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Why discrepancies in searching the conservation biology literature matter

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ABSTRACT

Conservation biologists seek as much information as possible for evidence-based conservation actions, so they have a special concern for variations in literature retrieval. We assessed the significance for biological conservation of differences in literature retrieval across databases by comparing five simple subject searches in Scopus, Web of Science (WoS) (comparing two different subscriptions), Web of Science (Core Collection) (WosCC) (comparing two different subscriptions) and Google Scholar (GS). The efficiency of a search (the number of references retrieved by a database as a percentage of the total number retrieved across all databases) ranged from 5% to 92%. Different subscriptions to WoS and WoSCC returned different numbers of references. Additionally, we asked 114 conservation biologists which databases they used, their awareness of differing search options within databases and their awareness of different subscription options. The four most widely used databases were GS (88%), WoS (59%), WoSCC (58%) and Scopus (27%). Most respondents (≥ 65%) were unsure about specific features in databases, although 66% knew of the service GS Citations, and 76% agreed that GS retrieved grey literature effectively. Respondents' publication history did not influence their responses. Researchers seeking comprehensive literature reviews should consult multiple databases, with online searches using GS important for locating books, book chapters and grey literature. Comparative evaluations of publication outputs of researchers or departments are susceptible to variations in content between databases and different subscriptions of the same database, so researchers should justify the databases used and, if applicable, the subscriptions. Students value convenience over thoroughness in literature searches, so relevant education is needed.

1. Introduction

Conservation biologists, managers, policy-makers, administrators and funding agencies routinely search literature databases for scientific publications on specific topics, often for meta-analyses (Barral et al., 2015; Doerr et al., 2015; Hall et al., 2016), evaluating researchers' track records (Hodge and Lacasse, 2011), tracing networks of collaboration (Liu et al., 2011; Ji et al., 2014), prioritising subscriptions (Garfield, 2005) and testing impacts of hypotheses on fields of study (Kumar and Khormi, 2013, Kumar et al., 2015). Databases offer fast, cheap information retrieval and research metrics compared to searching hard copy or using peer review (Hodge and Lacasse, 2011; Buela-Casal and Zych, 2012), although there can be daunting logistic issues for large scale evaluations or hypothesis testing (D'Angelo et al., 2011). Nevertheless, online literature searches and bibliometrics – quantitative evaluations of research literature – are now established firmly as tools for many disciplines, including biological conservation.

Despite this growing popularity, little attention is paid other than by bibliometric specialists to errors and idiosyncrasies in individual databases that affect data retrieval and conclusions (Leydesdorff, 2007; Franceschini et al., 2016), or to difficulties in detecting grey literature (unpublished reports, internal documents and theses (Calver and King, 2000)) and books. For example, the Web of Science database only searches for terms in titles of papers published before 1990, but expands this to titles, keywords and abstracts for subsequent papers, an idiosyncrasy not found easily (Pautasso, 2014). This has led some to conclude mistakenly that literature in various fields expanded markedly since the early 1990s (e.g., Leuzinger and Hättenschwiler, 2013; Borrett et al., 2014), but that is partly a simple artefact of the increased search retrieval rate of Web of Science post-1990 (Pautasso, 2014). Contrastingly, Google Scholar scans the full text of papers pre- and post-1990, delivering less bias (Pautasso, 2014), which is ironic given the scathing evaluation of Google Scholar by Jacsó (2008a). Other idiosyncrasies exist: the Scopus database has only complete citation data for papers published since 1996 (although there is a project to extend the coverage earlier that has already made extensive gains) (Elsevier, 2015); Web of

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Science searches are sensitive to the year range of an institution's subscription and to the number and year range of subsidiary databases included (Thomson Reuters, 2016); and different databases may vary markedly in their literature retrieval of the same search term (Meho and Yang, 2007; Jacsó, 2005, 2011). Finally, although grey literature is a repository of vital data, it is often covered poorly in the major databases (Corlett, 2011), despite its importance in systematic reviews (Haddaway and Bayliss, 2015).

Limited research on these topics in the field of biological conservation identified poor coverage of relevant regional or non-journal literature in some databases (Stergiou and Tsikliras, 2006; Calver et al., 2011, 2013a, 2013b), and incomplete research profiles for individual researchers if only one database is used for assessment (Calver et al., 2013c). Assessments of subtler but potentially important topics such as variations in literature retrieval using different subscriptions or search options within the same database and conservation biologists' awareness of the limitations of different databases are yet to be made, although there are examples from other disciplines such as informetrics (Jacsó, 2006), neurology (García-Pérez, 2011), the sciences in general (Franceschini et al., 2015a) and manufacturing (Franceschini et al., 2015b).

We assessed the significance for biological conservation of differences in literature retrieval by comparing five simple subject searches in the widely used databases Scopus (main search and a secondary documents search), Web of Science, Web of Science (Core Collection) and Google Scholar. We predicted that: (i) the four databases would each recover unique references; (ii) given Scopus' broader coverage of regional journals and Google Scholar's coverage of books and book chapters, Scopus and Google Scholar would retrieve more references overall than Web of Science and Web of Science (Core Collection) when the search term involved regional rather than international literature; (iii) Scopus secondary documents and Google Scholar would retrieve grey literature and books absent from standard Scopus, Web of Science and Web of Science (Core Collection) searches; (iv) alternative subscriptions to Web of Science and Web of Science (Core Collection) would be substantially different, and (v) conclusions relating to the previous four predictions would be unchanged, irrespective of whether the search concerned a biological or sociological aspect of conservation.

Additionally, we canvassed a sample of conservation biologists to determine which databases they used, their awareness of differing search options within databases and their appreciation of the significance of different subscription options to well-known databases. We predicted that awareness of search options and the significance of different subscriptions would be low, with implications for the conclusions drawn from literature searches. Finally, we developed some recommendations as to how conservation researchers and practitioners may avoid identified biases in the future.

2. Methods

2.1. Selection of databases

We chose four widely used databases to test our predictions: Scopus, Web of Science, Web of Science (Core Collection) and Google Scholar. All except Google Scholar require a subscription. These databases are the subject of several comparative studies (e.g. Meho and Yang, 2007; Harzing and Alakangas, 2016), and are often used to evaluate researchers or fields of study, as well as undertake meta-analyses (e.g. Harzing and van der Wal, 2008; Jacsó, 2010; Côté et al., 2013).

Scopus is an Elsevier database, established in 2004 (Jacsó, 2005), covering many conventional journals, trade journals (intended for trade or professional readers, often not peer-reviewed and often without an editorial board) and conference proceedings (but only full papers, not abstracts). Originally, books and book chapters (excepting those within a named series) were excluded because of the range of publishers and languages and the diversity of citation styles adopted by authors (especially when chapters in edited books were involved). However, since mid-2013 Scopus includes books from over 30 publishers (Elsevier, 2014). Scopus also offers a 'secondary documents' search for retrieving documents not included in Scopus but cited by documents in the database (see Calver et al., 2013b for an application or the online tutorial at http://help.scopus.com/flare/Content/tutorials/sc_CitRefSearch.html?swfTarget=label03). The free access SCImago bibliometric site (http://www.scimagojr.com), based on Scopus data, lists 45 journals covering the topic of biological conservation.

Web of Science (WoS), known until January 2014 as Web of Knowledge (WoK), is published by Thomson Reuters. It covers books, journals and conference proceedings. Although known as a single database, it actually comprises several distinct specialist subsidiary databases, each of which can be searched individually. Institutional subscriptions vary in their inclusion of subsidiary databases and in years covered. Subsidiary databases can be searched simultaneously by selecting the 'search all databases' tab on the search page (Testa, 2006). Coverage of subsidiary databases is in a dropdown menu on the search page, sometimes accompanied by warnings if the subscription is not up to date.

Web of Science Core Collection (WoSCC) is the well-known specialist database within WoS that was called Web of Science with Conference Proceedings prior to January 2014. It covers journals, conference proceedings and books, with a bias to the sciences (Jacsó, 2011). For inclusion, publications must meet Thomson Reuters' rigorous selection criteria (Testa, 2006). Sometimes this leads to gaps in coverage of regional literature, of publications from the social sciences and humanities, and of publications lacking at least an English abstract (Harzing and van der Wal, 2008). Thomson Reuters' Journal Citation Reports, which list bibliometric data for the journals covered in WoSCC, list 49 journals in their Biodiversity Conservation category, similar to "biological conservation" used by Scopus.

Strictly, Google Scholar (GS) is a search engine, not a database (Franceschini et al., 2016). GS uses web-crawling algorithms to gather publication details and covers journals, books, book chapters, conference proceedings, grey literature, theses and blogs. Harzing and van der Wal (2008) see its free availability and wide searching as major advantages, while detractors highlight poor specification of the scope of GS searches and errors in data retrieval (Jacsó, 2008b, 2009, 2010). There is also the possibility of fraudulent manipulation (Labbé, 2010; López-Cózar et al., 2012). Franceschini et al., (2016, p. 174) concluded "that most consider GS simply as a search engine, certainly not a serious bibliometric database." We refer to GS as a database for simplicity, but acknowledge its uniqueness and academic limitations.

2.2. Selection of search terms and searching procedures

Initially, we ran four simple searches in each database, based on the following key words: "dugong" & "Australia", "waterbirds" & "Australia", "polychaetes" & "Australia", and "koala" & "Australia". The different organisms were chosen to give taxonomic and environmental diversity with conservation relevance, while "Australia" was included to assess the significance of regional literature. In Scopus, we ran a standard search but additionally examined the secondary documents (those that are not included in Scopus but are cited by documents in Scopus, see Calver et al., 2013b). The WoSCC and WoS databases were searched at the University of Sydney (New South Wales, Australia) as well as Murdoch University (Perth, Western Australia) to test for effects of different subscriptions. WoSCC at the University of Sydney extended back to 1900 compared to 1974 at Murdoch University; while the WoS subscription at the University of Sydney included more component databases than Murdoch University's subscription. GS searches were conducted using Publish or Perish (PoP) freeware for automating searches in GS and outputting the results in .csv files for analysis in Excel (http://www.harzing.com/pop.htm). Each PoP search returned many hits (> 10,000), so a subset of the 1000 most highly cited was selected for comparing the outputs of the selected databases.

Searches were completed between April and December 2014, with all records dated after 31st December 2013 discarded to ensure comparability of the date range of searches. We did not specify a starting date for searches because we deliberately wanted to accentuate the differences caused by differing date ranges in databases and subscriptions.

The above searches were taxonomically focused and included a regional term, so in August 2016 we complemented them with a further search for "wildlife tourism" that addressed the social context of conservation and had no regional search term. Given the later date of this search the subscription to WoS and WoSCC at Murdoch University had changed to be much closer to the University of Sydney subscription, so the "wildlife tourism" search was done only within WoS (Sydney), WoSCC (Sydney), Scopus and GS.

2.3. Survey of conservation biologists

Conservation biologists' use of literature databases in general and awareness of features of the widely used Scopus, GS, WoS and WoSCC were assessed via an online survey (Online Appendix 1). First, respondents were asked to indicate their awareness and use of 18 databases, with opportunities to indicate others that they used. They then indicated whether 15 statements about features of Scopus, GS, WoS and WoSCC were True, False, or if they were unsure (questions, with answers, are in Online Table A1). Other questions sought demographic data about the respondents, including information on their publication history and whether or not English was their first language, both points that might influence their use of databases.

The survey 'population' was derived from two sources. The primary source was from the Society for Conservation Biology, Oceania Section (SCB Oceania), which includes all society members, many lapsed members and other ad hoc addresses. Biologists were notified of the survey and could respond to the questionnaire using appropriate links provided by the Society's listserver; (RTK has access as an officer of SCB Oceania). The second source was derived by searching, in November 2015, the Scopus database for all publications with a 'source title' of 'biological conservation' in the year 2014. This retrieved 362 entries, mainly to papers published in *Biological Conservation*, but also to chapters from books with 'biological conservation' in the title. We emailed an invitation to complete the survey to the 795 authors of these publications whose contact emails were provided in their publications.

2.4. Search retrieval comparisons and data analysis

2.4.1. Comparison of outputs from different searches

The search results from the four primary database sources were initially saved as Excel spread sheets. Column headings and data types were standardised, then imported into an Access® database. Detailed descriptions of the processing of these data are given in Online Appendix 2. We expressed the commonality between searches in different databases as 'efficiency', the number of references retrieved by a database for a search as a percentage of the total number retrieved.

2.4.2. Survey responses

Respondents' knowledge and use of the different databases mentioned were tabulated, and other databases they mentioned listed. GS, WoS, WoSCC and Scopus were most known and used (ranging from 27% of all responses for Scopus to 88% for GS), so we also used Generalized Linear Models (GLMs) to determine if respondents' publication histories (10 or less, 11–30, 31–50 or > 50 peer reviewed publications) and first language (English or not) predicted their use or not of GS, WoS, WoSCC and Scopus. We decided against using age as a predictor because the ages of respondents correlated significantly with the midpoints of the publication intervals (Spearman rank correlation = 0.64, $p < 0.05$). Significance values for the comparisons were set using the sequential Bonferroni correction (Quinn and Keough, 2002, p. 50), given the four databases involved.

In addition to describing responses to the 15 statements about features of Scopus, GS, WoS and WoSCC, we also used GLMs to determine if respondents' publication history and first language predicted their response to each statement. Most respondents chose one category (True, False or Unsure) for each item, complicating attempts to predict responses from publication history or first language because of small or empty cells in the response variable if the three categories were used. Therefore we used a binary dependent variable with options of Unsure or True/False combined. This assessed whether the predictors influenced respondents' confidence in assessing each item, rather than whether or not they answered correctly. Significance values for the comparisons were set using the sequential Bonferroni correction, given the 15 statements involved. All analyses used Statistica Version 7 (Statsoft, 2006).

3. Results

3.1. Outputs from different searches

3.1.1. Distinctiveness of the retrieval by the different databases

Our prediction that each of the four databases (excluding Scopus secondary documents) would retrieve numerous unique references was affirmed, with the highest efficiency observed being 92% for the "waterbirds" & "Australia" GS search. Only five of the other 27 searches had > 50% efficiency (Table 1). Representing the publications visually, only 35 results were in common across the databases for waterbirds, 71 for dugongs, 67 for polychaetes, 249 for koalas and 53 for wildlife tourism (Fig. 1).

3.1.2. Scopus and GS versus WoS and WoSCC

As predicted, GS retrieved more references than Web of Science and Web of Science (Core Collection) for all four searches (> 10,000 each time, with only the top 1000 by citations shown) (Table 1, Fig. 1). Even the top 1000 figure was greater than any other database for all searches except koalas, where WoS (Sydney) retrieved 1436 references. Although we expected a similar result for Scopus, Scopus did not retrieve more references than WoS and WoSCC (both Murdoch and Sydney), except for the 'waterbirds' search. To test if this result would change if the focus was only on the most highly cited papers, we looked at the 20 most highly cited papers for the search term "dugong" & "Australia" in GS, Scopus, WoS (Sydney) and WoS (Murdoch). GS had 16 unique entries in its top 20, Scopus 10, WoS (Sydney) 1 and WoS (Murdoch) 0. Nine of the 16 unique entries in GS were for books or book chapters, reflecting the poor coverage until recent years of the book literature in Scopus and WoS.

3.1.3. Retrieval of grey literature

The large numbers of references retrieved in each search by GS included books, book chapters, theses, reports and papers in minor journals, not covered in other databases. Similarly, references retrieved in Scopus secondary documents searches included examples of all these categories of references, as well as mis-citations of references actually included in Scopus. While secondary documents searches were not as efficient as GS in retrieving grey literature and book literature, they did broaden the range of literature retrieved. There were far more secondary documents for the koala search (920) than any other search, with the closest being wildlife tourism (510) (Table 1).

3.1.4. Effects of subscription specification

As predicted, the Sydney subscriptions to WoS and WoSCC returned more references than the Murdoch subscriptions (Table 1). This reflects the increased chronological coverage in Sydney and the increased range of subsidiary databases included in the Sydney WoS subscription. However, the differences were not marked, especially for WoSCC.

Table 1
Total number of unique references retrieved from each database for each of five separate searches (i.e. after removal of duplicates).
The numbers in parentheses represent Efficiency[d].

Data source	Search terms				
	"Dugong" + "Australia"	"Koala" + "Australia"	"Polychaetes" + "Australia"	"Waterbirds" + "Australia"	"Wildlife tourism"
Total number of references[a]	1151	2105	1416	1063	1051
Number of references common to the four primary databases	71	249	67	35	53
Web of Science (Sydney)	324 (28%)	1436 (68%)	543 (38%)	165 (16%)	186 (18%)
Web of Science (Perth)	234 (20%)	1214 (58%)	457 (32%)	111 (10%)	
Web of Science Core Collection (Sydney)	140 (12%)	798 (38%)	248 (18%)	50 (5%)	97 (9%)
Web of Science Core Collection (Perth)	126 (11%)	785 (37%)	238 (17%)	49 (5%)	
Google Scholar[b]	963 (84%)	933 (44%)	967 (68%)	981 (92%)	948 (90%)
Scopus	134 (12%)	683 (32%)	232 (16%)	65 (6%)	135 (13%)
Scopus secondary documents[c]	54	920	113	12	510
Mean efficiency	28%	46%	31%	22%	32%

[a] References retrieved by searches from Perth Web of Science databases were excluded from this total so as to avoid double-counting those that also came from the Sydney collection (both were based on the same search terms). Scopus Secondary Documents were also excluded.
[b] Only the top 1000 (by citations) of hits in Google Scholar were analysed. After removal of duplicates < 1000 unique references remained.
[c] No attempt was made to remove duplicates from Scopus secondary documents.
[d] The 'Efficiency' of each data source varies with the different search terms and is shown by the number of references retrieved for a data source as a percentage of the total number retrieved.

3.1.5. Duplicate returns

All databases searched suffered from the multiple listing of the same reference in at least some of the searches. For Scopus, the percentage of duplicates ranged from 0.0% to 1.7%, for GS 1.4–3.3%, for WoS (all locations) 2.1–9.1%, and for WoSCC (all locations) 0.0–0.8% (Table 2).

3.1.6. Effects of search topic and inclusion of regional terms

The pattern of low overlap between the references retrieved by the different databases appeared irrespective of whether or not the search term included a regional term, or whether it was taxonomically or socially focused. The efficiency for the wildlife tourism searches (9%–90%) was very similar to the range from the taxonomic search terms (5%–92%) (Table 1).

3.2. Conservation biologists' survey responses

Twenty-seven respondents (24%) were from SCB (Oceania) and 87 (76%) were authors who had published in *Biological Conservation*. Response rates, defined as the number of people responding divided by the number approached (less any requests returned as undeliverable)

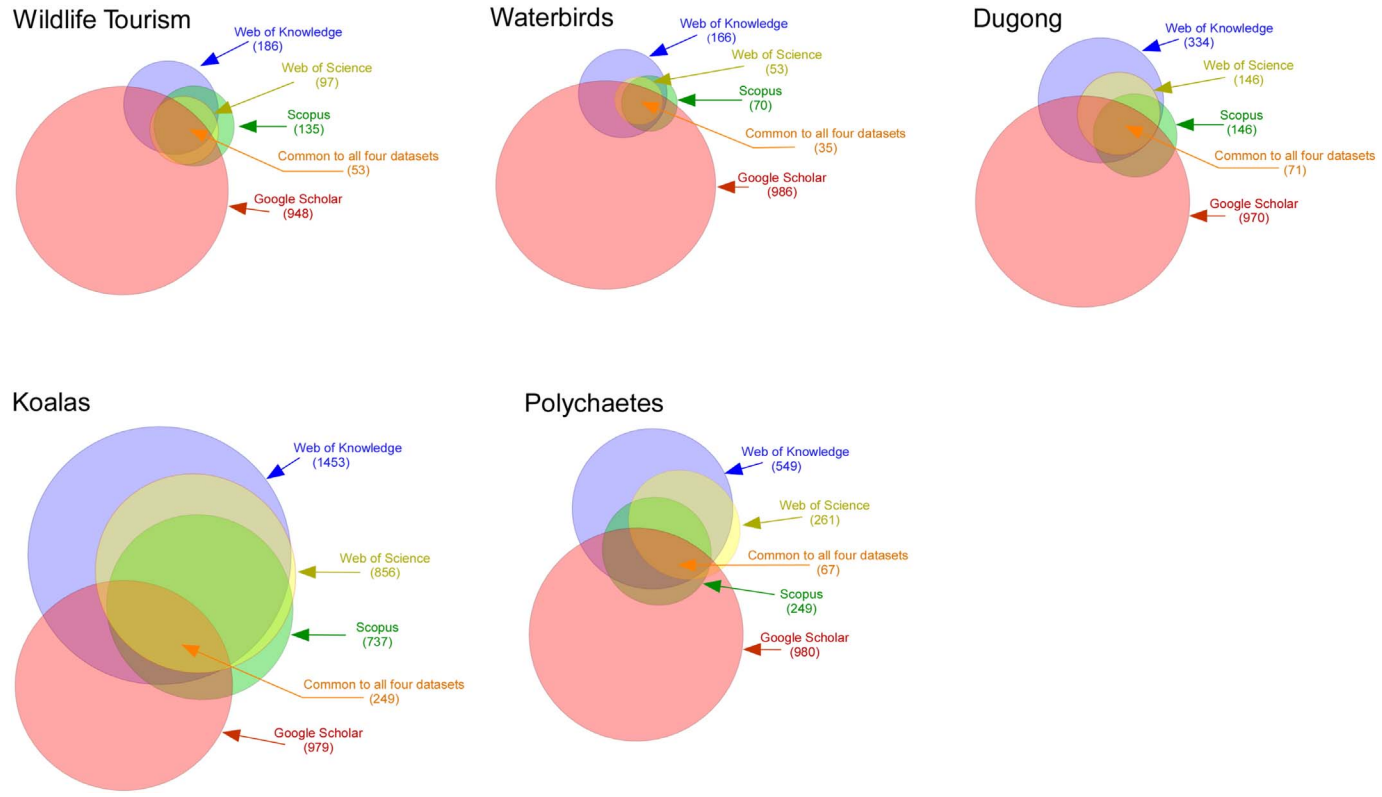

Fig. 1. Comparison of search results based on the search terms as per column headings in Table 1, from the four primary bibliographic data sources (WoS (Sydney), WoSCC (Sydney), Scopus and Google Scholar). The two-dimensional simplification of a multidimensional relationship shows the total number of retrieved references and indicates the degree of overlap between them.

Table 2
Proportion of duplicates returned measured as the number of duplicate references over the cumulative total number of references retrieved across the four taxonomic search terms and the wildlife tourism term (as in the column headings of Table 1).

Source and search term	Number of records	Number of duplicates	Percentage of duplicates
Google Scholar - “dugong” + “Australia”	1000	30	3.0%
Google Scholar - “koalas” + “Australia”	1000	21	2.1%
Google Scholar - “polychaetes” + “Australia”	1000	20	2.0%
Google Scholar - “waterbirds” + “Australia”	1000	14	1.4%
Google Scholar - “Wildlife tourism”	980	32	3.3%
Scopus - “dugong” + “Australia”	148	2	1.4%
Scopus - “koalas” + “Australia”	750	13	1.7%
Scopus - “polychaetes” + “Australia”	249	0	0.0%
Scopus - “waterbirds” + “Australia”	70	0	0.0%
Scopus - “wildlife tourism”	135	0	0.0%
Web of Science (Perth) - “dugong” + “Australia”	253	6	2.4%
Web of Science (Perth) - “koalas” + “Australia”	1330	61	4.6%
Web of Science (Perth) - “polychaetes” + “Australia”	515	16	3.1%
Web of Science (Perth) - “waterbirds” + “Australia”	118	3	2.5%
Web of Science (Sydney) - “dugong” + “Australia”	347	13	3.7%
Web of Science (Sydney) - “koalas” + “Australia”	1555	102	6.6%
Web of Science (Sydney) - “polychaetes” + “Australia”	604	55	9.1%
Web of Science (Sydney) - “waterbirds” + “Australia”	172	6	3.5%
Web of Science - “wildlife tourism”	190	4	2.1%
Web of Science Core Collection (Perth) - “dugong” + “Australia”	133	1	0.8%
Web of Science Core Collection (Perth) - “koalas” + “Australia”	843	5	0.6%
Web of Science Core Collection (Perth) - “polychaetes” + “Australia”	251	0	0.0%
Web of Science Core Collection (Perth) - “waterbirds” + “Australia”	52	0	0.0%
Web of Science Core Collection (Sydney) - “dugong” + “Australia”	147	1	0.7%
Web of Science Core Collection (Sydney) - “koalas” + “Australia”	860	4	0.5%
Web of Science Core Collection (Sydney) - “polychaetes” + “Australia”	261	0	0.0%
Web of Science Core Collection (Sydney) - “waterbirds” + “Australia”	53	0	0.0%
Web of Science Core Collection - “wildlife tourism”	97	0	0.0%

were 6% and 12% respectively. Mean ages were similar between both groups of respondents ($t_{(112)} = 1.64$, $p = 0.86$), as were the relative proportions of men and women (Fisher exact test, $p = 0.08$). However, the authors from *Biological Conservation* were more likely to have published many papers than SCB Oceania respondents (Fisher exact test, $p = 0.01$). Given the small sample size for respondents from SCB (Oceania), all respondents were combined for further analyses.

Language may have been a problem in responses from authors whose first language was not English, so this potential bias was assessed for authors from *Biological Conservation*, using the country domain in the email address as an indication (admittedly inexact) of whether or not the first language was likely to be English. Using the categories of Australia, United States of America, United Kingdom, other English speaking countries and all non-English speaking countries combined there was no association between the country of respondents and the distribution of these countries in the survey invitations (chi-squared, 4 df = 4.1, $p = 0.39$); responses were unrelated to country of residence (and presumably first language).

Two thirds (66.7%) of respondents were male. We did not know the gender of people invited to participate, so we cannot tell if the gender-bias in the responses simply followed the gender ratio among all invitees. The mean age for male respondents was 45.8 (range 27–67) and for females 40.2 (range 28–74). Respondents came from 29 countries, mainly the United States (31), Australia (21) and the United Kingdom (7). Nearly two-thirds (63%) spoke English as a first language. Publication histories were evenly spread with 30% having fewer than 11 peer-reviewed publications, 30% 11–30, 12% 31–50, and 29% over 50.

All respondents knew of GS with 88% using it often, far higher than the next most popular database (WoS, 59%). WoSCC (58%) and Scopus (27%) were the next most well known and used (Table 3). Publication history did not influence respondents' use of any of these four databases, but respondents with English as a first language were significantly more likely to use GS (Wald statistic 6.6, df = 1, $p = 0.01$, odds ratio 5.5).

Respondents reported using 31 databases other than the ones listed in our survey (although they interpreted databases very loosely – some respondents included their colleagues or library catalogues). Researchgate (9 respondents) and PubMed (4 respondents) were the most common.

Respondents were generally unsure about the 15 questionnaire statements regarding GS, WoS, WoSCC or Scopus (65% or more unsure), except for two items regarding GS: 66% knew of the service Google Scholar Citations, and 76% agreed that GS was effective at retrieving grey literature (Table 4). Publication history did not influence respondents' surety for any statement. Respondents with English as a first language were significantly more likely to be unsure that WoSCC offered users the option of a unique ID (Wald statistic 8.6, df = 1, $p < 0.01$, odds ratio 4.3), and more likely to be unsure that WoS offered the opportunity to correct an error in the database (Wald statistic 8.4, df = 1, $p < 0.01$, odds ratio 11.2). Non-significant results are reported in Online Table A2.

4. Discussion

4.1. Searches

In common with other studies we found that Scopus, WoS, WoSCC and GS returned quite different results from the same searches (Meho and Yang, 2007; Sarkozy et al., 2015; Harzing and Alakangas, 2016). The average efficiency across all databases for a search term was greatest in koalas (an endemic species) (46%). Average efficiencies were lowest for waterbirds (22%) and dugongs (28%). The outcome is likely a combination of the effects of Scopus' incomplete records prior to 1996 at the time of our searches, journal selectivity in WoSCC and inclusion of substantial grey literature in GS. Using the social search term “wildlife tourism” rather than a taxonomic term and excluding the regional search term “Australia” did not change the conclusion of different results from different databases, nor did restricting the search to the most highly cited references in each database.

Table 3
Conservation biologists' knowledge of and use of 18 databases, based on 27 respondents (24%) from SCB (Oceania) and 87 (76%) from authors who had published in *Biological Conservation* in 2014.

Answer options	I know of this database but do not use it	I know of this database but rarely use it	I know of this database and often use it	I do not know of this database	Response count (maximum 114)
ASFA (aquatic sciences and fisheries abstracts)	19	6	3	80	108
Biological abstracts	39	40	7	26	112
Biosis citation index	31	23	2	55	111
Biosis previews	27	18	0	65	110
CAB abstracts	32	14	2	61	109
Chinese science citation index	9	1	0	100	110
Conference proceedings citation index	10	9	0	91	110
Current contents connect	26	16	3	65	110
Derwent innovations index	6	0	0	102	108
FSTA (food science and technology abstracts)	6	0	0	103	109
Google Scholar	1	13	100	0	114
Inspec	5	2	0	102	109
Medline	41	22	5	40	108
SciELO Citation index	16	5	11	79	111
Scopus	29	36	30	17	112
Web of Science (all databases)	12	25	66	9	112
Web of Science Core Collection	14	27	64	6	111
Zoological record	30	28	6	45	109

Mongeon and Paul-Hus (2016) concluded that Scopus and WoS shared heavy biases to the natural and biomedical sciences, as well as engineering, and to publications in English. However, coverage still varied strongly between them. Our finding that GS retrieved a much broader range of literature than Scopus, WoS or WoSCC is also more widely supported. Meho and Yang (2007) found GS excellent for searching conference proceedings, Hilbert et al. (2015) found GS retrieved references from a wider range of journals than WoS or Scopus, and Harzing and van der Wal (2008) recommended GS for searching books, book chapters, conference proceedings and publications in languages other than English. We found that the secondary documents function in Scopus returned many references in addition to a main Scopus search, so it may have a similar value to GS in locating publications outside the mainstream journal literature that nevertheless document details of biology or management important to conservation practitioners (Calver et al., 2011).

The increased search range of GS comes at a cost in ease of analysing search results. Adriaanse and Rensleigh (2013) reported a high degree of duplication in the output of searches in GS, while Meho and Yang (2007, p. 205) noted that the time to "clean" their literature searches took twice as long for Scopus than for WoS, while GS took 30 times as long as WoS – 100, 200 and "a grueling 3000 h" respectively. If Publish or Perish (PoP) is used for searching in GS, the free, web-based utility CleanPoP (Baneyx, 2008) imports the comma-separated values (.csv) output from PoP and, after questioning regarding target authors and incomplete publications, deletes questionable records and combines duplicate entries. However, this approach is most suitable when the search is for an author, not a subject, and Calver et al. (2013a, 2013b, 2013c) reported that some legitimate papers identified in the original PoP output may disappear after running CleanPoP. Although we did not keep records, our subjective assessment is that we also invested more time in cleaning GS files, although our problems were more with formatting than duplication. This may be because we used only the top 1000 references by citations and hence lost a long "tail" of infrequently cited or uncited references that might simply be mis-cited duplicates of more highly cited entries, or publications of questionable

Table 4
Responses to 15 statements regarding the widely used databases Scopus, Google Scholar (GS), Web of Science (WoS) and Web of Science Core Collection (WoSCC).

Statement	True	False	Unsure	Response count (maximum 114)
GS is effective at finding both scientific 'grey literature' (e.g. government reports, conference presentations, theses) and peer reviewed literature	87	9	18	114
Even if a journal is indexed in Scopus, Scopus may not include all papers published in that journal prior to 1996	25	0	89	114
WoSCC offers a range of subscriptions that vary in how far back they extend in time	38	2	73	113
WoS subscriptions always include the same component databases	9	9	95	113
GS citation data can be manipulated fraudulently	12	14	88	114
GS offers a service called Google Scholar citations	75	1	38	114
Scopus can retrieve citations to documents not in Scopus by documents that are in Scopus using a secondary documents search	4	0	108	112
Scopus offers researchers a unique researcher ID	28	4	82	113
WoSCC can retrieve citations to documents not in WoSCC by documents that are in WoSCC using a cited reference search	23	4	84	114
WoSCC offers researchers a unique researcher ID	24	3	84	114
WoS offers researchers a unique researcher ID	26	5	81	113
GS permits users to request a correction for an incorrect entry	24	5	84	113
Scopus permits users to request a correction for an incorrect entry	15	0	97	112
WoS permits users to request a correction for an incorrect entry	13	1	98	112
WoSCC permits users to request a correction for an incorrect entry	14	1	97	112

relevance to the search. If the aim is to find as many relevant papers as possible, then the cost of recording reference details in GS may be more than offset by the value of finding a key reference. However, in fields with a rich literature the task may be overwhelming. Secondary documents searches in Scopus are equally messy, including multiple entries for the same publication that must be identified and aggregated (Calver, 2015).

Whether the differences we found between our search results from WoS and WoSCC based on the different subscriptions in Murdoch and Sydney are substantial enough to cause concern will depend on the purpose of the study. People working collaboratively across institutions might need to be aware of the differences. We summarise strengths, weaknesses and idiosyncrasies of the four databases in Online Table A3.

4.2. Conservation biologists

The respondents to our survey used diverse techniques to locate relevant literature. We found no statistically significant association between their publication achievements and their tendency to use a particular database, nor did publication frequency predict their confidence in responding to particular statements about individual databases, so there is no evidence that differences in literature searching techniques are associated with publication success.

GS was the best-known and most widely used database, which is to be expected given GS's recognised value as a search engine (Franceschini et al., 2016). Speed and convenience are the primary drivers for students using online searches (Markland, 2005), and the same may be true for conservation professionals, especially given the preference of libraries for electronic subscriptions. If searches use the freeware Publish or Perish results can be downloaded and sorted by citations to identify highly cited papers, which may be an indication of reliability but with problems of its own, including the low ranking of recent publications and a likely bias to reviews, which often attract higher citations (Calver and Bradley, 2010).

The extensive use of GS offers significant benefits and possible risks. The greatest benefit is the increased likelihood of finding regional literature or grey literature (Stergiou and Tsikliras, 2006), as well as books and book chapters (Calver et al., 2013b, 2013c). WoS has only included book citation details since 2011, covering the previous five years (Testa, 2012). Scopus decided originally not to list books and book chapters (excepting books in a named series) (Calver et al., 2013b), but changed this policy (Elsevier, 2014). Scopus and WoSCC offer specialist searches ('secondary documents' function and 'cited reference search' respectively) that find books and book chapters (Calver et al., 2013b, Calver, 2015), but they only find sources that have been cited by items in the respective databases. Additionally, Van Dijck (2013) highlights GS's ability to find exact text within a document.

There are also significant disadvantages in using GS: it returns many hits for general subject searches and ranks on 'popularity' (based on linkages from other sites online). Users often only consider the top 10 items displayed on the first output page, whose appearance does not reflect scholarly relevance (Van Dijck, 2013). Researchers can thus miss important references (Markland, 2005), with potential bias towards popular or highly cited publications (Evans, 2008; Bar-Ilan, 2008). We also were inevitably biased in selecting the top 1000 GS hits by citations for our analyses.

While our respondents knew of and used GS, they were largely unsure about whether or not GS can be manipulated fraudulently and whether or not users can request corrections. GS is susceptible to fraud. Labbé (2010) created a fictitious researcher and elevated him to high levels of citations, while López-Cózar et al. (2012) raised their citation counts by placing fraudulent documents online to be detected by web-crawlers. Additionally, Van Dijck (2013) refers to techniques to increase the online links or click records for specific documents to elevate their position in online searches. Users can delete an incorrect entry from their own profiles, but they cannot change the content of an individual entry in GS.

Such uncertainties were also reflected in understanding of WoS, WoSCC and Scopus. Respondents were unsure about options for unique researcher IDs, advanced literature search techniques, ranges of coverage and the opportunity to make corrections. Most of these points relate to the presentation of an individual's personal profile in the databases, with potential for career advancement (i.e. promotions or grant applications). Uncertainty about the range and period of coverage of a database can affect literature reviews for meta-analysis, or comparative studies of the research outputs of individuals or departments.

4.3. Implications

Given the varying results of searches in the different databases, we conclude that researchers seeking comprehensive reviews of the literature should consult multiple databases, not just one (Bar-Ilan, 2008, 2010; Walters, 2011; Tripathi and Garg, 2014). Online searches using GS are important to locate books, book chapters and grey literature. Subscription databases such as WoS and Scopus may be inadequate on their own. There are valuable protocols for systematic literature searches, which detail methods to find and screen literature before selection of studies for detailed examination or meta-analysis (Moher et al., 2014; Stewart et al., 2013; Barral et al., 2015).

We are particularly concerned about database searches used for comparative evaluations of researchers or departments (Calver et al., 2013b), or tracing patterns of collaboration among researchers or the historical development of fields of research (Borrett et al., 2014; Ji et al., 2014; Boix et al., 2015). Demonstrated biases in the databases mean that it is important for researchers to document and justify the databases they use, including the subscription (i.e. WoS and WoSCC). Substantial duplicate records (over 9% in some of our searches) mandate caution when using bibliographic metrics for comparing citation rates or defining fields of interest. Universal use of a comprehensive DOI (Digital Object Identifier) system will facilitate identification and aggregation of duplicates, and alleviate many future problems in bibliometric analyses.

Finally, there are implications for education. If students value convenience over thoroughness in their literature searches and miss key papers (Markland, 2005; Van Dijck, 2013), then teaching techniques for online searching should be part of the curriculum for students of biological conservation, as has been advocated more broadly (Ettinger, 2008; Exner, 2014). Students searching in subscription databases such as WoS or Scopus will, at least, locate peer-reviewed literature where they can be confident in their findings. Online searches will find dubious sources as well as valuable ones, so skills in identifying authoritative publications are important (Van Dijck, 2013).

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Appendix A. Supplementary data

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