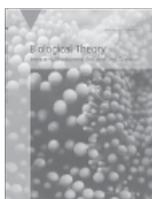
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# Supplementary Online Materials for Correlates of Vertebrate Extinction Risk in Canada

Sean C. Anderson, Robert G. Farmer, Francesco Ferretti,  
Aimee Lee S. Houde, and Jeffrey A. Hutchings

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## Details of the multimodel analysis

The selection of a limited set of well-supported candidate models is an important step in conducting valid multimodel inference (Burnham and Anderson 2002). Among other attributes, it lessens the likelihood of obtaining spurious results by model overfitting (Freedman 1983, Lukacs et al. 2009), which can result in overestimation of precision at best or, at worst, the obtaining of results that are tailored only to the dataset under study (Burnham and Anderson 2002). Given a limited number of life-history variables, the *a priori* absence of biological reasons to exclude certain models, and the need for balance among the frequency with which the parameters were represented in the candidate models (to evaluate the relative importance of the model variables), we examined candidate models with all combinations of the  $k$  covariates as main effects. We excluded covariate interactions because of the small size of our datasets after row-wise deletion of missing values ( $n = 33$  to  $67$  per taxonomic group, see table S6). The second-order corrected Akaike Information Criterion ( $AIC_c$ ) is more appropriate than the  $AIC$  (Akaike 1973) when the number of observations  $n$  does not greatly exceed the number of explanatory variables  $K$  (usually  $n/K < 40$ ) (Sugiura 1978, Hurvich and Tsai 1989):

$$AIC_c = AIC + \frac{2K(K+1)}{n-K-1}.$$

To generate an averaged predictive model, we ranked the models by their  $AIC_c$  and averaged the coefficients by their Akaike weights  $w_i$  (Akaike 1978, Buckland et al. 1997):

$$w_i = \frac{\exp(-\Delta_i/2)}{\sum_{r=1}^R \exp(-\Delta_r/2)}$$

where  $\Delta_i = AIC_{c[i]} - AIC_{c[min]}$  (the smallest  $AIC_c$  value in the set of models) and  $R$  is the number of models. The weighted-average model coefficients  $\hat{\theta}$  were then calculated as:

$$\hat{\theta} = \sum_{i=1}^R w_i \hat{\theta}_i$$

where  $R$  represents the number of candidate models and  $\hat{\theta}_i$  the estimated coefficient of the  $i^{th}$  model. Models additional to the “best model” often contain valuable information. Averaging the coefficients across all candidate models tends to reduce bias, increase precision, and stabilize estimates across data sets (Burnham and Anderson 2002).

Except for those circumstances where overwhelming evidence supports the best model, standard error estimates of the parameters in the selected models tend to overestimate precision because of model selection uncertainty (Breiman 1992, Hjorth 1994, Burnham and Anderson 2002). To address model selection uncertainty, we calculated the unconditional standard error of the averaged parameters  $\widehat{se}(\hat{\theta})$  as:

$$\widehat{se}(\hat{\theta}) = \sum_{i=1}^R w_i \sqrt{\widehat{var}(\hat{\theta}_i|g_i) + (\hat{\theta}_i - \hat{\theta})^2}$$

where  $\widehat{var}(\hat{\theta}_i|g_i)$  represents the parameter variance given each model  $g_i$  (Burnham and Anderson 2002). We used the same calculation to derive the unconditional standard error of the estimate. We assessed the relative importance of each variable by calculating the sum of the  $w_i$  across all of the models in which the variable occurred, given that each variable appears in an equal number of models (Burnham and Anderson 2002). We report the relative importance of the life-history parameters for all taxonomic groups. To allow a graphical comparison of the effect sizes between parameters (including categorical and continuous variables) and across taxonomic groups, we refit our averaged predictive models using data that had been scaled by subtracting their mean and dividing by two standard deviations (Gelman 2008). This linear transformation does not affect the relative importance of the parameters or the predicted risk status; it only standardizes the scale of the coefficients. We include the unscaled parameter estimates for prediction purposes as an appendix (table S7).

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## Supplementary figures

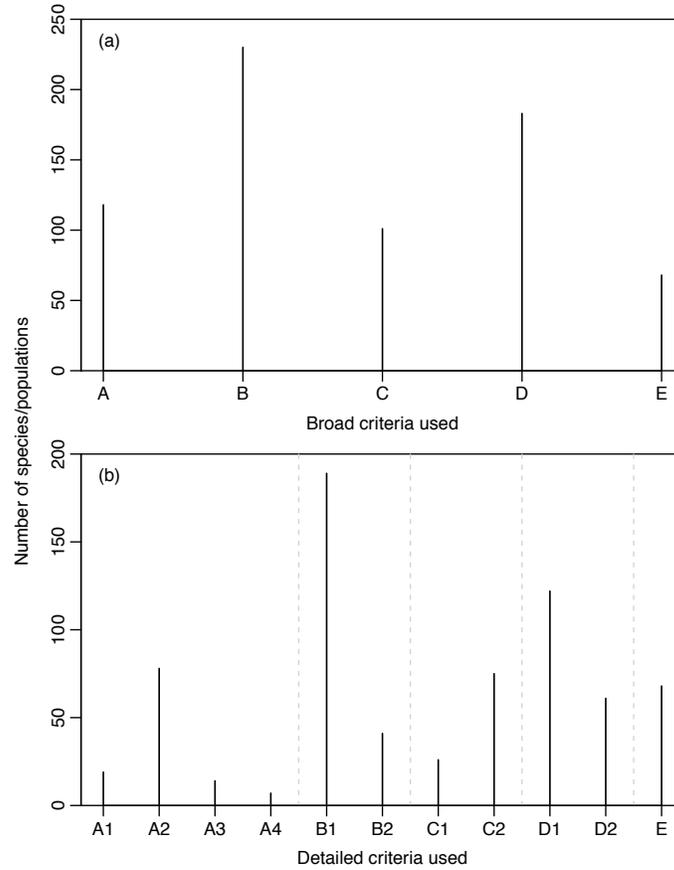


Figure S1: Criteria used to classify species or populations as at-risk by COSEWIC. Shown for (a) criteria groups and (b) criteria subgroups. Letters in (a) refer to: A. Decline in total number of mature individuals B. Small distribution range and decline or fluctuation C. Small and declining number of mature individuals D. Very small or restricted total population E. Quantitative analysis (population projections). See COSEWIC's *Assessment Process and Criteria* available at: <http://www.cosewic.gc.ca/> for descriptions of the detailed criteria used in (b).

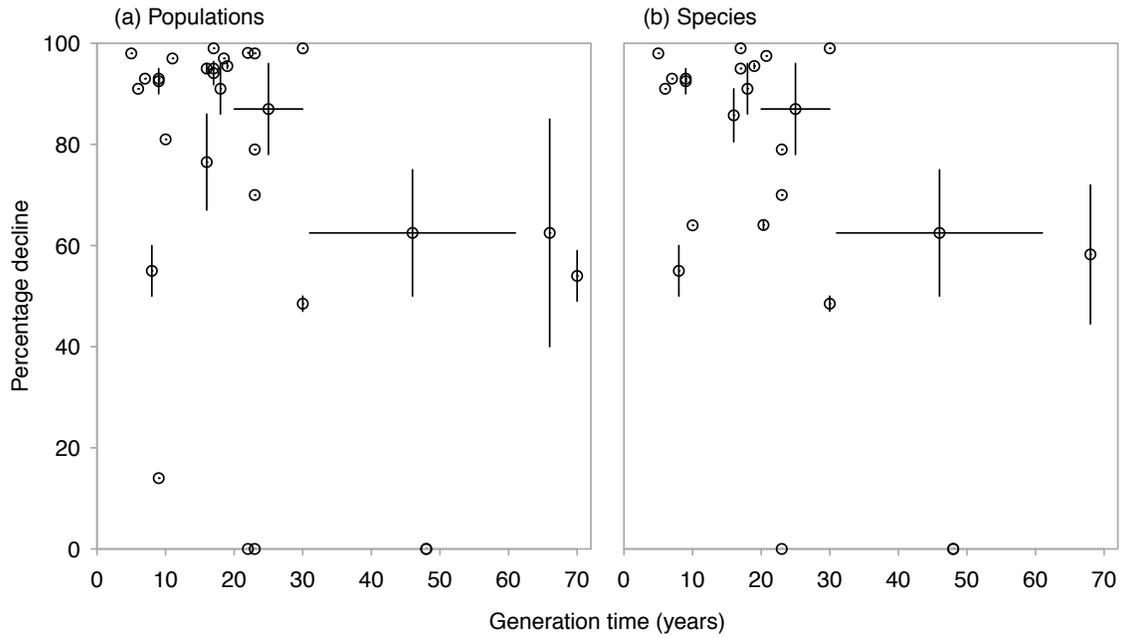


Figure S2: Relationship between reported magnitude of population decline and reported generation time within marine fish (a) populations and (b) species that were classified as at risk by COSEWIC. Horizontal and vertical lines indicate ranges of reported values. Circles indicate midpoint of upper and lower values (where a range of values was given) or point values (where a single value was given). In (b), average upper and lower values are shown where there were multiple populations for a given species.

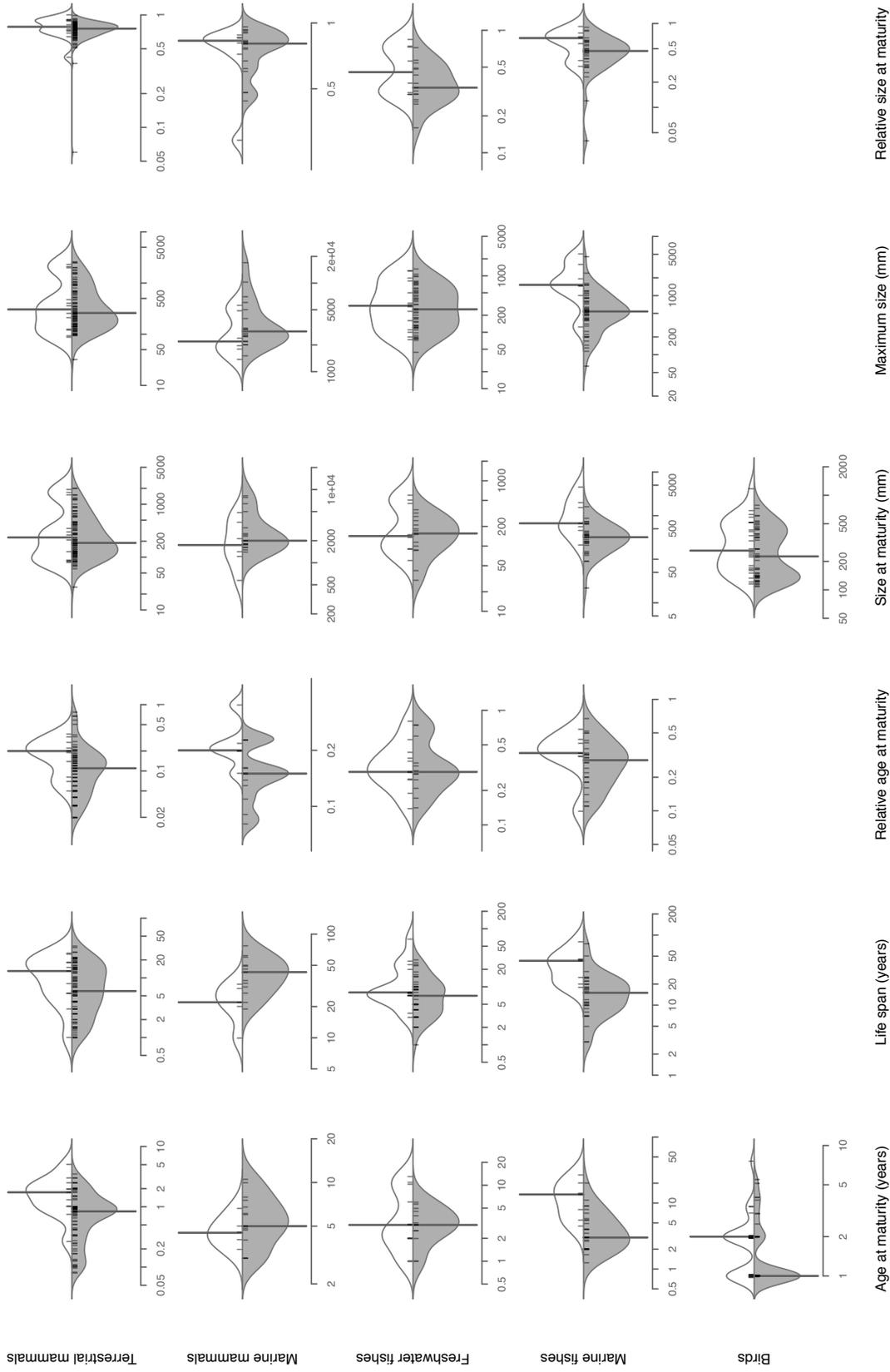


Figure S3: Potential life-history correlates of extinction risk for species listed as special concern (white) and not-at-risk (grey). **Species listed as extinct, extirpated, endangered, or threatened were excluded.** See Figure 1a in the main manuscript for a detailed description and comparison.

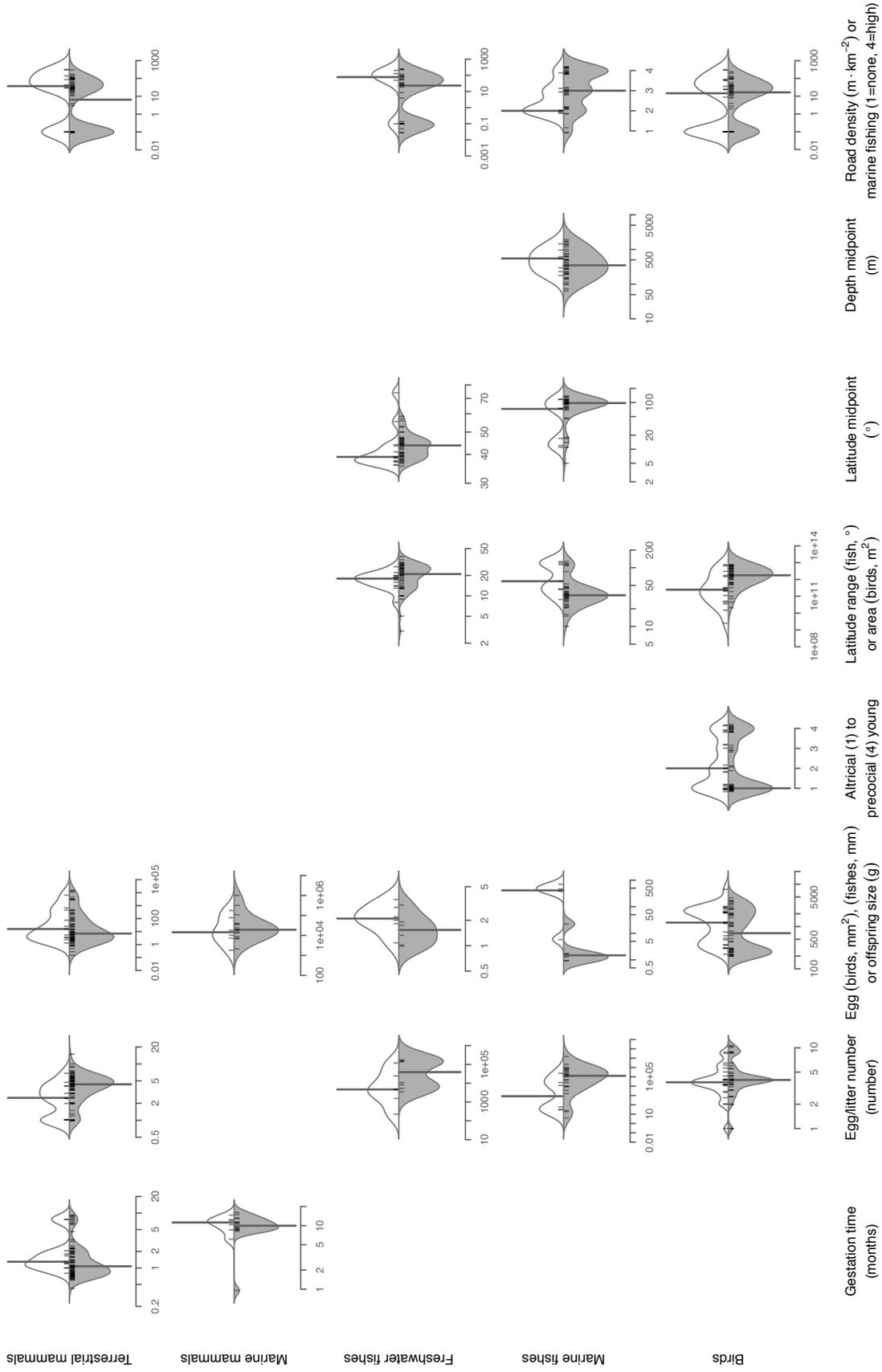


Figure S4: Potential correlates of extinction risk for species listed as special concern (white) and not-at-risk (grey). **Species listed as extinct, extirpated, endangered, or threatened were excluded.** See Figure 1b in the main manuscript for a detailed description and comparison.

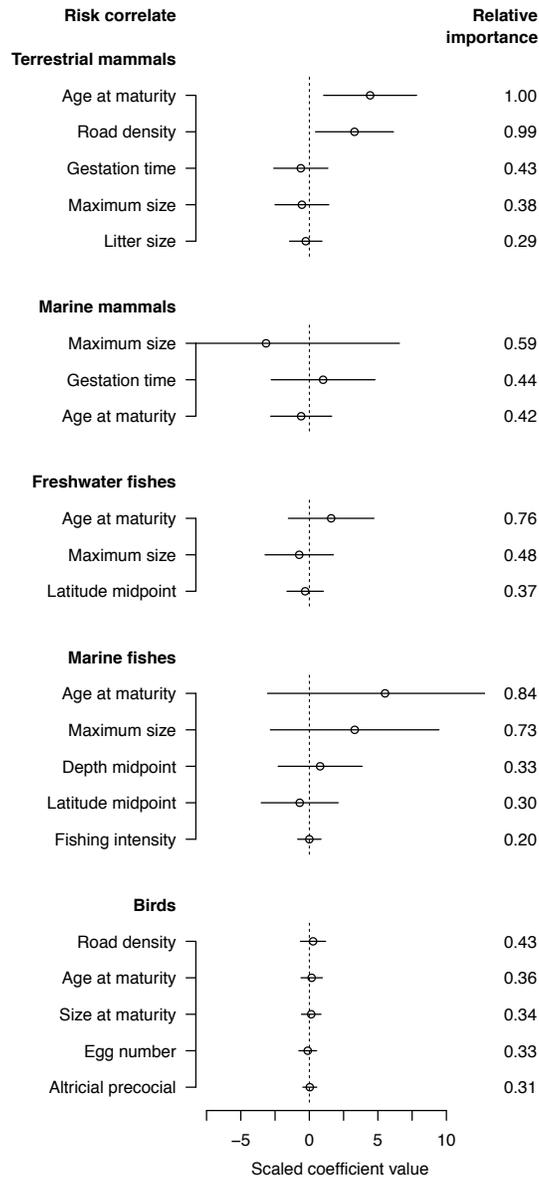


Figure S5: Scaled model parameter estimates (circles) with 95% unconditional confidence intervals (lines) from averaged predictive logistic models of risk status for the five taxonomic vertebrate groups under study **for special concern and not-at-risk species only** (i.e. excluding extinct, extirpated, endangered, and threatened species). Parameters are ordered within each vertebrate group by their relative importance (indicated on right) to the averaged model on a scale of 0 to 1. In this figure, the data were scaled within each vertebrate group by subtracting the mean and dividing by two standard deviations (Gelman 2008) to allow for comparison between parameters and across groups.

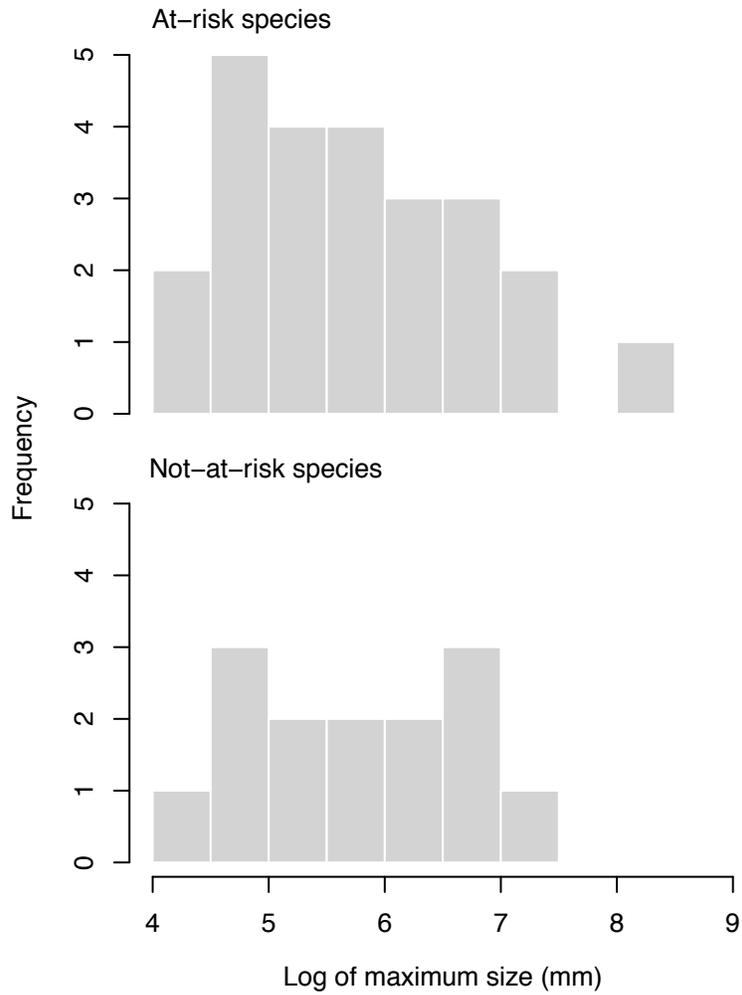


Figure S6: Distribution of maximum size for at-risk and not-at-risk Canadian freshwater fish species after deleting rows with incomplete data for the modelling portion of the analysis.

## Supplementary tables

Table S1: Terrestrial mammal species evaluated.

Scientific name	Common name	Status
<i>Antilocapra americana</i>	Pronghorn	Not at risk
<i>Antrozous pallidus</i>	Pallid Bat	At risk
<i>Aplodontia rufa</i>	Mountain Beaver	At risk
<i>Bison bison athabasca</i>	Wood Bison	At risk
<i>Bison bison bison</i>	Plains Bison	At risk
<i>Blarina brevicauda</i>	Northern Short-tailed Shrew	Not at risk
<i>Canis latrans</i>	Coyote	Not at risk
<i>Canis lupus lycaon</i>	Eastern Wolf	At risk
<i>Cervus canadensis</i>	Wapiti	Not at risk
<i>Clethrionomys rutilus</i>	Northern Red-backed Vole	Not at risk
<i>Cynomys ludovicianus</i>	Black-tailed Prairie Dog	At risk
<i>Dicrostonyx groenlandicus</i>	Northern Collared Lemming	Not at risk
<i>Dicrostonyx richardsoni</i>	Richardson's Collared Lemming	Not at risk
<i>Dipodomys ordii</i>	Ord's Kangaroo Rat	At risk
<i>Eptesicus fuscus</i>	Big Brown Bat	Not at risk
<i>Euderma maculatum</i>	Spotted Bat	At risk
<i>Glaucomys volans</i>	Southern Flying Squirrel	At risk
<i>Gulo gulo</i>	Wolverine	At risk
<i>Lasionycteris noctivagans</i>	Silver-haired Bat	Not at risk
<i>Lasiurus borealis</i>	Eastern Red Bat	Not at risk
<i>Marmota caligata</i>	Hoary Marmot	Not at risk
<i>Marmota vancouverensis</i>	Vancouver Island Marmot	At risk
<i>Martes americana atrata</i>	American Marten	At risk
<i>Martes pennanti</i>	Fisher	Not at risk
<i>Microtus longicaudus</i>	Long-tailed Vole	Not at risk
<i>Microtus ochrogaster</i>	Prairie Vole	Not at risk
<i>Microtus oeconomus</i>	Tundra Vole	Not at risk
<i>Microtus oregoni</i>	Creeping Vole	Not at risk
<i>Microtus pennsylvanicus</i>	Meadow Vole	Not at risk
<i>Microtus pinetorum</i>	Woodland Vole	At risk
<i>Microtus richardsoni</i>	Water Vole	Not at risk
<i>Microtus xanthognathus</i>	Taiga Vole	Not at risk
<i>Mustela erminea haidarum</i>	Ermine haidarum subspecies	At risk
<i>Mustela nigripes</i>	Black-footed Ferret	At risk
<i>Mustela nivalis</i>	Least Weasel	Not at risk
<i>Myotis keenii</i>	Keen's Long-eared Bat	At risk
<i>Myotis lucifugus</i>	Little Brown Myotis	Not at risk
<i>Myotis thysanodes</i>	Fringed Bat	At risk
<i>Myotis volans</i>	Long-legged Myotis	Not at risk
<i>Myotis yumanensis</i>	Yuma Myotis	Not at risk

<i>Napaeozapus insignis</i>	Woodland Jumping Mouse	Not at risk
<i>Neotamias amoenus</i>	Yellow-pine Chipmunk	Not at risk
<i>Neotamias townsendii</i>	Townsend's Chipmunk	Not at risk
<i>Neotoma cinerea</i>	Bushy-tailed Woodrat	Not at risk
<i>Ochotona collaris</i>	Collared Pika	Not at risk
<i>Odocoileus hemionus</i>	Mule Deer	Not at risk
<i>Ondatra zibethicus</i>	Common Muskrat	Not at risk
<i>Onychomys leucogaster</i>	Northern Grasshopper Mouse	Not at risk
<i>Ovis canadensis</i>	Mountain Sheep	Not at risk
<i>Parascalops breweri</i>	Hairy-tailed Mole	Not at risk
<i>Phenacomys ungava</i>	Eastern Heather Vole	Not at risk
<i>Procyon lotor</i>	Northern Raccoon	Not at risk
<i>Puma concolor</i>	Mountain Lion	Not at risk
<i>Rangifer tarandus caribou</i>	Woodland Caribou	At risk
<i>Rangifer tarandus groenlandicus</i>	Barren-ground Caribou	At risk
<i>Scalopus aquaticus</i>	Eastern Mole	At risk
<i>Scapanus townsendii</i>	Townsend's Mole	At risk
<i>Sciurus carolinensis</i>	Eastern Grey Squirrel	Not at risk
<i>Sorex bendirii</i>	Pacific Water Shrew	At risk
<i>Sorex cinereus</i>	Masked Shrew	Not at risk
<i>Sorex fumeus</i>	Smoky Shrew	Not at risk
<i>Sorex monticolus</i>	Dusky Shrew	Not at risk
<i>Sorex palustris</i>	American Water Shrew	Not at risk
<i>Spermophilus franklinii</i>	Franklin's Ground Squirrel	Not at risk
<i>Spermophilus lateralis</i>	Golden-mantled Ground Squirrel	Not at risk
<i>Spermophilus parryii</i>	Arctic Ground Squirrel	Not at risk
<i>Spermophilus saturatus</i>	Cascade-mantled Ground Squirrel	Not at risk
<i>Sylvilagus floridanus</i>	Eastern Cottontail	Not at risk
<i>Sylvilagus nuttallii nuttallii</i>	Nuttall's Cottontail <i>nuttallii</i> subspecies	At risk
<i>Synaptomys borealis</i>	Northern Bog Lemming	Not at risk
<i>Tamias striatus</i>	Eastern Chipmunk	Not at risk
<i>Taxidea taxus</i>	American Badger	At risk
<i>Urocyon cinereoargenteus</i>	Grey Fox	At risk
<i>Ursus americanus</i>	American Black Bear	Not at risk
<i>Ursus arctos</i>	Grizzly Bear	At risk
<i>Ursus maritimus</i>	Polar Bear	At risk
<i>Vulpes velox</i>	Swift Fox	At risk
<i>Western Harvest Mouse</i>	Western Harvest Mouse	At risk
<i>Zapus hudsonius</i>	Meadow Jumping Mouse	Not at risk

Table S2: Marine mammal species evaluated.

Scientific name	Common name	Status
<i>Balaena mysticetus</i>	Bowhead Whale	At risk
<i>Balaenoptera acutorostrata</i>	Minke Whale	Not at risk
<i>Balaenoptera borealis</i>	Sei Whale	At risk
<i>Balaenoptera musculus</i>	Blue Whale	At risk
<i>Balaenoptera physalus</i>	Fin Whale	At risk
<i>Callorhinus ursinus</i>	Northern Fur Seal	At risk
<i>Cystophora cristata</i>	Hooded Seal	Not at risk
<i>Delphinapterus leucas</i>	Beluga Whale	At risk
<i>Delphinus delphis</i>	Short-Beaked Common Dolphin	Not at risk
<i>Enhydra lutris</i>	Sea Otter	At risk
<i>Erignathus barbatus</i>	Bearded Seal	Not at risk
<i>Eschrichtius robustus</i>	Grey Whale	At risk
<i>Eubalaena glacialis</i>	North Atlantic Right Whale	At risk
<i>Eubalaena japonica</i>	North Pacific Right Whale	At risk
<i>Eumetopias jubatus</i>	Steller Sea Lion	At risk
<i>Globicephala melas</i>	Long-finned Pilot Whale	Not at risk
<i>Halichoerus grypus</i>	Gray Seal	Not at risk
<i>Hyperoodon ampullatus</i>	Northern Bottlenose Whale	At risk
<i>Lagenorhynchus acutus</i>	Atlantic White-sided Dolphin	Not at risk
<i>Lagenorhynchus albirostris</i>	White-Beaked Dolphin	Not at risk
<i>Lagenorhynchus obliquidens</i>	Pacific White-sided Dolphin	Not at risk
<i>Lissodelphis borealis</i>	Northern Right-whale Dolphin	Not at risk
<i>Megaptera novaeangliae</i>	Humpback Whale	At risk
<i>Mesoplodon bidens</i>	Sowerby's Beaked Whale	At risk
<i>Mirounga angustirostris</i>	Northern Elephant Seal	Not at risk
<i>Monodon monoceros</i>	Narwhal	At risk
<i>Odobenus rosmarus rosmarus</i>	Atlantic Walrus	At risk
<i>Orcinus orca</i>	Killer Whale	At risk
<i>Pagophilus groenlandica</i>	Harp Seal	Not at risk
<i>Phoca vitulina mellonae</i>	Harbour Seal Lacs des Loups Marins subsp.	At risk
<i>Phocoena phocoena</i>	Harbour Porpoise	At risk
<i>Phocoenoides dalli</i>	Dall's Porpoise	Not at risk
<i>Physeter macrocephalus</i>	Sperm Whale	Not at risk
<i>Pusa hispida</i>	Ringed Seal	Not at risk
<i>Tursiops truncatus</i>	Bottle-Nosed Dolphin	Not at risk
<i>Zalophus californianus</i>	California Sea Lion	Not at risk
<i>Ziphius cavirostris</i>	Cuvier's Beaked Whale	Not at risk

Table S3: Freshwater fish species evaluated.

Scientific name	Common name	Status
<i>Acipenser brevirostrum</i>	Shortnose Sturgeon	At risk
<i>Acipenser fulvescens</i>	Lake Sturgeon	At risk
<i>Ambloplites rupestris</i>	Rock Bass	Not at risk
<i>Ameiurus nebulosus</i>	Brown bullhead	Not at risk
<i>Campostoma anomalum</i>	Central stoneroller	Not at risk
<i>Catostomus catostomus ssp</i>	Salish Sucker	At risk
<i>Catostomus macrocheilus</i>	Largescale sucker	Not at risk
<i>Clinostomus elongatus</i>	Redside Dace	At risk
<i>Coregonus hoyi</i>	Bloater	Not at risk
<i>Coregonus kiyi orientalis</i>	Lake Ontario Kiyi	At risk
<i>Coregonus nigripinnis</i>	Blackfin cisco	At risk
<i>Coregonus reighardi</i>	Shortnose Cisco	At risk
<i>Coregonus zenithicus</i>	Shortjaw Cisco	At risk
<i>Cottus bairdii</i>	Mottled sculpin	Not at risk
<i>Cottus cognatus</i>	Slimy sculpin	Not at risk
<i>Cottus confusus</i>	Shorthead sculpin	At risk
<i>Cottus rhotheus</i>	Torrent sculpin	Not at risk
<i>Cottus ricei</i>	Spoonhead Sculpin	Not at risk
<i>Cottus sp.</i>	Eastslope Sculpin	At risk
<i>Couesius plumbeus</i>	Lake Chub	Not at risk
<i>Cyprinella spiloptera</i>	Spotfin Shiner	Not at risk
<i>Erimystax x-punctatus</i>	Gravel Chub	At risk
<i>Esox americanus vermiculatus</i>	Grass Pickerel	At risk
<i>Esox niger</i>	Chain pickerel	Not at risk
<i>Etheostoma blennioides</i>	Greenside darter	Not at risk
<i>Etheostoma caeruleum</i>	Rainbow Darter	Not at risk
<i>Etheostoma microperca</i>	Least darter	Not at risk
<i>Etheostoma nigrum</i>	Johnny darter	Not at risk
<i>Fundulus diaphanus</i>	Banded Killifish	At risk
<i>Fundulus notatus</i>	Blackstripe Topminnow	At risk
<i>Hybognathus argyritis</i>	Western Silvery Minnow	At risk
<i>Hybognathus regius</i>	Eastern Silvery Minnow	Not at risk
<i>Ichthyomyzon fossor</i>	Northern Brook Lamprey	At risk
<i>Ichthyomyzon unicuspis</i>	Silver lamprey	Not at risk
<i>Ictalurus punctatus</i>	Channel catfish	Not at risk
<i>Ictiobus cyprinellus</i>	Bigmouth buffalo	At risk
<i>Ictiobus niger</i>	Black buffalo	At risk
<i>Lampetra appendix</i>	American brook lamprey	Not at risk
<i>Lampetra macrostoma</i>	Vancouver lamprey	At risk
<i>Lampetra richardsoni</i>	Morrison Creek Lamprey	At risk
<i>Lepisosteus oculatus</i>	Spotted Gar	At risk
<i>Lepomis auritus</i>	Redbreast Sunfish	At risk

<i>Lepomis cyanellus</i>	Green sunfish	Not at risk
<i>Lepomis gibbosus</i>	Pumpkinseed	Not at risk
<i>Lepomis gulosus</i>	Warmouth	At risk
<i>Lepomis humilis</i>	Orangespotted Sunfish	At risk
<i>Lythrurus umbratilis</i>	Redfin shiner	Not at risk
<i>Micropterus dolomieu</i>	Smallmouth bass	Not at risk
<i>Micropterus salmoides</i>	Largemouth Bass	Not at risk
<i>Minytrema melanops</i>	Spotted Sucker	At risk
<i>Morone chrysops</i>	White bass	Not at risk
<i>Moxostoma anisurum</i>	Silver redhorse	Not at risk
<i>Moxostoma carinatum</i>	River Redhorse	At risk
<i>Moxostoma duquesnei</i>	Black Redhorse	At risk
<i>Moxostoma erythrurum</i>	Golden Redhorse	Not at risk
<i>Moxostoma hubbsi</i>	Copper Redhorse	At risk
<i>Moxostoma macrolepidotum</i>	Shorthead redhorse	Not at risk
<i>Moxostoma valenciennesi</i>	Greater Redhorse	Not at risk
<i>Myoxocephalus thompsonii</i>	Deepwater Sculpin (Ontario, Quebec)	At risk
<i>Nocomis biguttatus</i>	Hornyhead chub	Not at risk
<i>Notropis anogenus</i>	Pugnose Shiner	At risk
<i>Notropis atherinoides</i>	Emerald shiner	Not at risk
<i>Notropis dorsalis</i>	Bigmouth shiner	Not at risk
<i>Notropis heterolepis</i>	Blacknose shiner	Not at risk
<i>Notropis percobromus</i>	Carmine Shiner	At risk
<i>Notropis photogenis</i>	Silver shiner	At risk
<i>Notropis stramineus</i>	Sand shiner	Not at risk
<i>Notropis volucellus</i>	Mimic Shiner	Not at risk
<i>Noturus flavus</i>	Stonecat	Not at risk
<i>Noturus miurus</i>	Brindled Madtom	Not at risk
<i>Noturus stigmus</i>	Northern Madtom	At risk
<i>Oncorhynchus clarkii lewisi</i>	Westslope Cutthroat Trout	At risk
<i>Percina caprodes</i>	Logperch	Not at risk
<i>Percopsis omiscomaycus</i>	Trout-Perch	Not at risk
<i>Pimephales notatus</i>	Bluntnose Minnow	Not at risk
<i>Platygobio gracilis</i>	Flathead chub	Not at risk
<i>Pomoxis annularis</i>	White crappie	Not at risk
<i>Pomoxis nigromaculatus</i>	Black Crappie	Not at risk
<i>Prosopium cylindraceum</i>	Round whitefish	Not at risk
<i>Rhinichthys atratulus</i>	Eastern Blacknose Dace	Not at risk
<i>Rhinichthys cataractae ssp</i>	Nooksack Dace	At risk
<i>Rhinichthys falcatus</i>	Leopard dace	Not at risk
<i>Rhinichthys osculus</i>	Speckled Dace	At risk
<i>Richardsonius balteatus</i>	Redside shiner	Not at risk
<i>Sander vitreus</i>	Walleye	Not at risk
<i>Semotilus corporalis</i>	Fallfish	Not at risk

Table S4: Marine fish species evaluated.

Scientific name	Common name	Status
<i>Anarhichas denticulatus</i>	Northern Wolffish	At risk
<i>Anarhichas lupus</i>	Atlantic Wolffish	At risk
<i>Anarhichas minor</i>	Spotted Wolffish	At risk
<i>Anarrhichthys ocellatus</i>	Wolf-eel	Not at risk
<i>Anguilla rostrata</i>	American eel	At risk
<i>Apeltes quadracus</i>	Fourspine stickleback	Not at risk
<i>Boreogadus saida</i>	Polar cod	Not at risk
<i>Bothrocara brunneum</i>	Twoline eelpout	Not at risk
<i>Bothrocara molle</i>	Soft eelpout	Not at risk
<i>Bothrocara pusillum</i>	Alaska eelpout	Not at risk
<i>Brosme brosme</i>	Cusk	At risk
<i>Carcharodon carcharias</i>	White Shark	At risk
<i>Centroscyllium fabricii</i>	Black dogfish	Not at risk
<i>Cetorhinus maximus</i>	Basking Shark	At risk
<i>Citharichthys stigmaeus</i>	Speckled sanddab	Not at risk
<i>Coregonus clupeaformis</i>	Lake whitefish	Not at risk
<i>Cyclopterus lumpus</i>	Lumpsucker	Not at risk
<i>Diaphus theta</i>	California headlightfish	Not at risk
<i>Dorosoma cepedianum</i>	American gizzard shad	Not at risk
<i>Embiotoca lateralis</i>	Striped seaperch	Not at risk
<i>Enchelyopus cimbrius</i>	Fourbeard rockling	Not at risk
<i>Engraulis mordax</i>	Californian anchovy	Not at risk
<i>Eopsetta jordani</i>	Petrale sole	Not at risk
<i>Eptatretus stoutii</i>	Pacific hagfish	Not at risk
<i>Eumesogrammus praecisus</i>	Fourline snakeblenny	Not at risk
<i>Gadus macrocephalus</i>	Pacific cod	Not at risk
<i>Gadus morhua</i>	Atlantic Cod	At risk
<i>Galeorhinus galeus</i>	Tope	At risk
<i>Hexagrammos stelleri</i>	Whitespotted greenling	Not at risk
<i>Hexanchus griseus</i>	Bluntnose Sixgill Shark	At risk
<i>Hippoglossoides elassodon</i>	Flathead sole	Not at risk
<i>Isopsetta isolepis</i>	Butter sole	Not at risk
<i>Isurus oxyrinchus</i>	Shortfin Mako	At risk
<i>Lamna nasus</i>	Porbeagle	At risk
<i>Lepidopsetta bilineata</i>	Rock sole	Not at risk
<i>Leucoraja ocellata</i>	Winter Skate	At risk
<i>Lycenchelys crotalinus</i>	Snakehead eelpout	Not at risk
<i>Lycenchelys jordani</i>	Shortjaw eelpout	Not at risk
<i>Lycodes pacificus</i>	Blackbelly eelpout	Not at risk
<i>Macrourus berglax</i>	Roughhead Grenadier	At risk
<i>Mallotus villosus</i>	Capelin	Not at risk
<i>Melanogrammus aeglefinus</i>	Haddock	Not at risk

<i>Merluccius bilinearis</i>	Silver hake	Not at risk
<i>Merluccius productus</i>	North Pacific hake	Not at risk
<i>Microgadus proximus</i>	Pacific tomcod	Not at risk
<i>Myxine glutinosa</i>	Hagfish	Not at risk
<i>Oncorhynchus mykiss</i>	Rainbow trout	Not at risk
<i>Ophiodon elongatus</i>	Lingcod	Not at risk
<i>Parophrys vetulus</i>	English sole	Not at risk
<i>Platichthys stellatus</i>	Starry flounder	Not at risk
<i>Porichthys notatus</i>	Plainfin midshipman	Not at risk
<i>Prionace glauca</i>	Blue Shark	At risk
<i>Protomyctophum thompsoni</i>	Bigeye lanternfish	Not at risk
<i>Reinhardtius hippoglossoides</i>	Greenland halibut	Not at risk
<i>Sardinops sagax</i>	Pacific Sardine	Not at risk
<i>Scomber japonicus</i>	Chub mackerel	Not at risk
<i>Scomber scombrus</i>	Atlantic mackerel	Not at risk
<i>Scophthalmus aquosus</i>	Windowpane	Not at risk
<i>Sebastes paucispinis</i>	Bocaccio	At risk
<i>Sebastolobus altivelis</i>	Longspine Thornyhead	At risk
<i>Spirinchus thaleichthys</i>	Longfin smelt	Not at risk
<i>Squalus acanthias</i>	Picked dogfish	Not at risk
<i>Stenobranchius leucopsarus</i>	Northern lampfish	Not at risk
<i>Stenodus leucichthys</i>	Inconnu	Not at risk
<i>Theragra chalcogramma</i>	Alaska pollack	Not at risk
<i>Triglops murrayi</i>	Moustache sculpin	Not at risk
<i>Xiphias gladius</i>	Swordfish	Not at risk

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Table S5: Bird species evaluated.

Scientific name	Common name	Status
<i>Accipiter gentilis laingi</i>	Northern Goshawk laingi subspecies	At risk
<i>Aegolius acadicus brooksi</i>	Northern Saw-whet Owl brooksi subspecies	At risk
<i>Aeronautes saxatalis</i>	White-throated Swift	Not at risk
<i>Aix sponsa</i>	Wood Duck	Not at risk
<i>Alca torda</i>	Razorbill	Not at risk
<i>Ammodramus henslowii</i>	Henslow's Sparrow	At risk
<i>Anas clypeata</i>	Northern Shoveler	Not at risk
<i>Anthus spragueii</i>	Sprague's Pipit	At risk
<i>Ardea herodias fannini</i>	Great Blue Heron fannini subspecies	At risk
<i>Asio flammeus</i>	Short-eared Owl	At risk
<i>Athene cunicularia</i>	Burrowing Owl	At risk
<i>Aythya americana</i>	Redhead	Not at risk
<i>Brachyramphus marmoratus</i>	Marbled Murrelet	At risk
<i>Bucephala albeola</i>	Bufflehead	Not at risk
<i>Bucephala clangula</i>	Common Goldeneye	Not at risk
<i>Bucephala islandica</i>	Barrow's Goldeneye	At risk
<i>Buteo platypterus</i>	Broad-winged Hawk	Not at risk
<i>Buteo regalis</i>	Ferruginous Hawk	At risk
<i>Buteo swainsoni</i>	Swainson's Hawk	Not at risk
<i>Butorides virescens</i>	Green Heron	Not at risk
<i>Calcarius mccownii</i>	McCown's Longspur	At risk
<i>Calidris canutus islandica</i>	Red Knot islandica subspecies	At risk
<i>Calidris canutus roselaari</i>	Red Knot roselaari type	At risk
<i>Calidris canutus rufa</i>	Red Knot rufa subspecies	At risk
<i>Cathartes aura</i>	Turkey Vulture	Not at risk
<i>Catharus bicknelli</i>	Bicknell's Thrush	At risk
<i>Centrocercus urophasianus phaios</i>	Greater Sage-Grouse phaios subspecies	At risk
<i>Chaetura pelagica</i>	Chimney Swift	At risk
<i>Charadrius melodus circumcinctus</i>	Piping Plover circumcinctus subspecies	At risk
<i>Charadrius montanus</i>	Mountain Plover	At risk
<i>Charadrius vociferus</i>	Killdeer	Not at risk
<i>Chordeiles minor</i>	Common Nighthawk	At risk
<i>Colinus virginianus</i>	Northern Bobwhite	At risk
<i>Contopus virens</i>	Eastern Wood-Pewee	Not at risk
<i>Coturnicops noveboracensis</i>	Yellow Rail	At risk
<i>Dendragapus obscurus</i>	Dusky/Blue Grouse	Not at risk
<i>Dendroica cerulea</i>	Cerulean Warbler	At risk
<i>Dendroica fusca</i>	Blackburnian Warbler	Not at risk
<i>Dendroica kirtlandii</i>	Kirtland's Warbler	At risk
<i>Dendroica palmarum</i>	Palm Warbler	Not at risk
<i>Dendroica pensylvanica</i>	Chestnut-sided Warbler	Not at risk
<i>Dendroica striata</i>	Blackpoll Warbler	Not at risk

<i>Dendroica virens</i>	Black-throated Green Warbler	Not at risk
<i>Empidonax virescens</i>	Acadian Flycatcher	At risk
<i>Eremophila alpestris strigata</i>	Horned Lark strigata subspecies	At risk
<i>Euphagus carolinus</i>	Rusty Blackbird	At risk
<i>Falco peregrinus anatum</i>	Peregrine Falcon anatum subspecies	At risk
<i>Falco peregrinus pealei</i>	Peregrine Falcon pealei subspecies	At risk
<i>Falco peregrinus tundrius</i>	Peregrine Falcon tundrius subspecies	At risk
<i>Falco sparverius</i>	American Kestrel	Not at risk
<i>Fulica americana</i>	American Coot	Not at risk
<i>Gavia immer</i>	Common Loon	Not at risk
<i>Glaucidium gnoma</i>	Northern Pygmy-Owl	Not at risk
<i>Grus americana</i>	Whooping Crane	At risk
<i>Histrionicus histrionicus</i>	Harlequin Duck	At risk
<i>Icteria virens auricollis</i>	Yellow-breasted Chat auricollis subspecies	At risk
<i>Icteria virens virens</i>	Yellow-breasted Chat virens subspecies	At risk
<i>Icterus spurius</i>	Orchard Oriole	Not at risk
<i>Ixobrychus exilis</i>	Least Bittern	At risk
<i>Lagopus muta</i>	Rock Ptarmigan	Not at risk
<i>Lanius ludovicianus excubitorides</i>	Loggerhead Shrike excubitorides subspecies	At risk
<i>Lanius ludovicianus migrans</i>	Loggerhead Shrike migrans subspecies	At risk
<i>Larus californicus</i>	California Gull	Not at risk
<i>Larus hyperboreus</i>	Glaucous Gull	Not at risk
<i>Leucosticte tephrocotis</i>	Gray-crowned Rosy-Finch	Not at risk
<i>Limnodromus griseus</i>	Short-billed Dowitcher	Not at risk
<i>Limosa haemastica</i>	Hudsonian Godwit	Not at risk
<i>Loxia curvirostra percna</i>	Red Crossbill percna subspecies	At risk
<i>Megascops asio</i>	Eastern Screech-Owl	Not at risk
<i>Megascops kennicottii kennicottii</i>	Western Screech-Owl kennicottii subspecies	At risk
<i>Megascops kennicottii macfarlanei</i>	Western Screech-Owl macfarlanei subspecies	At risk
<i>Melanerpes erythrocephalus</i>	Red-headed Woodpecker	At risk
<i>Melanerpes lewis</i>	Lewis's Woodpecker	At risk
<i>Melanitta fusca</i>	White-winged Scoter	Not at risk
<i>Melospiza lincolnii</i>	Lincoln's Sparrow	Not at risk
<i>Melospiza melodia</i>	Song Sparrow	Not at risk
<i>Mimus polyglottos</i>	Northern Mockingbird	Not at risk
<i>Numenius americanus</i>	Long-billed Curlew	At risk
<i>Numenius borealis</i>	Eskimo Curlew	At risk
<i>Oporornis philadelphia</i>	Mourning Warbler	Not at risk
<i>Oreoscoptes montanus</i>	Sage Thrasher	At risk
<i>Otus flammeolus</i>	Flammulated Owl	At risk
<i>Pagophila eburnea</i>	Ivory Gull	At risk
<i>Passerculus sandwichensis princeps</i>	Savannah Sparrow princeps subspecies	At risk
<i>Passerina cyanea</i>	Indigo Bunting	Not at risk
<i>Phalaropus tricolor</i>	Wilson's Phalarope	Not at risk
<i>Phoebastria albatrus</i>	Short-tailed Albatross	At risk

<i>Phoebastria nigripes</i>	Black-footed Albatross	At risk
<i>Picoides albolarvatus</i>	White-headed Woodpecker	At risk
<i>Poecile gambeli</i>	Mountain Chickadee	Not at risk
<i>Poocetes gramineus affinis</i>	Vesper Sparrow affinis subspecies	At risk
<i>Protonotaria citrea</i>	Prothonotary Warbler	At risk
<i>Puffinus creatopus</i>	Pink-footed Shearwater	At risk
<i>Rallus elegans</i>	King Rail	At risk
<i>Rhodostethia rosea</i>	Ross's Gull	At risk
<i>Seiurus motacilla</i>	Louisiana Waterthrush	At risk
<i>Setophaga ruticilla</i>	American Redstart	Not at risk
<i>Somateria mollissima</i>	Common Eider	Not at risk
<i>Sphyrapicus thyroideus</i>	Williamson's Sapsucker	At risk
<i>Spizella arborea</i>	American Tree Sparrow	Not at risk
<i>Spizella pallida</i>	Clay-colored Sparrow	Not at risk
<i>Stelgidopteryx serripennis</i>	Northern Rough-winged Swallow	Not at risk
<i>Sterna dougallii</i>	Roseate Tern	At risk
<i>Strix occidentalis caurina</i>	Northern Spotted Owl caurina subspecies	At risk
<i>Synthliboramphus antiquus</i>	Ancient Murrelet	At risk
<i>Tachycineta bicolor</i>	Tree Swallow	Not at risk
<i>Toxostoma rufum</i>	Brown Thrasher	Not at risk
<i>Tympanuchus cupido</i>	Greater Prairie-Chicken	At risk
<i>Tyto alba</i>	Barn Owl	At risk
<i>Uria lomvia</i>	Thick-billed Murre	Not at risk
<i>Vermivora chrysoptera</i>	Golden-winged Warbler	At risk
<i>Vireo olivaceus</i>	Red-eyed Vireo	Not at risk
<i>Vireo solitarius</i>	Blue-headed Vireo	Not at risk
<i>Wilsonia citrina</i>	Hooded Warbler	At risk
<i>Wilsonia pusilla</i>	Wilson's Warbler	Not at risk

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Table S6: Sample sizes for taxonomic groups analyzed. For the data used in the models, we deleted all rows in which the data were incomplete for the variables evaluated.

Taxon	All data		Data used in models	
	Not at risk	At risk	Not at risk	At risk
Terrestrial mammals	50	29	40	23
Marine mammals	18	19	15	18
Freshwater fishes	50	36	14	24
Marine fishes	50	17	18	16
Birds	50	65	38	29

Table S7: Model parameter estimates, 95% unconditional confidence intervals (CI), and relative importance (Rel. imp.) of the averaged predictive logistic models of risk status for the five vertebrate species groups under study.

Variable	Coefficient	Lower CI	Upper CI	Rel. imp.
Terrestrial mammals				
Intercept	-2.705	-4.483	-0.927	
Road dens. ( $m \cdot km^{-2}$ )	0.015	0.004	0.025	0.99
Age mat. (yr)	1.186	0.168	2.203	0.97
Gest. time (months)	0.075	-0.164	0.314	0.40
Max. size (mm)	-0.001	-0.001	0.001	0.35
Lit. size (number)	-0.015	-0.140	0.109	0.25
Marine mammals				
Intercept	-1.313	-3.568	0.942	
Max. size (mm)	0.001	-0.001	0.001	0.82
Age mat. (yr)	0.041	-0.132	0.213	0.33
Gest. time (months)	0.040	-0.130	0.210	0.31
Freshwater fishes				
Intercept	0.719	-0.157	1.596	
Age mat. (yr)	3.335	-2.156	8.826	0.87
Max. size (mm)	-1.918	-6.072	2.236	0.67
Lat. mid. (deg)	-0.908	-3.116	1.301	0.59
Marine fishes				
Intercept	-4.347	-8.391	-0.303	
Age mat. (yr)	0.465	-0.001	0.931	0.95
Max. size (mm)	0.001	-0.001	0.002	0.52
Depth mid. (m)	0.001	-0.003	0.006	0.48
Lat. mid. ( $^{\circ}$ )	-0.001	-0.013	0.011	0.24
Fishing intensity (1–4)	0.067	-0.332	0.466	0.24
Birds				
Intercept	-0.805	-2.005	0.396	
Road dens. ( $m \cdot km^{-2}$ )	0.010	0.001	0.020	0.97
Egg num. (number)	-0.034	-0.164	0.096	0.34
Age mat. (yr)	0.125	-0.455	0.704	0.30
Alt. (0) or prec. (1)	0.037	-0.163	0.237	0.29
Size mat. (mm)	0.001	-0.001	0.001	0.27