



# Behavioral innovation promotes alien bird invasions

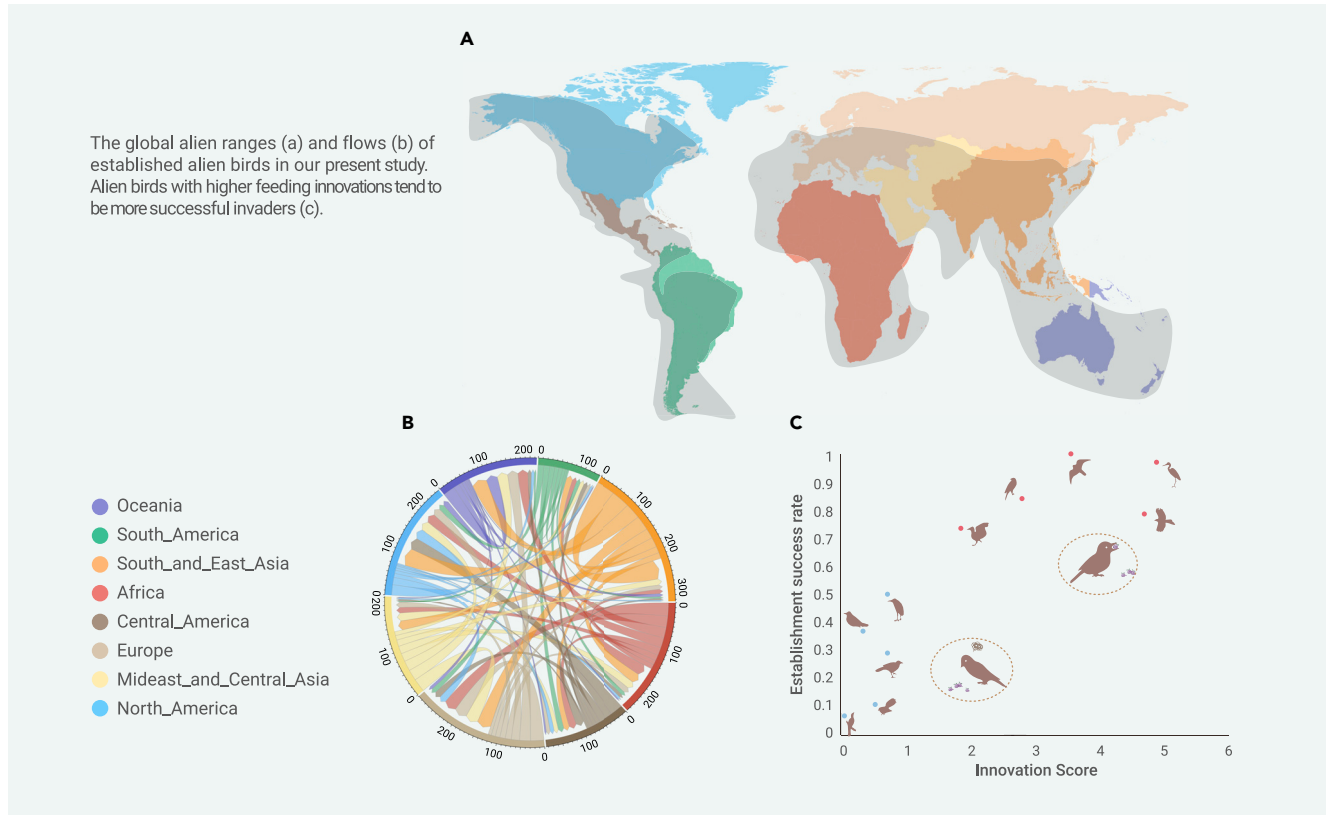
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## Graphical abstract



## Public summary

- The role of behavioral innovation in alien bird establishment is analyzed worldwide
- Behavioral innovation is a key factor facilitating alien bird establishment success
- Technical innovation is more influential than consumer innovation in this process



# Behavioral innovation promotes alien bird invasions

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**Behavioral innovation is believed to represent the ability of species to adapt to novel environments and to thus affect the observed establishment success of alien species in a new range. However, the relative importance of behavioral innovation in explaining alien species establishment among key event-, location-, and species-level factors remains poorly evaluated. In addition, the effects of technical innovation in food searching and handling techniques and consumer innovation in the use of new foods on establishment success are not clear. Here, based on a global dataset including information on 247 species across 9,899 successful and 2,370 failed introduction events spanning 199 countries or regions worldwide, we show that the behavioral innovation rate is a key factor facilitating alien bird establishment success after considering propagule pressure, climate matching, historical invasional meltdown, and life-history traits. Furthermore, we find that technical innovation is more influential than consumer innovation in explaining establishment success. Our results contribute to a deeper understanding of the effect of behavioral innovation on the establishment success of alien species in new ranges and may help predict the response of both native and alien species to accelerating global change during the Anthropocene.**

**Keywords:** biological invasion; behavioral innovation; global change; behavioral plasticity; alien bird

## INTRODUCTION

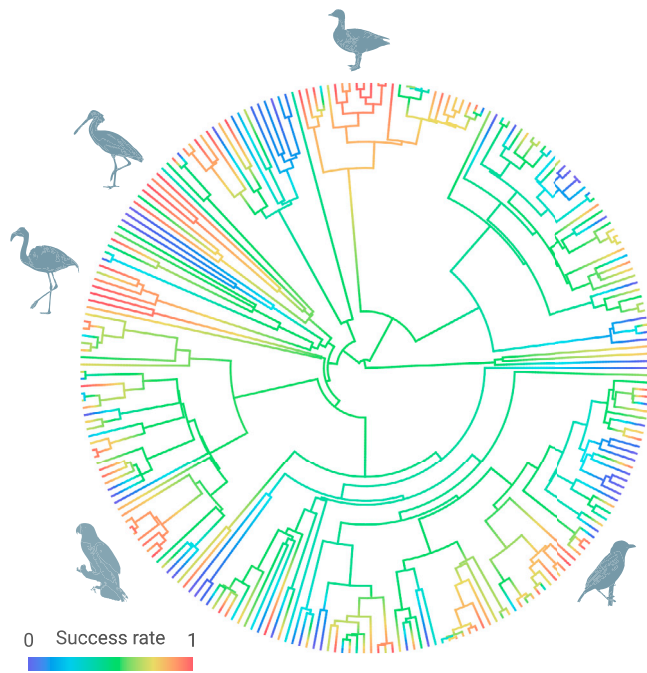
With the increasing introduction of alien species in the era of globalization,<sup>1</sup> biological invasion has been regarded as a major global change component causing rapid biodiversity decline, economic damage, and public health concerns.<sup>2</sup> Understanding why some alien species are more successful than others when introduced into the same regions is crucial for predicting new invasion events and developing effective prevention strategies at early stages.<sup>3</sup> Among the different invasion determinants, species traits have always been a central factor.<sup>4</sup> This is particularly true for behavioral innovation, which reflects the ability of species to cope with novel environments in their invaded ranges, and there have been great exploratory efforts addressing the effect of such innovation on the observed variation in alien species establishment probability.<sup>5–8</sup> However, the generality and relative importance of behavioral innovation in the establishment success of alien species remain difficult to identify for several reasons. First, most previous studies were based on indirect behavioral innovation surrogates such as brain size.<sup>7,8</sup> Nevertheless, brain size may be related to many components of species traits, and it has been shown that brain size mainly works through behavioral plasticity variables; thus, behavioral innovation is a more direct variable reflecting the adaptation ability of species in response to changing environments.<sup>6</sup> Second, for studies based on behavioral innovation variables, previous evidence was largely obtained at the continental or country scale, such as data on alien birds in New Zealand.<sup>5</sup> Third, global studies using behavioral innovation as the variable<sup>6</sup> have been based on relatively limited sample sizes compared with those on currently known established alien birds.<sup>9</sup> In addition, these previous studies did not consider some important climatic and biotic predictors, notably environmental similarity with that of the species' native distributions, reflecting the climatic suitability hypothesis,<sup>10</sup> and the presence of other alien groups, reflecting the invasional

meltdown hypothesis,<sup>11</sup> both of which have been identified as primary hypotheses of alien species establishment.<sup>12</sup> Therefore, the documented correlations between these key variables and establishment success may confound the behavioral innovation effect, and we thus know little about the relative importance of behavioral innovation when incorporating these key predictor variables together. Furthermore, there are different innovation types, including consumer innovation, such as the use of new foods in a species' diet, and technical innovation, such as food searching and handling techniques.<sup>13</sup> Whether there are differences in the effects of consumer and technical innovations on establishment success remains largely unknown. Finally, certain behavioral features of species may be highly phylogenetically conserved;<sup>14</sup> therefore, more elaborate phylogenetic methods are needed to control potential phylogenetic pseudoreplication of ecological characteristics among species.<sup>15</sup>

Alien bird invasions provide an ideal model system and unique opportunity to address these scientific questions worldwide. First, relatively accurate recordings of global avian establishment status comprising 27,723 population records spanning 971 alien bird species across more than 200 countries and territories that are updated in a timely manner are available.<sup>9</sup> Crucially, these data provide quantitative information on important factors affecting population establishment, such as propagule pressure; environmental differences between the native and alien ranges; the richness of historically established alien species across multiple taxonomic groups prior to the arrival of the bird invaders; species traits representing population growth, such as reproductive investment; and habitat generalism.<sup>12</sup> Furthermore, a comprehensive and global dataset quantifying the behavioral innovation of 8,645 birds was recently developed,<sup>13</sup> making it possible to test the generality of the behavioral plasticity hypothesis using more alien birds than ever before at the global scale. Behavioral innovation is regarded as an ideal metric for measuring behavioral plasticity ability when individuals encounter new abiotic and biotic selection pressures in novel environments.<sup>13</sup> Here, based on data for 247 alien bird invaders (12,269 population records) with available behavioral innovation information in 199 countries or regions across seven global biogeographic regions and five other crucial determinants of establishment success of alien birds,<sup>12</sup> we aim to assess the relative importance of behavioral innovation, propagule pressure, climate similarity, invasional meltdown, reproductive investment, and habitat generalism on alien bird establishment success across the globe. We further distinguish the relative roles of technical innovation and consumer innovation in predicting establishment success. We hypothesize that behavioral innovation may be an important variable in predicting the probability of alien bird establishment success after accounting for all previously pivotal confounding variables and phylogenetic autocorrelation, and there might be variations in the relative contributions of technical innovation and consumer innovation to establishment success.

## RESULTS

Among the 247 species, we found that a couple of taxonomic groups tended to be more successful regarding their establishment in a new range (Figure 1). Typically, groups with a high success rate of establishment were (1) some goose and swan species, such as the pink-footed goose (*Anser brachyrhynchus*), red-breasted goose (*Branta ruficollis*), and trumpeter



**Figure 1. Phylogenetic distribution of the establishment success rate (from 0 to 1: blue to red) for 247 alien bird species** Silhouettes (retrieved from [www.phylopic.org](http://www.phylopic.org)) represent some typical taxonomic groups with a high establishment success rate in a new range.

swan (*Cygnus buccinator*); (2) the African sacred ibis (*Threskiornis aethiopicus*) and African spoonbill (*Platalea alba*); (3) some flamingo species, such as the greater flamingo (*Phoenicopterus roseus*) and lesser flamingo (*Phoeniconaias minor*); (4) some Amazon species, such as the yellow-headed Amazon (*Amazona oratrix*) and red-crowned Amazon (*Amazona viridigenalis*); and (5) some weaver species, such as the village weaver (*Ploceus cucullatus*) and streaked weaver (*Ploceus manyar*) (Figure 1).

Linear mixed-effects models with multiple regression accounting for phylogenetic autocorrelation as a random effect ( $\lambda = 0.61$ ; 95% confidence interval, 0.34–0.76; Table S1) showed that species innovation significantly promoted the establishment success of alien birds ( $t = 3.1$ ,  $p = 0.002$ ,  $n = 247$  species; Figures 2 and 3; Table S1). Furthermore, propagule pressure (i.e., founding population size,  $t = 3.6$ ,  $p < 0.001$ ; Figure 3; Table S1) was the most important variable, and the effect size of the innovation rate was larger than that of most of the other variables, such as established populations, reproductive investment, and habitat generalism, which greatly affected the establishment success of alien birds (Figure 3; Table S1). Thus, behavioral innovation tended to be a more important factor affecting the establishment success of alien species in a new environment. More specifically, we found that both consumer and technical innovations facilitated the species' establishment success rate (consumer innovations:  $t = 2.5$ ,  $p = 0.01$ . Technical innovations:  $t = 3.2$ ,  $p = 0.0018$ ), although technical innovations seemed to be a more influential factor (Figure 3; Tables S2 and S3). Additionally, we found a significant effect size of difference from native environment (i.e., the difference in environmental conditions between an invaded location and the native range of a species;  $t = -2.1$ ,  $p = 0.03$ ; Figure 3; Table S1), which was consistent with the results of a previous study.<sup>12</sup>

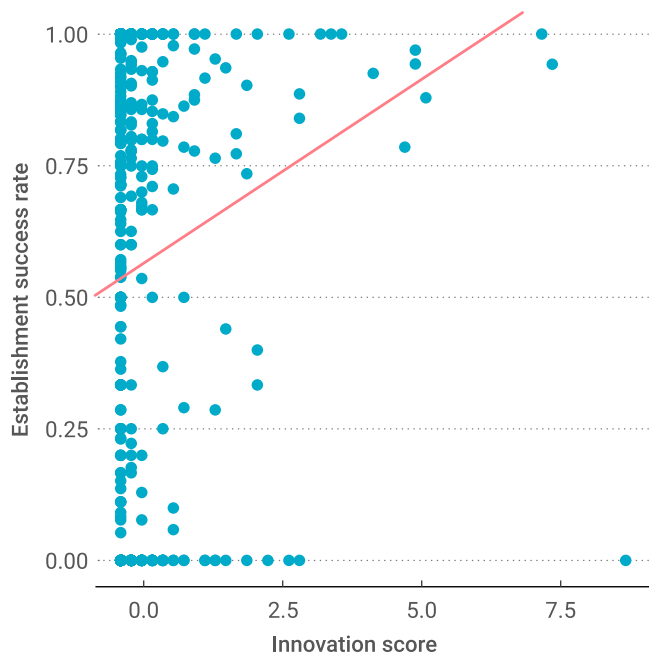
## DISCUSSION

Our study based on recent alien bird invasion and foraging innovation data reveals that behavioral innovation is indeed an important factor determining alien bird establishment, indicating the generality of this phenomenon in avian invasions. However, we covered many more species and regions of the world than past studies and incorporated more key processes determining alien bird establishment. We also found that bird

technical innovation in searching and handling foods is more crucial than adopting new food types in predicting establishment success. This finding is of great importance because we accounted for phylogenetic relatedness in greater detail and quantified the relative importance of each of the predictor variables, showing that behavioral innovation was the second most important variable contributing to the probability of alien bird establishment after propagule pressure, particularly in terms of the ability to develop new foraging techniques.

Behavioral innovation has long attracted great attention as an important attribute of successful invaders.<sup>5,6</sup> Our present study provides further quantitative evidence of its important effect after accounting for other key determinants at the invasion event, location, and species levels. Behavioral innovation can reflect learning, cognition, and rapid adjustment to new environments and thus plays a critical role when species invade new habitats. Specifically, the foraging innovation considered here can indicate variation in the discovery of hard-to-reach foods by alien species and changes in food availability in new ranges.<sup>16</sup> The critical effect of propagule pressure is not surprising because the magnitude of introduction efforts has long been regarded as a fundamental driver of alien species establishment.<sup>17,18</sup> Our results support the propagule pressure hypothesis, which posits that the probability of alien species establishment increases with the number of introduction events and the number of individuals involved in each introduction event<sup>19</sup> because high propagule pressure can overcome inbreeding depression and genetic drift due to demographic and environmental stochasticity or Allee effects.<sup>18</sup> We also provide results consistent with the finding of an important role of climatic similarity between native and invaded ranges in explaining alien bird establishment. These results support the climatic similarity hypothesis, which states that alien species may be more likely to establish naturalized populations in alien environments with high climatic suitability in terms of similarity with the species' native ranges, as it has been suggested that such species may be preadapted to nonnative conditions.<sup>20</sup> Indeed, as a fundamental ecological principle related to species distributions, climatic matching between native and alien ranges is widely recognized as a key predictor of establishment success by nonnative populations,<sup>21</sup> and emerging evidence across taxa has demonstrated the high conservatism of climatic niches during the invasion process.<sup>22</sup>

We did not detect a significant contribution of reproductive investment (brood size used here), historical alien species richness, or habitat generalism to establishment of the 247 alien birds. Reproductive investment is thought to represent the population growth capacity,<sup>23</sup> and this variable likely added little variation that may have been captured by other more important predictors influencing population size, such as propagule pressure. We also revealed no overall significant effect of historical alien species richness. This does not mean that an effect of interactions among congeneric invaders is absent but may demonstrate the complex interactions among cooccurring invasive animals,<sup>24,25</sup> which is dependent on a number of factors, such as relative population density, functional equivalence, and trophic position.<sup>26</sup> For instance, although the invasional meltdown hypothesis suggests that there tends to be a positive relationship between the probability of establishment of one alien species and the number of prior successful invaders that can help reduce predators or competitors,<sup>27</sup> the naturalization hypothesis posits that the presence of sympatric species reduces the probability of establishment success owing to competition with congeners for limited resources.<sup>28</sup> We found no significant effect of habitat generalism on alien bird establishment, suggesting that this variable might be correlated with other more important variables, such as behavioral innovation, which represents the ability to adapt in response to various abiotic and biotic selection pressures.<sup>29</sup> Indeed, we found that using new foods (i.e., consumer innovation) was a significant variable affecting alien bird establishment, supporting the idea that opportunistic omnivores that can use different types of foods, especially new foods in nonnative ranges, are particularly likely to be successful invaders.<sup>30</sup> However, we further found that technical innovation has a larger effect size than consumer innovation, indicating that how various types of foods are used may be more crucial than the exact food per se for alien birds in terms of their ability to colonize new environments. One potential



**Figure 2. Establishment success rate as a function of innovation score (innovation rate)** Here, the regression function (equation) is from the mixed-effects model (Table S1) with an intercept of 0.57, and the slope of the innovation score is 0.07.

explanation is that the capacity to acquire hard-to-reach foods may be key to the survival and establishment of alien species when they arrive in novel environments.

Environmental disturbance has been recognized as an important facilitator of biological invasions, as alien species are often observed taking advantage of human-modified environments.<sup>31,32</sup> One potential explanation for this effect is that disturbed habitats can promote nonnative species establishment by decreasing the abundance of native species and thus creating vacant niches that can be filled by invaders.<sup>33</sup> We argue that the important behavioral effect on alien species establishment identified here and in previous studies indicates that the habitat disturbance hypothesis might be alternatively explained by the animal behavior phenomenon in which successful invaders may have higher behavioral innovation ability when faced with disturbed habitats, which warrants additional research. We acknowledge that current evidence of the behavioral innovation hypothesis mainly stems from alien bird invasions, and its generality needs to be further tested across more taxonomic groups. In addition, existing correlative analyses based on observations must be integrated with experimental approaches to explore more causal relationships between behavioral plasticity and establishment success. For example, the observed changes in foraging behavior may be regulated by different expressions of the same physiological and genetic features in different environments.<sup>34</sup> Indeed, the foraging innovations that we used in the present study tended to be repeatable (intraclass coefficient = 0.36) across different regions.<sup>13</sup> This indicated the potential heritability of these innovation behaviors according to the theoretical prediction of quantitative genetics, which is beyond the scope of the present study but warrants further investigations when related physiological and genetic data modulating bird predatory behaviors are available. Furthermore, as alien species usually show high phenotypic plasticity and even rapid evolutionary abilities during biological invasions<sup>35</sup> and animal behavior has been demonstrated to be shaped by novel selection pressures,<sup>36</sup> further investigations of whether alien species could enhance their behavioral flexibility in varied environments in new ranges are needed. The crucial role of the behavioral innovation of alien species during establishment could not only facilitate the understanding of the potential interactions of biological invasion with other global change processes, such as land-use modifications, but also help predict the survival

probability of native species in response to changing environments. Indeed, recent work showed that behavioral innovation is a good predictor of native species endangerment.<sup>13</sup> In response to the accelerating rate of human-induced environmental changes during the Anthropocene, comparisons of these two fields may provide valuable insights into key characteristics that allow both native and alien species to rapidly adapt to changing environments.<sup>37</sup>

## MATERIALS AND METHODS

### Establishment success rate

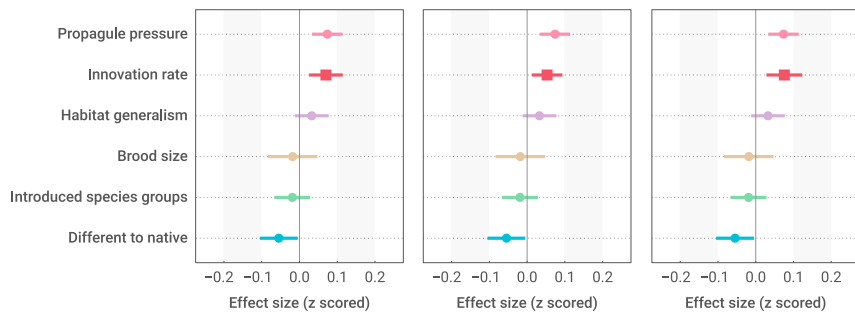
The establishment success data (e.g., establishment status and population location) for alien birds used in the present study are from Dyer et al.,<sup>9</sup> which include a database of alien bird distributions at a global scale. This database (Global Avian Invasions Atlas) comprises 27,723 population records for 971 species introduced to 230 countries and regions across all biogeographical realms. More details regarding the whole database are presented in Dyer et al.<sup>9</sup> In short, the raw data in this database include taxonomic, spatial, and temporal information as well as details relating to introduction events and their ultimate consequence (i.e., failure or success). For the present study, we calculated the species establishment success rate, which is the proportion of successfully established population records for each species (the number of successful invasion events divided by the total number of introduction events). By doing so, we obtained data for 688 species (18,544 population records) of this variable for further analysis.

### Behavioral innovation variables

Rather than relative brain size, our present study used behavioral innovation, which is regarded as a more direct variable reflecting the ability of birds to adapt to new environments.<sup>13</sup> Furthermore, there has long been concern and debate regarding the use of brain size as a predictor of animal behavior because contradictory results have been observed in multiple comparative studies.<sup>38</sup> Indeed, we did not find a significant correlation between any of three foraging innovation variables and brain size for 144 alien bird species with available brain size data (Pearson correlation coefficient, innovation rate versus brain size,  $r = -0.046$ ,  $p = 0.58$ ,  $n = 144$ ; food innovation versus brain size,  $r = -0.085$ ,  $p = 0.31$ ,  $n = 144$ ; technical innovations versus brain size,  $r = -0.005$ ,  $p = 0.95$ ,  $n = 144$ ). We directly extracted the behavioral innovation data from Ducatez et al.<sup>13</sup> In that study, the authors built a unique database of >3,800 published field observations of birds that covered most regions of the world and documented the incorporation of new foods into the diet or the use of novel feeding techniques. Descriptions of the data are presented in Overington et al.<sup>39,40</sup> and Ducatez et al.<sup>13</sup> In brief, the database was compiled by systematically searching for reports of new behaviors in birds across 204 ornithology journals published between 1960 and 2018. A consumer innovation was defined as a feeding behavior if it was described in the report with key words such as novel, opportunistic, first description, not noted before, or unusual.<sup>41</sup> Similarly, a technical innovation refers to having a novel searching and handling technique regardless of whether the food type was novel.<sup>13,39</sup> For species with at least one recorded innovation, either consumer or technical, the total number of innovations reported was extracted and referred to as the innovation rate (the sum of consumer innovations and technical innovations; see the definition of innovation rate in Ducatez et al.<sup>13</sup>). Therefore, we used three variables of innovation in the present study: (1) innovation rate, (2) consumer innovations, and (3) technical innovations. Following Ducatez et al.,<sup>13</sup> we considered 8,645 species with these three innovation variables, including 7,397 species with zero innovation records and 1,248 species with at least one recorded innovation, for further analysis.

### Other important variables affecting the establishment success rate

To further investigate the relationship between establishment success and innovativeness, we also considered important ecological and life-history traits that have been found to affect the establishment success of alien birds according to Redding et al.<sup>12</sup> from three sets of variables: (1) invasion-event-level factors (e.g., propagule pressure), (2) species-level factors (e.g., life-history traits), and (3) location-level factors (e.g., environmental similarity with the native range). For this study, we selected variables from all three sets of factors listed in Redding et al.<sup>12</sup> for which the effect sizes for establishment success ranked at least 10<sup>th</sup> among all factors and that were representative of those three sets of factors. By doing so, five key variables with significant effect sizes for the establishment success of alien birds and representative of these three sets of factors (i.e., including at least one key factor from each set of factors) were included in the present study. These five variables are as follows: (1) established populations (represents specific invasion-event-level factors), which is the number of alien taxonomic groups that are already established at a location at the time of introduction. This variable has an impact on establishment success because the ecological disruptions that are caused by (or enable) earlier invasions facilitate further successful introductions.<sup>11</sup> (2) Reproductive investment (represents species-level factors), for which we used brood size here, following previous studies. This variable is expressed as  $\log_{10}(1/(\text{broods per year}) \times (\text{reproductive lifespan}))$  and represents investment in



**Figure 3. Parameter estimates (effect sizes) from the mixed-effects model of the success of alien bird establishment** Shown are the estimate of each parameter and its 95% confidence interval. The effect sizes of three innovation variables are shown with box symbols, and those of other variables are shown with circle symbols.

the future over current reproduction.<sup>4,12</sup> (3) Propagule pressure (represents specific invasion-event-level factors), which is a numerical estimate of propagule pressure (founding population size), measuring both the number of introduction events per record (propagule number) and the number of individual birds that were introduced during each event (propagule size).<sup>17,18</sup> (4) Difference from native environment (represents location-level factors), which is the difference in environmental conditions between an invaded location and the native range of a species.<sup>10</sup> (5) Habitat generalism (represents species-level factors), which is a measure using the total number of different habitat use types.<sup>42</sup> Data on these five variables for 341 species were available and used for further analysis. For species trait factors, we did not include additional predictor variables, such as body size or body weight, that are not key traits for introduced avian invasion.<sup>43</sup>

#### Statistical analyses

We carried out all analyses within the R statistical environment.<sup>44</sup> We first combined all three datasets, which included data on the establishment success rate, behavioral innovation variables, and other important variables affecting the establishment success rate. This resulted in a total of 247 species (12,269 population records of invasion events, including 9,899 successful and 2,370 failed events) for which all data were available for further statistical analyses.

To quantify the association between the establishment success rate and behavioral innovation, we used linear mixed-effects models with multiple regression accounting for phylogenetic autocorrelation as implemented with the function `phyloilm` in the package `phyloilm`.<sup>15</sup> All models were run across a sample of 1,000 phylogenies using the Ericsson backbone obtained from [www.bridtree.org](http://www.bridtree.org)<sup>45</sup> to account for phylogenetic uncertainty (coded as a random effect in the models), and the results represent an average across these. The linear mixed-effects model has been regarded as a robust multivariate analysis technique and is a widely used approach for comparative studies that can account for both phylogenetic autocorrelation and random effects to control the sampling pseudoreplication issue.<sup>46</sup> The establishment success rate was included as the response variable in the models. For the fixed effects, we fitted the innovation rate and the other five predictor variables listed above. To further investigate which type of innovation specifically affects the establishment success rate, we ran the model two additional times by replacing the innovation rate with consumer innovations and technical innovations, respectively. We calculated the standardized effect size for each of the predictor variables with a mean of zero and standard deviation to compare their relative importance in explaining the establishment success of alien birds.<sup>12</sup>

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#### AUTHOR CONTRIBUTIONS

X.L. and D.W. designed the study. X.L. and D.W. collected the data. D.W. and X.L. analyzed the data. X.L. and D.W. wrote the article.

#### DECLARATION OF INTERESTS

The authors declare no competing interests.

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#### SUPPLEMENTAL INFORMATION

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