**A Phylogenetically Controlled Meta-Analysis of Biologging Device Effects on Birds: Deleterious effects and a call for more standardized reporting of study data**

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**Abstract**

1. The use of biologging devices continues to increase, with technological advances yielding remarkable ecological insights and generating new research questions. However, as devices develop and are deployed more widely, there is a need to update our knowledge of the potential ethical impacts to allow scientists to balance these against the knowledge gained.
2. We employed a suite of phylogenetically controlled meta-analyses on a dataset comprising more than 450 published effect sizes across 214 different studies to examine the effects of biologger tagging on five key traits in birds.
3. Overall, we found small but significant negative effects of tagging on survival, reproduction, parental care. In addition, tagging was positively associated with foraging trip duration, but had no effect on body mass. Meta-regressions revealed that flying style, migration distance and proportional tag mass were significant influences producing these deleterious effects, with attachment type and position additionally important covariates influencing survival- and reproduction-based effect sizes.
4. There was a positive correlation between the effects of tagging on survival and reproduction, highlighting that effects may be cumulative, with the full effects of tagging not necessarily apparent in studies focused on single traits. We discuss the tradeoff between these negative effects and the advances gained through the use of biologgers.
5. Finally, given the number of studies from our initial literature search that lacked sufficient data for inclusion in analyses, we provide recommendations on the essential information that all biologging studies should report in order to facilitate future assessments of impacts on animals.

**Introduction**

The biologging revolution, with the use of small, lightweight devices to record spatial and physiological parameters of animals, has increased our understanding of the natural world (Kays *et al.* 2015; Hussey *et al.* 2015). It has transformed the study of migration (Milner-Gulland, Fryxell & Sinclair 2011), and has provided remarkable insights into foraging (Bodey *et al.* 2014; Adachi *et al.* 2016) and physiology (Bishop *et al.* 2015; Watanabe *et al.* 2015), generating a new understanding of these processes in many animal species. Increasingly, biologging devices carried by animals are being used as monitoring tools, providing insights into abiotic environmental processes, ecosystem function and human activities (Kays *et al*. 2015).

While there is a natural temptation to exploit this technology in order to reveal hidden processes and gain deeper insights, there are important questions surrounding the ethics of obtaining such data, and the reliability of estimates derived from it. An overly instrumented animal may behave in atypical ways, for example through reduced movement, excessive comfort behaviours and, in the most extreme cases, death (Thaxter *et al.* 2016). This is of particular relevance as new more sophisticated devices become available that are extremely attractive due to an increase in quantity/quality of data recorded and thus the questions that can be addressed (Kays *et al.* 2015; Hussey *et al.* 2015). Obtaining accurate and ‘typical’ data is key to all scientific enquiry and there is a long-standing concern with instrumenting animals and the effects this may have (Kenward 2001; Wilson & McMahon 2006; Casper 2009; Vandenabeele *et al*. 2012). Indeed, guidelines on animal welfare in research have evolved significantly in many countries over the period that biologger use has increased (Wilson & McMahon 2006; Casper 2009; Anonymous 2012; Sergio *et al.* 2015). Such concerns often play a critical role in the choice of biologging device and the attachment type a particular study will adopt. While the literature can offer guidance, protocols are frequently copied from ‘similar’ species with the expectation that what works for one will apply to another (Kenward 2001; Wilson & McMahon 2006; Casper 2009; Vandenabeele *et al*. 2012). Assessing the extent to which this is a valid approach is made difficult due to the range and type of data reported as a result of different study aims, the disparate publishing locations of the research, and the reduced likelihood of publication of negative consequences (but see: Thaxter *et al.* 2016). In addition, although reviews and ‘how to’ guides on tagging and animal welfare have previously sought to address this issue (Phillips *et al.* 2004; Wilson & McMahon 2006; Casper 2009; Vandenabeele *et al.* 2012), some rules-of-thumb, such as the 5% or 3% proportion of body mass that devices may not exceed, have become accepted ‘standards’ despite limited evidence as to their broad applicability (Kenward 2001; Phillips *et al.* 2004; Gannon & Sykes 2007; Casper 2009; Barron, Brawn & Weatherhead 2010).

In birds, there have been concerns as to the effects of biologging devices on the behavior, and particularly the survival, of instrumented individuals for over a decade (Phillips *et al.* 2004; Casper 2009; Sergio *et al.* 2015). The incorrect device deployment can affect survival rates, and even carefully considered choices may reduce return rates in migrating birds (Thaxter *et al.* 2016), or impair foraging or breeding success (Barron, Brawn & Weatherhead 2010). In efforts to summarize the impacts of tagging, negative effects have generally been found in meta-analyses looking at particular tag types (e.g. geolocators Costantini & Moller 2013), particular species groups (e.g. waders Weiser *et al*. 2016) or across the literature as a whole (Barron, Brawn & Weatherhead 2010). However, as new empirical evidence accumulates, meta-analyses need to be revised, especially as effect sizes (which provide a measure of the magnitude of a treatment effect) tend to decline over time in fields such as ecology (Jennions & Møller 2001), and more powerful meta-analytical techniques develop (Hadfield & Nakagawa 2010). In addition the available technology is continually changing and, in particular, miniaturizing, resulting in an increasing range of positional and physiological devices being deployed across an expanding range of species (Fig S1). There is, therefore, an urgent need for a more complete assessment of the effects of biologging devices in order to provide researchers with the best information and guidance. Moreover, previous studies have focused on limited sets of traits or tag types, or combined data from wild and captive organisms operating under very different constraints, and none have controlled for phylogeny.

Here we provide the first phylogenetically controlled meta-analysis of the principle biologging devices (listed in methods) and the extent of their impacts on birds for a suite of key traits: survival, reproduction, body mass, parental care and foraging behaviour. We use meta-regression techniques (Nakagawa & Santos 2012) to explore how factors such as device mass, attachment method or position moderate the effect of tagging. We also employ a multivariate procedure to examine whether the effects of tagging are correlated between traits across species, providing a more complete assessment of potential cumulative impacts. Together this enables us to highlight the (in)appropriateness of various attachment types for different species groups, particularly if these are considered functionally in terms of flying style, migration distance etc. rather than purely taxonomically. Lastly, we provide specific recommendations as to the type of data that should be supplied with all publications that employ biologgers in order that the effect of current, and new, technologies can be thoroughly assessed through similar approaches. This will ensure that both animal welfare and data quality standards are as high as possible, and that recommendations for best practice can be re-evaluated and updated as necessary.

**Materials & Methods**

*Literature Search and Data Compilation*

We searched the literature using ISI Web of Science (http://wok.mimas.ac.uk/) and Google Scholar (https://scholar.google.co.uk/) using the search term *bird\** alongside device specific terms: *ARGOS, Geolocator, GLS, GPS, GSM, PTT, Satellite, UHF* and *VHF*. As the latter two terms produced few results, we combined *radio* *and* *bird\** with additional terms *backpack, collar, harness, satellite, telemetry* and *transmitter*. Using this approach for other device specific terms did not produce additional relevant publications. Searches were conducted for papers published during the period Jan 2009 to Apr 2016. We incorporated papers published pre-2009 by adding all studies cited within reviews of specific tag types or species groups (Godfrey & Bryant 2003; Phillips *et al.* 2004; Barron *et al*. 201; Vandenabeele *et al.* 2012; Costantini & Moller 2013; Watanabe *et al.* 2016; Weiser *et al.* 2016). We also performed a forward search to include any studies citing these reviews. Unpublished datasets were not solicited to reduce the risk of biasing effect size estimates (Jennions *et al.* 2013).

*Inclusion/ Exclusion criteria*

Following the literature search, studies were retained based upon the following criteria: (1) only studies conducted in the wild were included, with studies of captive or released individuals excluded, (2) The sample size for the study must have ≥5 individuals, (3) Data must be provided on both tagged and control birds; studies referencing earlier data or other studies as a control were excluded. Control birds were not fitted with biologger tags but were fitted with identification markers (e.g. colour rings) and are best considered as procedural controls having been caught and handled, (4) A suitable effect size estimate, or sufficient information for an effect size calculation must be provided. These criteria ensured that studies provided suitable information for undertaking a meta-analysis. Although our initial collation from search terms totaled over 13000 publications, deploying these criteria ultimately produced 451 effect sizes across 214 different studies. A detailed breakdown of our data search is provided in the appendix (Fig S2).

*Data extraction*

Effect sizes came from numerous sources: (1) Direct reports e.g. Cohen’s *d* (2) measures with magnitude and direction e.g. regression coefficients (3) raw numbers e.g. contingency tables and (4) inferential test statistics e.g. *t* or χ2 values. Data were converted to Fisher transformed correlation coefficients *Zr*, following standard formulae (Nakagawa & Cuthill 2007) and Zr was used as the response variable in our meta-analyses. Values of *Zr* = 0.1, 0.31 and 0.55 are used to refer to small, medium and large effects respectively. We used Zr as our effect size metric because it is normally distributed, permitting parametric analysis, and the sampling variance of Zr is easily estimated as: 1/(*N*-3), where *N* represents the sample size on which the given effect size is based (Lipsey & Wilson 2001).

*Potential impacts on vital rates and other traits*

In order to assess the impact of devices on birds, we categorized effect sizes based upon the nature of the hypothesis tested and data available. The key traits we examined for tagging effects were: Survival, Reproduction, Body Mass, Parental Care and Foraging Behaviour (Table S1). We calculated separate effect sizes for each measure from every independent population tested within a study (for totals see Table 1 and Fig. S2). Thus, if tag effects were examined across two distinct populations in a given study, two independent effect sizes were calculated. Similarly, if studies assessed tag effects on independent samples of individuals over multiple years, separate effect sizes were calculated for each study year (to account for potential non-independence when a study provides more than on effect size we included study ID as a random effect, see below). We also collected data on a number of potentially important moderator variables including attachment location, flying style etc. to allow us to examine what factors influence the effect of tagging (Table 2).

*Phylogenetic Meta-Analysis*

All analyses were conducted in the R environment (R Development Core Team 2016) using the R package MCMCglmm (Hadfield 2010) unless specified otherwise. We ran separate Bayesian multilevel meta-analyses for each of the 5 key traits. For each category we present the results of an intercept-only model (Model A), providing the overall mean effect size across studies (i.e. standard meta-analysis), with random effects for: study, species, year and phylogeny, and the measurement error variance for each individual effect size set as 1/(*N*-3). The inclusion of a phylogenetic random effect allowed us to account for the potential non-independence of data due to shared ancestry. To incorporate phylogeny we used the Ericson backbone tree from Jetz *et al.* (2012), downloaded from: <http://birdtree.org/>. As an index of the magnitude of the phylogenetic signal in the data we calculated the phylogenetic heritability *H2*(Hadfield & Nakagawa 2010).

For each key trait category we then ran single factor meta-regression models (Model B) with the same random effects listed above, and entering each moderator variable in turn to obtain parameter estimates for each level in each factor. The continuous variables proportional tag mass and duration of deployment were included to control for their potential effect, but were removed if model Deviance Information Criterion (DIC) scores indicated this did not reduce model fit. In addition, we tested whether there was a change in the magnitude of reported effect sizes over time. However, we found no time trend in reported effect sizes in any meta-analysis model and this term was subsequently removed from all models (see Appendix). We present *I2* values as a measure of inconsistency in effect sizes across studies. *I2* is generally defined as the ratio of true heterogeneity to the total variance across studies (Borenstein *et al.* 2009), with *I2* benchmark values of 25%, 50% and 75% representing low, moderate and high values respectively (Higgins *et al*. 2013). Due to the inclusion of random effects we calculated a modified version of *I2* following Nakagawa & Santos (2012). For meta-regression models the calculation of *I2* is inappropriate, so instead we report the marginal and conditional *R2* values for each meta-regression model following Nakagawa & Schielzeth (2013).

*Multivariate meta-analysis*

We performed a multivariate meta-analysis (Model C), using weighted species mean effect sizes as the unit of analysis using the WinBUGS program (Lunn *et al*. 2001; Cleasby & Nakagawa 2012). This allowed us to estimate whether the effects of tagging on key traits are correlated across species. Due to the nature of reported data we often encountered missing values whenever a species provided an effect size for one category but not another. To account for this we used Bayesian data augmentation to prevent bias when estimating correlations among effect size categories (for more details and WinBUGs code see Appendix and Cleasby & Nakagawa 2012).

For all meta-analysis models we used parameter-expanded priors for the random effects, running 3 MCMC chains for 500 000 iterations, with a thinning interval of 25 after a burn-in of 100 000. Auto-correlation between posterior samples was <0.1 for all estimated parameters, and the Gelman-Rubin diagnostic was <1.2 for all parameters, indicating chain convergence. Results are reported with 95% Bayesian credible intervals (CRIs), and also more conservative 80% CRIs due to the importance of avoiding negative impacts on study organisms.

*Assessing publication bias*

To test for possible publication bias, we ran Egger’s regression test (Egger *et al.* 1997) on the residuals from our meta-analysis models (Nakagawa & Santos 2012). In addition, we ran trim-and-fill analyses (Duval & Tweedie 2000) on model residuals to identify and correct for potentially missing studies (more details in Appendix).

**Results**

*Model A – Standard random effects meta-analysis*

On average, tagging birds produced small but significant impacts on four of the five key traits examined, with tagged birds suffering reductions in survival, reproductive success and parental care (Table 1, Fig 1), and with increases in foraging trip length (Table 1), compared with controls. There was no evidence of significant publication bias in any of these analyses (Table S1). However, trim-and-fill methods suggested that there were potential missing studies, and adjusting for these slightly increased the negative effect of tagging across all traits (Table S1, Fig 1). There was no evidence that tagging influenced the body mass of individuals, even after adjusting for potential missing studies, and again no evidence of publication bias.

Across all five meta-analyses the random effects included explained little of the variation in effect sizes, and there was no evidence of phylogenetic heritability in tag effects (Table S2). There was some evidence of between-species variation in survival, and between-study variation in body mass, although the variance component intervals were quite wide (Table S2). *I2* values indicate that there was high heterogeneity in survival and reproduction effect sizes, but lower levels of heterogeneity in relation to body mass, parental care and foraging trip length (Table S1).

*Model B – Meta-regression on key traits with moderator variables*

*Survival*

Effect sizes varied across methods of tag attachment, with harness and tailmount attachment associated with significant negative effects on survival at 95% CRI, while leg band and poncho methods also produced negative effects at more conservative 80% CRI (Table S3, Fig 2a). Effect sizes were non-significant for other attachment methods, however in certain cases available sample sizes were small, which will reduce statistical power. Reductions in survival when tags were placed on a bird’s back or tail are probably reflective of the negative effect of harnesses and tail-mounts.

Examination of flight type revealed that tagged birds with flapping flight experienced reduced survival compared to other styles. Negative effects were also greatest in species with long migration distances (Table S3). Tagging was also associated with lower survival in studies in which only one sex was tagged, but was not associated with survival in studies in which only juveniles were instrumented (though it should be noted the effect on juveniles was based on a sample size of 10). Neither proportional tag mass (β = -0.0051; 95% CRI: -0.039 – 0.031) or deployment duration (β =0.017; 95% CRI: -0.006 – 0.039) significantly influenced survival. However, when categorizing proportional tag mass as above or below 1% of species’ body mass, we found a negative effect of tagging upon survival when tags were >1%, but no effect when tags were <1% of body mass (Fig 2a). The conditional *R2* (variance explained by both fixed and random factors) of our survival meta-regression models was high (*R2COND* = 0.91). However, the marginal *R2* (variance explained by fixed factors only) was lower (*R2MARG*= 0.18).

*Reproduction*

The significant effects of tags on reproduction were largely limited to those associated with tagging with neck collars (negative impacts of collars, neck as a tag position and flapping flight at 95% CRI, Table S4, Fig 2b). Although, for certain tagging methods our sample size was low, which may explain non-significant results in some instances. As with survival, the effects of tagging on reproduction appeared more negative in birds with flapping flight compared to other flight styles, with long-distance migrants also negatively affected at the 80% CRI (Table S4). Tags also had negative impacts on reproduction when >1% of species’ body mass (Fig 2b). There was no evidence that deployment duration (β =0.007; 95% CRI: -0.036 – 0.051) influenced reproduction effect sizes. As with survival the fixed factors explained little of the variation in effect sizes (*R2COND* = 0.51; *R2MARG* = 0.14).

*Body Mass*

None of the moderator variables assessed were significant at the 95% CRI (Table S5). However, 80% CRIs suggest a trend for collars and neck attachments (collars and ponchos) to reduce body mass (Table S5, although estimates were based on small sample sizes). Similarly, at 80% CRIs, studies tagging only one sex showed greater negative effects than those tagging both sexes. Neither deployment duration, proportional or categorical tag mass produced significant effects (Table S5). The *R2* values were: *R2COND* = 0.92 and *R2MARG* = 0.31.

*Parental Care*

Effect sizes for parental care were positively associated with tail-mount attachment methods (Table S6), although this result was based on a very small sample size (2 effect sizes from 2 studies) so should be treated with caution. Otherwise, 80% CRIs revealed parental care tended to decline when tags were fitted internally or via adhesive, and when attached on the back (Table S6). No other attachment methods were associated with parental care effect sizes, and there was no evidence for an association with proportional tag mass or deployment duration, although there was a tendency for tags weighing >1% body mass to reduce parental care (Table S6). The *R2* values were: *R2COND* = 0.88 and *R2MARG* = 0.39.

*Foraging Trip Duration*

Fitting tags to male birds significantly increased foraging trip durations (Table S7). Otherwise there were tendencies at 80% CRIs for birds to increase foraging trip duration when tags were placed on the back, and for all flying styles except soaring (Table S7). Deployment duration, proportional or categorical tag mass were not associated with foraging effect sizes. The *R2* values were: *R2COND* = 0.94 and *R2MARG* = 0.11.

*Model C – Multivariate meta-analysis*

Effect sizes estimated using a multivariate meta-analysis were similar to those estimated via standard meta-analysis models (model A). Thus, results are qualitatively unchanged whether analysed at the population or species level (Table S8). There was a positive correlation between survival and reproduction effect sizes at the species level (Fig 3), indicating that when tagging negatively affects a species’ survival rates, it is also likely to reduce reproduction and vice versa. There was little evidence of correlations between other effect size categories, although relatively small sample sizes limit the precision of correlation estimates (Table S9).

**Discussion**

Overall, phylogenetically corrected meta-analyses revealed that tagging birds had small, but significant negative effects on a number of key traits. This was confirmed by both standard and multivariate meta-analyses, with tagging associated with small reductions in survival, reproductive success and parental care, and an increase in foraging trip durations (Fig 1). The only key trait unaffected by tagging was individual body mass. Moderator variables that repeatedly influenced key trait effect sizes at both 95%, and more conservative 80%, CRIs were flying style, migration length and the weight of tag relative to body mass. In addition, attachment methods and device position were associated with effects on survival and reproduction. We found little evidence for a phylogenetic signal, suggesting that these conclusions are not simply a result of more closely-related species suffering similar impacts. There was also no evidence found of publication bias, and accounting for likely missing studies led to a slight strengthening of all effect sizes.

Standard meta-analysis models also identified a large degree of heterogeneity in both survival and reproduction. While high heterogeneity is expected in most ecological studies, our estimates of *I2*for survival and reproduction are similar to the median *I2* of 85% reported across ecology (Senior et al. 2016), and significant heterogeneity was reported by Constantini and Møller (2013) in their meta-analysis of geolocator effects. Heterogeneity was much lower in the case of body mass, parental care and foraging trip duration. In particular, the low *I2* seen in the meta-analysis of parental care suggest declines in parental care may reflect a conserved response across species (Senior et al. 2016); possibly as a means by which parents shift some of the costs of tagging onto their offspring (Mauck & Grubb Jr 1995).

In many studies the ratio of tag mass to body mass is frequently used to justify tag choice, taking precedence over other considerations such as tag shape or profile (Bowlin *et al.* 2010; Vandenabeele *et al.* 2012). Most studies adhere to either a 5% or 3% ‘rule’ when fitting devices. However, we found that negative effects upon survival, reproduction and parental care were apparent only when tags weighed more than 1% of species’ body mass. Thus, our results again do not support a ‘5% rule’ (Kenward 2001; Barron, Brawn & Weatherhead 2010), but also provide little evidence to support a ‘3% rule’ either (Phillips *et al*. 2004; Vandenabeele *et al.* 2012) as negative effects were apparent unless tag mass was <1% body mass. Assessing heavy devices is necessarily hampered by their rarity based on common sense and the longstanding adoption of the ‘5% rule’, meaning that <5% of all studies located in our literature search, and <1% retained for analysis, fitted devices even marginally above this threshold. However, given that proportional tag weight had no effect when fitted as a continuous variable, as well as the <1% threshold identified, it seems likely that relationships between tag mass and outcome will be non-linear. While there are sound ethical and scientific grounds for ensuring that the tags used are as small as possible (Casper 2009), we do not advocate 1% as the ‘new standard’, although it is clearly a desirable target. Rather, the use of biologgers should always be recognized as a tradeoff between the importance of the knowledge gained and the potential deleterious effects caused.

The negative effects of tagging on both survival and reproduction were more apparent in species with flapping flight. A broad categorization into ‘main flying style’ (*sensu* Watanabe 2016) revealed that flapping species were significantly affected by device attachment, a result not seen in soaring or flightless species. While the latter incorporated fewer studies, the lower energetic costs of soaring (between 2.5 – 9.5 times lower, Pennycuick 2008) may reduce the impact of tagging, and flightless species, i.e. penguins, likely benefit from the intensive work conducted on ensuring the streamlining of device profiles and optimal positioning (Wilson & McMahon 2006). Tagging was also negatively associated with survival (95% CRI) and reproduction (80% CRI) of species with longer migration distances. We did not find an effect of deployment duration, which in part may be due to a lack of clarity in reporting (Box 1). Nevertheless, these results suggest that particular caution and consideration be given to the choice of biologging device and attachment type in such species, and again highlights the tradeoff inherent in biologging studies.

Reduced survival of tagged birds was also related to specific attachment methods and positions of the device. Both harness and tailmount attachments were associated with negative effects on survival, and these results are also reflected in the negative positional effects of devices on the back and tail, the natural position for these attachment types. There was also a tendency towards reduced survival using ponchos and leg bands at a more conservative 80% CRI. Tail-mounted and poncho-based effects were based on small sample sizes and results should be treated with caution. However, harness and leg mounted designs are the most commonly used attachment methods (Tables S1, S2), with robust effect size estimates. Indeed, the negative mean effect size associated with harness attachments suggests that such a design may not always be appropriate, particularly for flapping species, despite their current widespread use. In contrast, declines in reproductive success were associated with collar attachments (and thus necessarily neck position). Negative impacts of neck collars may be expected given that basic identification collars can reduce survival (Weegman *et al.* 2016), and demonstrate the need for caution when using such attachments.

Importantly, our analyses highlight the potential for a cumulative effect of fitting tags. Multivariate meta-analysis revealed a positive correlation between mean effect sizes relating to survival and reproduction - such that if tagging produced deleterious effects on survival, it was also likely to hinder reproduction (Fig 3). Consequently, the impact of tagging may be greater than apparent in most studies, which typically focus on single responses.

The absence of any strong phylogenetic signal does suggest that, when tagging a species for the first time, using techniques previously employed on similar species is a practical approach (Sergio *et al.* 2015). However, evidence of some species-level variation in survival-based effect sizes after accounting for common ancestry signifies that caution is still required. In addition, given the low marginal R2 values reported for each of meta-regression models it is clear that other important moderator variables remain unidentified. These may relate to both biotic and abiotic effects including climatic influences, differences between specific study environments, and ecological differences at both inter- and intra-specific levels. For example, one could imagine that in harsh environmental conditions the effects of tagging are greater than in benign conditions. In addition, in many cases the exact age and previous life-history of tagged and control birds is unknown. Consequently, we cannot exclude the role of such unmeasured variables in contributing to heterogeneity in tagging effects between studies, but are necessarily constrained by the variables reported in the original studies.

We found few associations between moderator variables and effect sizes relating to body mass, parental care or foraging duration. Although Barron *et al.* (2010) reported that tagging led to reductions in body condition, we found little evidence to support this, a result also seen in a recent meta-analysis of tag effects (Møller & Costantini 2013). Small but significant declines in effect size with time are found in many research fields as a result of initial publication bias against non-significant findings (Jennions & Møller 2001), although we did not detect such a time trend in the current analysis (see Appendix). Both parental care and foraging trip duration mean effect sizes differed from 0 in our standard meta-analysis suggesting it is worthwhile monitoring both to assess tagging impacts. In contrast, the lack of an effect on body mass suggests that this may not be a particularly suitable measure for assessing the impacts of tagging.

While we have identified that, on average, there is a negative association between tagging and different life-history traits, given the numerous examples where the benefits gained from biologging are substantial, it is reassuring that effect sizes are generally small, allowing researchers to consider whether the likely negative impacts to individuals may potentially be offset by these gains. For example, working with declining or rare species may bring such ethical tradeoffs into particular consideration. However, biologging has brought huge advances in conservation biology including discovering unknown breeding locations (Rayner *et al.* 2015) and determining interactions with anthropogenic influences (Bodey *et al.* 2014), all of which have the potential to enhance environmental protection. Biologging has also improved our understanding of disease transmission (Bengtsson *et al.* 2016), nutrient transfer (Hussey *et al.* 2015) and the physiological capabilities of animals (Bishop *et al.* 2015).

Although we found limited effects of many moderator variables, our ability to detect effects was often hindered by the small sample sizes (and hence low power) involved when separating studies into categories. This also prevented us including potentially interesting interactions between variables. A key finding is, therefore, that the proportion of studies that provide the complete information necessary to assess the impact of the devices used, either within the published manuscript or associated appendices, remains small (just over one third). These omissions are easily remedied and we make a call for future studies to include this essential information (Box 1).

Assessing the impacts of fitting biologgers is a critical part of any tagging study, and omission of relevant data hinders assessment of whether identified survival rates (or other key life-history traits) are biased by the attachment of biologging or other marking devices (Barron, Brawn & Weatherhead 2010; Costantini & Moller 2013; Authier *et al.* 2013, Sergio *et al.* 2015). In addition, the importance of variables such as attachment type and position suggest that efforts to alleviate any negative effects of tagging need not focus solely upon fitting smaller, lighter tags. Although we have only analysed the impacts from studies on birds our results have ramifications for biologging studies on many other organisms. In this fast-moving field driven by both technology and scientific enquiry, it is crucial we have as comprehensive an understanding of the impacts of devices as possible. As such, we reissue the recommendation from previous reviews (Bowlin *et al.* 2010; Barron, Brawn & Weatherhead 2010) that all biologging studies should provide key information in order to facilitate meta-analyses such as those conducted here. This will ensure comprehensive comparisons can be undertaken, facilitating the dissemination of best practice and robust conclusions and generalisations, where applicable. The reporting of this key information (Box 1) will ensure that protocols can be improved rather than simply being transferred between species. Such recommendations can be updated as additional information is acquired from the exponentially increasing number of studies and species as device miniaturization continues.

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**Data Accessibility**

Meta-analysis data and information on phylogenies used available at the Dryad Digital Repository. DOI: doi:10.5061/dryad.0rp52.

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**Tables and Figures**

**Table 1**. Results from the random-effects meta-analyses on the effect of tagging across the five different key traits. Significant results are highlighted in bold. N is the number of effect sizes/ individual studies included for the relevant variable.

|  |  |  |  |  |
| --- | --- | --- | --- | --- |
| Variable | Mean Effect Size (*Zr*) | Lower 95% CRI | Upper 95% CRI | N effect sizes/ studies |
| Survival | **-0.064** | **-0.111** | **-0.019** | 140/ 103 |
| Reproduction | **-0.051** | **-0.10** | **-0.005** | 149/ 77 |
| Body Mass | -0.004 | -0.094 | 0.094 | 75/ 62 |
| Parental Care | **-0.13** | **-0.24** | **-0.025** | 50/ 27 |
| Foraging Duration | **0.13** | **0.004** | **0.264** | 37/ 28 |

|  |  |
| --- | --- |
| Data | Description & Extraction Rules |
| Organism Variables  |
| Body Mass (g) | We used the mean body mass recorded in the study or collated from the data if available. If this was not reported we used the species body mass from Dunning Jr (2008). If species were sexually dimorphic in size and study comparisons were reported separately we used this separation. If comparisons were merged we took a mean across the masses of the sexes. |
| Sex | Only males tagged, only females tagged or both sexes tagged |
| Age | Only adults tagged, only juveniles tagged or both adults and juveniles tagged |
| Flying Style | Flight mode of species studied. Defined as: Flapping, Soaring, both flapping and soaring, or flightless (Watanabe 2016) |
| Migration Strategy | Birds classed as long distance migrants, short distance migrants, partial migrants or non-migrants (Birdlife International 2016) |
| Device Variables |
| Device Mass | If study comparisons were separated by mass then we used this separation. If comparisons merged all data, then we took the mean device mass unless studies had < 10% of a heavier device type, where we took the modal device mass.  |
| Device Mass as % of Body Mass | This was calculated based on the combined or separated data as detailed above.  |
| Device Mass > 1% of body mass | Was device mass >1% of species body mass? Initially, tag weights were split into three categories: A) Tags <1% of the species body mass, B) Tags between 1% - 3% of species body mass, and C) Tags > 3% of species body mass. These values are common benchmarks cited in the tagging literature. However, we never found differences in the estimated effect size between categories B and C and so these were amalgamated into one category representing tags that were >1% of species body mass.  |
| Length of Deployment | We used the mean time length recorded in the study, or extracted from summary tables of individuals if available. |
| Statistical Data |
| How Tested | What statistical methods were used to test tag effects, e.g. Contingency table, means and standard deviations etc. |
| Within or Among Individual? | Data collected for body mass effect sizes only. Was effect of body mass assessed comparing across individuals or within individuals (change in mass). |

**Table 2.** Description of the moderator variables extracted during the literature search for consideration in meta-regressions models and details on how data on each was collected.

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**Figure 1.** Forest plot of the meta-analytic means looking at the effect of tagging across each of the meta-analyses conducted. Black points and lines represent estimates from the standard random effects meta-analysis. Red points and dashed lines represent effects sizes after correcting for potential missing studies identified via trim-and-fill tests.

1. Survival



1. Reproduction

**



**Figure 2**. Forest plots showing the effect of key moderator variables – tag attachment method, whether a tag weighed >1% of body mass and flying style on survival (a) and reproduction (b). N = number of effect sizes.



**Figure 3.** Correlation between survival-based and reproduction-based effect sizes estimated at the species-level via multivariate meta-analysis regression. Data points on plot are proportional to sample size per species (N survival effect size estimate + N reproduction effect size estimate).

|  |
| --- |
| **Box 1. Key Information Requirements for Assessing Device Impacts.** Questions remain about how to accurately assess the impact of the increasing range of biologgers deployed on wild animals. Meta-analysis provides one means of synthesizing results across studies but also highlights certain shortcomings: * It is critical to determine whether the return rates of tagged birds approximate those of untagged ones (Thaxter *et al.* 2016), yet this is infrequently reported.
* Relevant data can be only partially reported e.g. mean values without sd/SE, or results of AIC model selection with no indication of actual effect size.
* Deployment times are frequently difficult to determine, particularly when devices are attached for longer periods (months-years), and can be conflated with device failure time. This makes it difficult to ascertain any chronic impacts of tagging.
* Many biologging studies are observational rather than experimental, and may suffer from biases, particularly if devices need to be retrieved to collect data (Weiser *et al*. 2016). In addition, Authier *et al*. (2013) suggest that control individuals may not be comparable with tagged individuals as both may represent a non-random sample from the population and present a counterfactual study design to address this.

Consequently, we recommend all biologging studies should, at a minimum, provide clear information on:(1) Study Species(2) Number of devices deployed and individuals tagged (including all instances where the tags failed or individuals did not return)(3) mean mass of study individuals (4) method of attachment used in repeatable detail (5) mass of device(s) deployed (6) total length of tag deployment (particularly if different to the length required to address the specific questions analysed).  |