Do organisms need an impact factor? Citations of key biological resources including model organisms reveal usage patterns and impact.

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Abbreviations:

AGSC - Ambystoma Genetic Stock Center (RRID:SCR_006372) DOI - Digital Object Identifier EXRC - European Xenopus Resource Center (RRID:SCR_007164) MMRRC - Mutant Mouse Resource and Research Center (RRID:SCR_002953) MOD - Model organism database (the genomic authority for the animal) NIH - National Institutes of Health NHPRR - Nonhuman Primate Reagent Resource (RRID:SCR_012986) NXR - National Xenopus Resource (RRID:SCR_013731) PID - Persistent Identifier PMID - PubMed Identifier (RRID:SCR_004846) PMCID - PubMed Central Identifier (RRID:SCR_004166) RRID - Research Resource Identifier (RRID:SCR_004098) ZIRC - Zebrafish International Resource Center (RRID:SCR_005065)

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Abstract

Research resources like transgenic animals and antibodies are the workhorses of biomedicine, enabling investigators to relatively easily study specific disease conditions. As key biological resources, transgenic animals and antibodies are often validated, maintained, and distributed from university based stock centers. As these centers heavily rely largely on grant funding, it is critical that they are cited by investigators so that usage can be tracked. However, unlike systems for tracking the impact of papers, the conventions and systems for tracking key resource usage and impact lag behind. Previous studies have shown that about 50% of the resources are not findable, making the studies they are supporting irreproducible, but also makes tracking resources difficult. The RRID project is filling this gap by working with journals and resource providers to improve citation practices and to track the usage of these key resources. Here, we reviewed 10 years of citation practices for five university based stock centers, characterizing each reference into two broad categories: findable (authors could use the RRID, stock number, or full name) and not findable (authors could use a nickname or a common name that is not unique to the resource). The data revealed that when stock centers asked their communities to cite resources by RRID, in addition to helping stock centers more easily track resource usage by increasing the number of RRID papers, authors shifted from citing resources predominantly by nickname (~50% of the time) to citing them by one of the findable categories (~85%) in a matter of several years. In the case of one stock center, the MMRRC, the improvement in findability is also associated with improvements in the adherence to NIH rigor criteria, as determined by a significant increase in the Rigor and Transparency Index for studies using MMRRC mice. From this data, it was not possible to determine whether outreach to authors or changes to stock center websites drove better citation practices, but findability of research resources and rigor adherence was improved.

Introduction

Stock centers serve as both archives and distribution centers of research animals, materials, data, and information. Stock centers ensure resource availability and accessibility to the scientific community. These centers typically confirm identity, verify genetics, maintain viability, and certify the health status of their holdings. In one case, the AGSC stock center maintains one of the last large colonies of *Ambystoma mexicanum*, a species that once thrived in aquatic habitats that are now dwindling near present day Mexico City. Because there may not always be a good profit margin in selling biologically important research animals, stock centers are typically funded by grants while recovering some of their operating costs by distribution fees. Resource centers such as the Nonhuman Primate Reagent Resource (NHPRR) or the Developmental Studies Hybridoma Bank (DSHB) which provide antibodies are also primarily grant funded and are therefore under similar pressures. Unlike commercial firms, which maintain only commercially viable common stocks, the mechanism of funding for stock and resource centers necessitates that they track the biological and translational impact to maintain funding, like other grantees. Research resources like these are the workhorses of biomedicine,

enabling investigators to study specific disease conditions (see Kiani et al, 2022; Bergen et al, 2022; Garcia-Garcia, 2020). However, while grantees generally can use citation indexes to track impact, stock centers have to manually track the use of their research resources.

The purpose of RRIDs is primarily to serve investigators as a means to ensure that they, or their readers, will easily find the exact research resources used in a study (Bandrowski et al, 2015; Marcus et al, 2016; Bandrowski, 2022). For rigor and transparency reporting standards that cover research resources such as the ARRIVE, MDAR, and JATs have also incorporated RRIDs as part of their recommendations for better reporting practices for research resources (Percie du Sert et al, 2020; Macleod et al, 2021; <u>NISO JATS Ver 1.2</u>). However, for resource providers these identifiers are also a means to track the usage of resources throughout the scientific literature. Indeed, the role of SciCrunch is to both encourage the use of RRIDs and via a contract from NIH to track usage of research resources. Stock centers have promoted the use of RRIDs to varying degrees starting around 2016-2020 through listing them on their websites and encouraging good citation practices within their communities. Most stock centers encourage authors to use RRIDs in more than one way and there are often sustained campaigns over several years encouraging their use in addition to the more visible changes to the stock center website.

In this study, we sought to determine whether efforts of resource centers to promote use of RRIDs and good citation practices for research resources improve the citation practices and overall transparency of published papers by their respective communities. We measured the citation practices of the research community for five university-based resource providers over a period of 10 years spanning the period before and after RRIDs were introduced and evaluated the ease with which automated routines could identify the organism or reagent used.

Methods

NIH Office of the Director funded organism stock centers:

Mutant Mouse Resource and Research Center (<u>MMRRC</u>), National Xenopus Resource (<u>NXR</u>), Ambystoma Genetic Stock Center (<u>AGSC</u>), Zebrafish International Resource Center (<u>ZIRC</u>)

For this study, curators collected publications from Google Scholar that were published between Jan 1, 2011 and Dec 31, 2022 and contained keywords relevant to the OD-funded stock centers NXR, AGSC, or ZIRC. Pubmed Central (PMC) open-access publications were used to collect publications that mentioned MMRRC. PMC was used to search for MMRRC publications because Google Scholar does not offer filtering based on accessibility and analysis on the total collection of MMRRC papers (4,180) was not feasible. The search criteria used to find publications can be viewed in the supplemental file 1 and here. Publications were also collected from SciCrunch's internal database using Metabase (RRID:SCR_001762), which contains a list of RRID citations gathered by curators over the last 8 years into Hypothes.is (RRID:SCR_00430).

The two lists were combined and duplicate papers were removed. Books, PDFs, redacted publications, publications without a methods section, and papers that may have used the species as 'wild caught' or without any discernible reference to the stock center or animal as a stock were excluded from the study. We were unable to determine if stocks were shared between laboratories, how long these animal colonies were maintained or whether genetic drift was being accounted for in the laboratories because that information is generally not available in manuscripts. The data was collected in March 2023 in order to provide this citation information to stock centers as part of an NIH-OD contract, thus the study was not pre-registered. Note that 2022 is a partial year as some publishers reveal data to PMC with some delay. For this study, a total of 2,662 original research papers were collected. Each paper referenced a particular stock center as follows: MMRRC 1,849, NXR 191, AGSC 180, ZIRC 443.

Curators classified each resource citation into categories based on the context found in the publication. To classify each citation the curator read relevant sections of each publication and searched for key terms related to each stock or stock center to determine the context. The persistent identifier (PMID, PMCID, DOI) and publication date were collected and stored in Google Sheets.

The two main categories of citations are: "an animal was used" and "and animal was not used". In the second category the author(s) may have mentioned organizing a workshop, providing care instructions to researchers, provision of data, and general correspondence between the stock center and researchers. For the purpose of the analysis of identifiability of stocks we focus on the category of citations where an animal was used, though this necessarily is only a part of the total activities of the stock center. For citations of animals, the following categories were obtained (Table 1 for example sentences of each category): RRID of the animal is provided in the paper, the catalog number for the animal is provided and RRID determined by curator, the name of the animal stock is provided and RRID determined by curator, nickname of the animal stock is provided but RRID could not be determined and "other" category when wrong RRID was provided, catalog number was provided but RRID couldn't be determined or animal was mentioned but RRID of the stock center was provided. In the "nickname" group the authors used a name of the stock that was not the official name of the stock or a known unique short name of the stock according to the stock center or MOD at the time that the data was captured. For statistical analysis, these categories that reference an animal were "lumped" into two main sub-categories: findable resources (blue shaded) and not-findable resources (orange shaded).

The OD-funded Nonhuman Primate Reagent Resource (NHPRR)

A total of 545 papers were analyzed for the NHPRR resource. The method of collecting these citations was different from the above stock centers in that the dataset consists of papers collected by the NHPRR team. For this study all data was combined with the RRID papers already collected by the RRID curators, and deduplicated as above. The curator read and categorized each reference in the same manner, with the same categories as above without further input from the NHPRR staff. The salient difference is that the literature covered should

be considered far more complete and the search strategies included papers that were discovered by NHPRR staff by a myriad of strategies only available to the stock center such as the names of people who made purchases and cited the resource "as previously described". These references frequently acknowledge the NHPRR by nickname, principal investigator, or failed to acknowledge the NHPRR but used reagents uniquely provided by NHPRR. This type of analysis is far more time intensive. The curator categorized each citation according to the rubric created below.

	Example sentence
RRID of resource provided	Xenopus were handled following the NIH Guidelines for Use and Care of Laboratory Animals that were approved by the Institutional Animal Care and Use Committee at the Marine Biological Laboratory, Woods Hole, MA. In Fig. 1, C and D, Xtr.Tg(pax6:GFP;cryga:RFP;act1:RFP)Papal (RRID:NXR_1021) embryos were injected with 20 ng of mo-e15i15 or standard mo-control and analyzed at stage 45.
Catalog number provided	Experimental models: Organisms/strains: Zebrafish: AB wild-type; both males and females; 3–18 months; 12 hpf (ZIRC Cat# ZL1).
Full name provided	5xFAD mice (B6SJL-Tg(APPSwFILon,-PSEN1*M146L*L286V)6799Vas/Mmjax) were purchased from The Jackson Laboratory (Bar Harbor, ME, USA) and maintained in accordance with the laboratory guidelines.
Nickname provided	Mice with Cre recombinase-ERT2 fusion gene driven by ROSA26 promotor (B6.129-Gt(ROSA)26Sortm1(cre/ERT2)Tyj/J from The Jackson's Laboratory) and Spry2f/f (MMRRC, mutant mice research and resource center) were crossed to generate mice carrying ERT2-Cre:Spry2f/f. -or- The anti-CD8 antibodies were kindly provided by Dr. Keith Reimann .
Other	We thank the National Xenopus Resource (RRID:SCR_013731) for providing Nkx-2.5:GFP transgenic frogs.

Table 1: Citation practice category examples from original papers broken down by type.

RRID implementation at stock centers

MMRRC: Each stock center implemented RRIDs in a slightly different way and at slightly different times, which may lead to different outcomes. The MMRRC implementation began in 2016 with some text supporting RRIDs on January 8th, and an update to the website that authors use to order animals on November 15th of 2016 (Figure 1). This website was changed to contain a "Citation ID" which both shows the RRID and contains a button to help authors copy the citation. The MMRRC also began a campaign of awareness in 2016 for their users asking them to use RRIDs when citing mice via social media and scientific conferences.

NXR: Both Xenbase and NXR worked to gain agreement on RRIDs for frog stocks in the summer of 2017, converting catalog numbers into RRIDs, harmonizing data records in both locations, then announced the RRID initiative on both Xenbase and NXR websites on Dec 13th 2017. Stocks shared with other resources (e.g., EXRC) were given unique RRIDs to help establish provenance going forward. In 2022 the NXR website was updated to include RRIDs directly on frog web pages (see Figure 1).

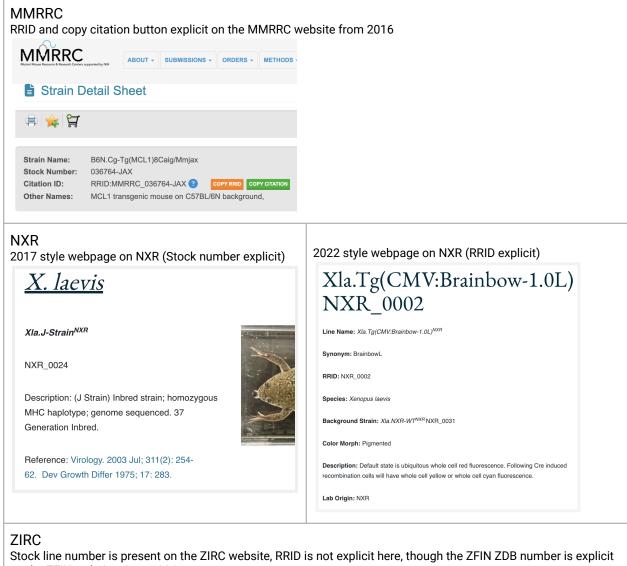
AGSC: In 2017, RRIDs were assigned to all axolotl stocks on the AGSC website. RRID's were made more visible via a 2019 website update that improved the shopping experience of users. RRID's are clearly visible to users when non-custom stocks and supplies are selected for purchase. The user community was made aware of axolotl RRID's in a publication (Voss et al, 2019) and encouraged to use axolotl RRID's in community newsletters. With new NIH requirements and support for curation and informatics activities, the AGSC and other stock centers will have greater capacity to raise RRID awareness.

ZIRC: While ZIRC does not display the RRID syntax on the website, all ZIRC catalog identifiers, which are present on the ZIRC website can be combined with the prefix "RRID:ZIRC_" to create resolvable RRIDs. The general format is: [RRID:ZIRC_CatalogID]. For example, for fish lines the format is [RRID:ZIRC_ZL#]. Thus the correct identifier for the AB wild-type line is RRID:ZIRC_ZL1, whereas the *slc45a2*^{b4/+}mutant line is identified by RRID:ZIRC_ZL85 (<u>https://zebrafish.org/fish/lineAll.php</u>). All ZIRC entries are also linked to unique ZFIN ZDB identifiers (<u>https://zfin.org/</u>), which encourages usage of PIDs (persistent identifiers).

NHPRR: The NIH Nonhuman Primate Reagent Resource had several reagents added to antibodyregistry.org in October 2017, but the bulk of the resources were added in January 2020. The NHPRR website was redone and updated in August 2020, and designed to display RRIDs for all products prominently. The RRID is currently listed in product labels, technical datasheets, shipping manifests, invoices, and publication lists. Reagents are searchable by their RRIDs throughout the website. Further, tailored citation guidelines are provided for each product (also accessible by scanning the product's QR code), and a general 'How to Cite our Reagents Using Resource Reagent Identifiers (RRID)' document is sent with each order. Several RRID dissemination campaigns were performed after the website release, including website announcements and three conference presentations for NHP research communities.

There is no true control stock center which never in any way joined the RRID initiative, which is a substantial limitation of this study. Our funding was specifically targeted towards the NIH Office of the Director supported stock centers, all of which were part of the RRID initiative in some way and the data were collected for those. ZIRC may be the closest to a control because the stock center has not added RRIDs to their website, though these can be easily created from information available on the stock center website. We can find correlations between the timing of events at the stock centers and the scientific literature based on this dataset.

Figure 1: A summary of a typical stock webpage for each stock center



on the ZFIN website since 1996

7ID	71RCC View Cart (0 Items)										
LIK	ZIRC I	Home Health Services	ZFIN								
Browse / Request: Fish ES	Browse / Request: Fish ESTs/cDNAs Antibodies The Zebrafish Book Parameoia Prices Payment Info										
Zebrafish Lines at ZIF	Zebrafish Lines at ZIRC										
		Search ZIRC	Fish Lines for Anything	~ containing	~	Go					
			Browse 1	Zebrafish Lines at ZIRC							
Select (Background)	Allele [previous names]	Affected Gene(s) [previous names]	Construct Name		<u>Phenotype</u>	<u>Genotyping</u>	Line Type	ZIRC Catalog ID	Availability		
□ <u>mitfa^{b692/+}(AB)</u>	<u>b692</u>	<u>mitfa</u> [Mitf2, Mitf-related gene, r z3A.1]	ac, nacre,		caudal fin, developmental pigmentation (all 18)▶	-	Allele with one point mutation	ZL49	<u>embryos,</u> adults		
Add Selected to Cart				1							
AGSC											

o AGS	0			≡	
Sta	ndard Inventory		Custo	om Orders	
Select Ca	tegory:				
Embryo				~	
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Q Searc	h				
				€ 50 - :::.	
RRID	Name	Description	Price	Add to Cart	
AGSC_100E	Wildtype	50 wildtype	\$31.50	+ Add to Cart	
AGSC_100E	Wildtype Embryos (50)	50 wildtype embryos	\$31.50	+ Add to Cart	
RR explicit of	Embryos (50)	embryos R website fr	rom 2020 -CD8 a] RRID:
RR explicit of	Embryos (50)	embryos R website fr Anti	rom 2020 -CD8 a	lpha [MT807R]	
RR	Embryos (50)	embryos R website fr Anti Clone ID:	om 2020 -CD8 a	Ipha [MT807R] [MT807R1]	RRID: AB_2716320
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SciScore

The curator collected the methods section from each paper and obtained Reproducibility and Transparency Score (Menke et al, 2020) for each paper using the SciScore tool (version 2, https://sciscore.com, RRID:SCR_016251). Publications were grouped by stock center and year and the average SciScore for each year was calculated. These publications were compared with the RTI data published in (Menke et al, 2022, Appendix 5), which is based on scores of 1,813,865 papers (sum of papers 2011-2020). The same major version of the SciScore tool was used in both studies.

Statistics

Three analyses were conducted after data was collected. The Z-test for independent proportions was used to evaluate the hypothesis that proportion of non-findable resources (orange colors in all figures) changed after the RRID inclusion in the literature. The assumption of independence and sample sizes were checked. The statistics were calculated by the online calculator (RRID:SCR_016762) and are provided in the part - "Proportion of 'findable' and 'not-findable' resources" below.

In the second analysis, we used linear regression to estimate values of overall RTI for 2021 and 2022 as the overall analysis published in Menke et al, 2022 is available up to 2020. The assumption of independence of samples, linearity, normality were checked and not violated. We also used a two-tailed t-test for independent samples to evaluate the hypothesis that the difference between RTI for MMRRC papers and overall set after 2016 is significant (2016 marks implementations of RRID by MMRRC). The normality and homoscedasticity assumptions were not violated. The second and third analyses were performed with Jamovi software (RRID:SCR_016142). Results and details are available in the Analysis of the Rigor and Transparency Index section of Results.

Results

Analysis of resources

We report from a total of 3,208 papers referencing resource centers in any context (2,663 of stock center papers and 545 of NHPRR papers), and 3,616 instances of resources (organisms or antibodies) used in those papers. Please note there may be multiple resources used per paper. Table 2 provides a summary of the number of citations analyzed for stock centers and NHPRR broken down by type, including categories when no animal/antibody was used.

MMRRC NXR AGSC ZIRC NHPRR citations papers citations papers citations papers citations papers citations papers RRID of resource provided Catalog number provided Full name provided Nickname provided Other Total animal/antibody 2.144 1,761 was used RRID SCR of stock center provided (no animals used) Stock center mentioned only without RRID (no animals used) Total- no animal/antibody

Table 2: Summary of data

was used										
Total curated	2,232	1,849	241	191	219	180	579	443	720	545
Google Scholar search totals (1/5/2024)		<u>4,200</u>		<u>307</u>		<u>293</u>		<u>527</u>		<u>86</u>

For all subsequent figures and analyses, the focus is only on categories where an animal or antibody was used. Figure 2 shows breakdown of citations to resources or stock centers by type for all citations between 2011 and 2022. Together with table 2, it shows that in all stock centers, except AGSC, the most common category of citations was a category that we considered "findable" (various shades of blue in all figures) meaning that it is most common to find a findable citation to a stock. The one exception to this is AGSC, which is a small community where the most common way to define a stock is by the nickname, which may be sufficient for investigators within the ambystoma community, but may be difficult to identify from outside of the community.

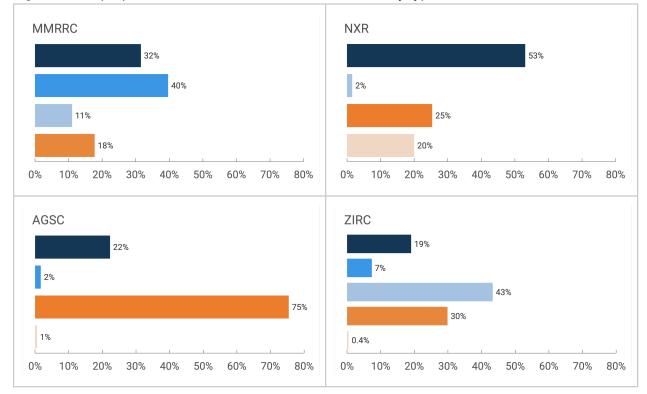


Figure 2: The proportion of citations for each stock center by type

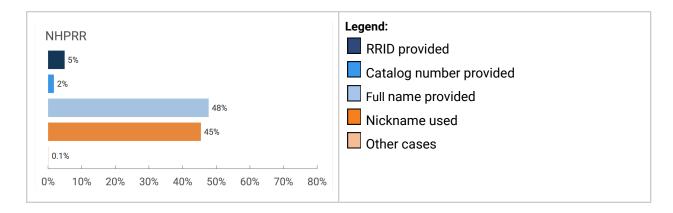
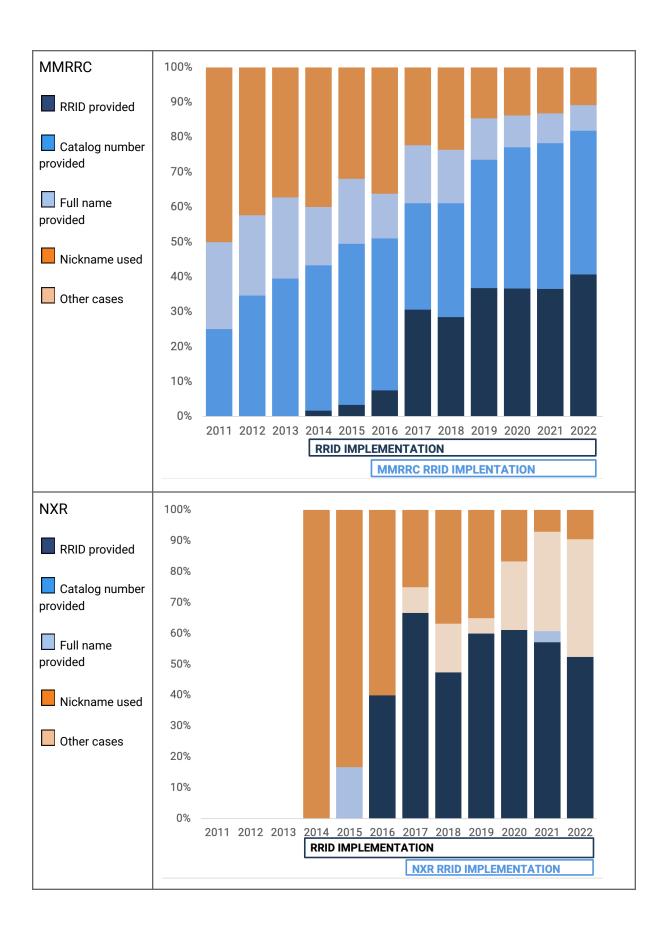
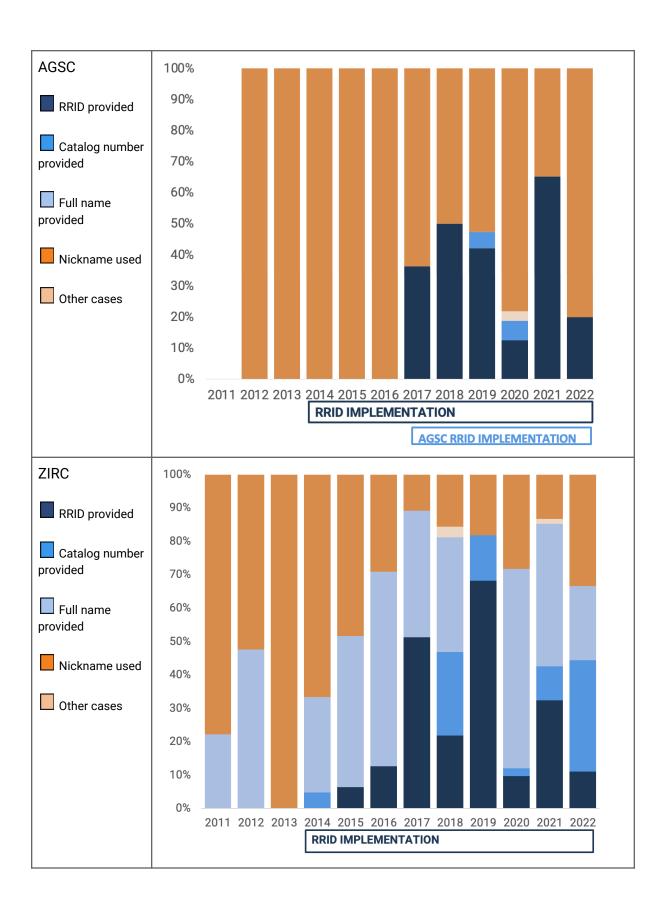
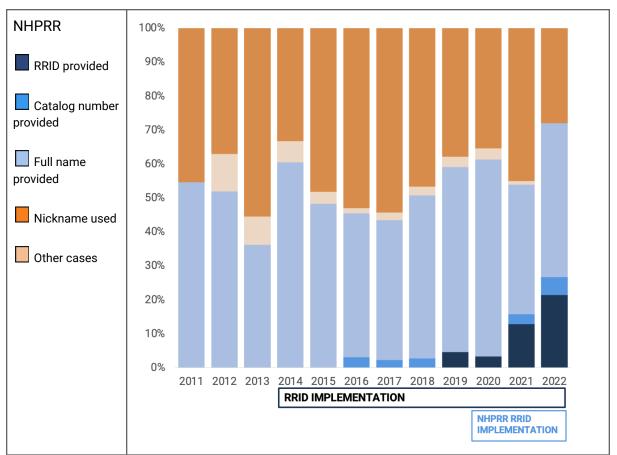


Figure 3: Citations of research resources over time. Notable dates: Feb 1 2014 start of the RRID project (25 neuroscience journals), 2016 eLife and Cell Press joins the RRID initiative (Cell press does so by deploying the STAR tables), 2018 Nature joins the RRID initiative, 2016 MMRRC begins displaying RRIDs with copy function on website, 2017 NXR begins a campaign to ask xenopus community to use RRIDs, 2017 AGSC begins outreach campaign within salamander use community, ZIRC, 2020 NHPRR registers all antibodies to obtain RRIDs and begins campaign with users of the resource.

Stock center	Percentages of resource citations per category per year
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Grouping citations by year reveals the trend over time, in which nearly all centers move toward citation by one of the "findable" (blue) categories. This is perhaps most clear for MMRRC, where prior to 2014 (the start of RRID pilot project) roughly half of the citations were in the findable category and half were in the "not findable" category, but after 2016 (the point when the MMRRC website was changed to make RRIDs a preferred citation method) authors became far more likely to cite mice using the RRID and far less likely to use a nickname (checked with the Z-test for proportions, z = -7.1052, p < 0.0001, see details in "Proportion of "findable" and "not-findable" resources" section).

Figure 3 shows this trend over time for each stock center, and the most notable shifts in the rate of compliance appear to be the year or two following the stock center adding RRIDs to their website. Interestingly, the NHPRR joined the RRID initiative quite late. In 2020, they registered all of their antibodies and began to display the RRIDs on their new website. This stock center therefore can be considered a control since journals were asking for RRIDs since 2014 (for a few journals and 2016 for Cell Press journals), but the NHPRR was not supporting their effort until 2020. If authors wanted to comply with journal policy to add RRIDs, they would have had to register the RRIDs for each antibody. Indeed there were several antibodies registered by diligent authors before 2020, but compliance was miniscule. Interestingly, our data shows that authors from 2011 to 2019 continue to exhibit roughly the same rates of using nicknames for NHPRR antibodies. Thus until the stock center began to increase awareness among NHPRR authors, the

rate of non-findable antibodies continued to be roughly 40%. Over a couple of years the non-finable antibody references may show a trend similar to the other stock centers, however our analysis of findable to not-finable resources does not reach significance.

The RRID is not highly visible on the ZIRC repository, but the pattern of citation roughly follows the other stock centers, which may reflect the overall trend of increasing usage of persistent identifiers, as those are indeed reflected on the ZFIN authority website in addition to ZIRC.

Proportion of "findable" and "not-findable" resources

We tested if the implementation of RRIDs changed the proportion of identifiable resources in the literature. We used the Z-test for proportions to test if the proportion of identifiable resources are significantly different. The assumptions of independence of samples was evaluated and confirmed by the analysis design. As some stock centers don't have many citations in the first years of analysis we decided to combine numbers for three years at the beginning of the analysis and numbers for the last three years and compare numbers of findable citations (all blue categories) with not-findable citations (all orange categories). We found that there are significant changes in the proportion of identifiable resources in all centers except NHPRR. This center is the most recent to join and so the first 3 years of implementation is being counted. As there is a fairly clear trend in figure 3, with RRIDs increasing each year, and in 2022 the "not-findable" category is beginning to give way to more findable categories, thus we anticipate that this trend will become significant at some future time.

	Findable Resource Citations	Not-Findable Resource Citations	Total	Z-statistics and p-value
MMRRC			-	
2011-2013	48 (59%)	33	81	z= -7.1052, p < 0.0001
2020-2022	1,160 (88%)	165	1,325	p < 0.0001
NXR				
2014-2016	3 (25%)	9	12	z= -2.1231, p = 0.03375
2020-2022	39 (58%)	28	67	p = 0.03373
AGSC				
2012-2014	0 (0%)	37	37	z= -4.114, p = 0.0004
2020-2022	23 (35%)	42	65	p = 0.0004
ZIRC				
2011-2013	12 (33%)	24	36	z= -5.0378, p < 0.0001
2020-2022	171 (75%)	57	228	p > 0.0001

Table 3: Statistical treatment of resource findability

NHPRR				
2011-2013	39 (49%)	40	79	z= -1.78083, p = 0.07494, NOT
2020-2022	150 (61%)	97	247	significant

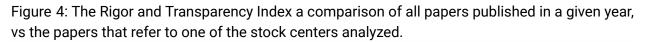
Analysis of the Rigor and Transparency Index

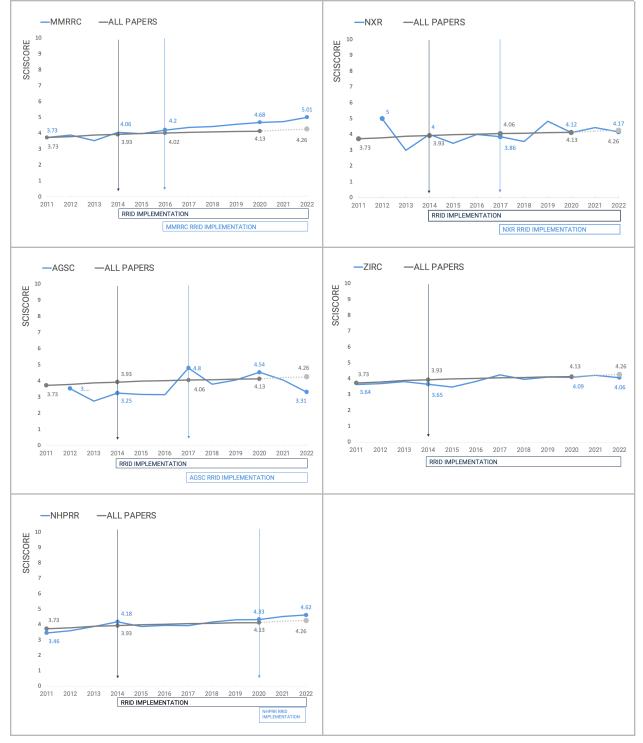
The Rigor and Transparency Index (RTI, version 2.0), is based on SciScore's automatic assessment of the rigor and transparency of papers on criteria found in reproducibility guidelines (eg, Materials Design, Analysis, and Reporting checklist criteria). The PubMed Central open access papers in biomedicine were all assessed in 2020 (Menke et al, 2022) and we used the overall numbers of the RTI per year to the currently manually analyzed papers. Unfortunately the 2021 and 2022 years are not available for this index, therefore we extrapolated the likely trajectory for 2021 and 2022. We used linear regression because it is relatively unlikely that the overall literature will shift substantially in two years because significant shifts were only visible in individual journals such as Nature at the time that the checklist was being implemented (see Menke et al, 2020). In the absence of major editorial policy shifts the expectation is that the RTI will increase slightly year over year. The regression line we obtained is \hat{y} =0.04412X - 84.9523 (R^2= 0.950, F=152, p<0.001) which gives us an estimate for 2021 RTI=4.21 and 2022 RTI=4.26. The assumption of independence of samples, linearity, normality were not violated.

Like Menke et al (2022), here we used SciScore (Ver 2, RRID:SCR_016251) to check each paper that contained a reference to an animal or antibody from our exemplar stock centers. Figure 4 shows the comparison of the overall RTI vs the papers gathered that refer to one of the stock centers. With MMRRC, the RTI largely overlaps the MMRRC papers until 2016 where the two lines begin to diverge suggesting that papers that make use of MMRRC mice are significantly better at following rigor and transparency guidelines than the average paper. We confirmed the hypothesis that the difference between RTI for MMRRC papers and the overall set after 2016 is significant with a two-tailed t-test for independent samples (t=4.27, df=10, p=0.002, Cohen's effect size 2.5 (large)). According to the Shapiro-Wilk and Levene tests, the normality (W=0.967, p=0.875) and homoscedasticity (F=0.044, p=0.837) assumptions were not violated.

The papers using animals from the other stock centers do not show any trend in improving rigor criteria adherence, but NHPRR may be demonstrating an early trend in the same direction as MMRRC, though the trend is not significant. Of course, one of the features measured within the RTI is the findability of research resources therefore it may be somewhat unsurprising that these scores begin to diverge. If however, the major difference was simply the presence of more findable resources over time, then papers from all stock centers except NHPRR would be predicted to also shift in line with their resource findability. However, the other stock centers do not show any shifts away from the mean suggesting that something about the recent papers using MMRRC and potentially NHPRR may be shifting authors toward more transparent and

rigorous practices compared to the average paper. It seems more likely that author outreach activities from the stock centers may be impacting the transparency of published papers.





Discussion and Conclusions

In this study, we examined how authors are citing research resources that are housed at five university-based stock centers in order to determine if implementing RRIDs correlates with changes in citation practices and in other rigorous science practices. The data show clearly that RRID implementation correlates with changes in citation practice, because citation practices go from about half not findable to mostly findable in nearly all stock centers just as RRIDs are implemented at the stock center.

The trend seen for nearly all stock centers reveals that the RRID project itself, with only journals enforcing author behavior, is less successful compared to the journals and stock centers attempting to change author behavior. While there are >1000 journals allowing RRIDs to be published, there are only about 100 that actively enforce them (see rrids.org). The number of biomedical journals indexed in PubMed is 5294 (date accessed Dec 28, 2023; https://www.ncbi.nlm.nih.gov/nlmcatalog?term=currentlyindexed). Thus, even if we consider the larger number of 1000 journals, the probability of being asked to add RRIDs should be about 20% and simply being asked to provide RRIDs does not result in compliance most of the time (Bandrowski et al, 2015). Furthermore, RRIDs did not enter journal publishing at the same time, 25 journals joined the initiative in 2014, but Cell Press journals joined in 2016-2018, while Nature and Science joined in 2018 and 2019. Journals continue to change their instructions to authors (see RRIDs.org). Authors may therefore not encounter the request for RRIDs, especially if they publish in journals that do not routinely ask for RRIDs. It is therefore highly important for compliance that stock centers also ask authors to cite stocks via RRID. From the data that we have gathered, it is a little difficult to determine which practices are most closely related to high compliance. MMRRC improved compliance within two years of implementing their new webpages, but reducing non-findable mice happened several years later and a persistent campaign was led by the team for most of this time. AGSC drove the use of RRIDs and a reduction to the nicknamed animals directly replacing the nicknaming practice with RRIDs. We should note that catalog numbers were not used in this community before the RRID project and there is currently no genetic nomenclature authority for salamanders so the community is quite centered on this stock center and is guite small. For NXR all papers cited frogs using nicknames, but within two years the percentage of nicknamed animals dropped precipitously giving way to RRIDs and some more formal names. Although ZIRC did not have sustained campaigns for RRIDs the community has been working with the ZFIN resource, which has been using ZDB numbers (which are also RRIDs for fish) since 1996, thus there is already significant usage of PIDs in this community. The main reason that we don't believe that journals themselves can change resource citation practices is because the NHPRR use case shows that even in places where RRIDs are well accepted; i.e., most journals that enforce RRIDs do so primarily for antibodies; there were relatively few RRIDs for NHPRR between 2014 and 2020. In 2021/2 the percentage of RRIDs rises quickly, though the trend toward findable resources is not

significant. Thus it seems that most of the time the stock center website or campaign is the key to gaining compliance in a community of users, though journals can certainly play a part in getting some authors to comply with the standard.

Sharing animals between labs, a word of caution

Our current method of reading papers does not address a very important and potentially problematic issue, which is resource sharing between labs, while still maintaining that the animals originally came from a stock center. Many authors state that the stock came from a stock center and was maintained in the university organism facility for a specified number generations, but in other cases, when labs maintain their own colonies and share resources the provenance of the animal (full name or stock number) can be lost and instead the colonies can be referenced by a nickname. Long term maintenance of a colony can also make it likely that there is substantial genetic drift making data less comparable.

At the onset of this study we attempted to ask authors in the "nickname" category which animals were used, but found this to be far too labor intensive for our study. In that category, very few papers specified how many generations their animals were kept in animal facilities after purchase, however, one researcher that was contacted had a colony of transgenic mice that originated from MMRRC. With the help of the author, we tracked down a sale of a single set of founders that were purchased by a nearby lab over 10 years before the paper. The researcher obtained mice from a colleague and brought the mice to a different university and did not re-derive the colony until our conversation (personal communication). This was a very clear case of an animal colony that did not take into account genetic drift. Although this was abandoned as a systematic method for the current study, of the 40 authors contacted about half of the authors were happy to provide the information and some realized that the information should always be included in their manuscripts because it was difficult for them to track down. The other half of authors were either non-responsive or let us know that the person who knew that information was no longer in the lab and the information was therefore lost.

We did not attempt to examine papers in which there is no mention of a stock center, but most often these papers were far greater than the papers that did mention a stock center, for example there are $\sim 400,000$ zebrafish papers, but only 527 that mention the major, US national stock center over the same period (2011-2022). This may have multiple causes: 1. The stock center was simply omitted from the paper, 2. The stock was wild-caught or bought from a pet store, 3. The stock was obtained from another lab and the provenance of stock origin was lost between the labs, 4. The stock was generated de-novo in the lab and was not deposited in a repository. In this last case, the wild type stock likely came from a repository but the information was omitted. While it is very likely that many labs have the in-house expertise to run a colony and do appropriate genetics controls it is far more difficult to determine animal genetics, general animal health, and even accurate animal nomenclature in cases where the lab generates the animal or an animal is shared between labs. As journals begin to more frequently encourage authors to

use RRIDs and proper nomenclature, the authors that generated these animals can register them with the nomenclature authority, e.g., MGI for mice or deposit them in a stock center, e.g., MMRRC.

We have seen the impact of RRIDs on registration of research resources with plasmids. Addgene, which provides plasmids to the research community, until 2019 spent significant time soliciting plasmids from authors with limited success. Once several of the large journals requested that authors add RRIDs for plasmids and deposit them with Addgene, the project stopped needing to solicit submissions and is now dealing with a deluge of reagents (Personal Communication). Some of the submitted reagents do not make it through quality control at Addgene and are subsequently not made available to the community. Similar efforts to deposit and run quality control of all research resources may not be feasible or may be cost prohibitive, but identification of the genotype of a newly created organism with the genomic authority for that organism and the inclusion of quality control data for all newly created organisms should be the standard when publishing about a newly created resource.

The cost of poor citation practices is astronomical

If we assume that Freedman and colleagues (2017) estimate that 50% research is not reproducible and the "non-findable" resources are the largest culprit (~\$10.8 billion per year according to Freedman's estimates) then taking even relatively simple steps to improve findability of resources should lead to a more reproducible literature and less funding waste. We estimate that RRIDs when implemented by journals and stock centers increase findability by ~30% (see also Bandrowski et al, 2015); scaling up would suggest converting ~\$3 billion in research funding from the non-reproducible to the reproducible category, at least if we consider that the only reason why a study is not reproducible is the lack of identification of resources. The stock centers, because of their central role as authorities for needed resources and outsized role at the center of their communities can contribute substantially to improving how those communities keep track of animal and other resource provenance and report about this in the literature.

Resource Citation Metric

The citation of published papers is tracked by several indexing efforts including the Web of Science, PubMed, and Google Scholar. Although the citation information rarely agrees across these, they are reliable enough that authors do not have to text-mine the scientific literature to determine the impact of their work. However, because research resources are not usually cited transparently or are cited in a way that is opaque to citation indexes, there is no easy answer to how many papers used a mouse or an antibody. Tracking the impact of research resources is critical for the continued support of university based resource repositories, because they are largely supported by grant funding. The staff at NHPRR has spent hundreds of hours tracking down citations to their reagents, time that can be seen as wasted effort. The RRID system of resource tracking is the closest thing to an index such as the Web of Science because each

RRID is extracted from the scientific literature semi-automatically or automatically. Unfortunately, the system is only able to pick up at best about 50% of the citations to mice and antibodies but most of the time the real number is closer to 10% of total due to current citation practices, limiting the effectiveness of this index.

Tracking down an RRID to assign a citing paper takes about 1 second in the fully automated case (when manuscripts are open access and under a text-mining accessible license) or about 10 seconds (when papers are not text-mining accessible, each paper takes about a minute to open and scan with an automated tool and there are about 10 resources per paper). Therefore the cost of capturing citations for this manuscript was about 2 hours of FTE or about \$200. For catalog numbers and easy lookups, we have estimated about 1 minute per citation which translates to 25 hours of effort and about \$2,500. The nicknames and the 'other' category took about 3 minutes to look up and took about 45 hours (\$4,500), but provided very low quality information or no information at all. When considering that there are about 274,000 papers in PubMed Central that referenced mice or antibodies in 2022. One can surmise that even spending 1 minute per citation makes it relatively cost prohibitive to capture the resource used, as that would entail 2,740,000 minutes or about \$4.5M per year in personnel time per year. These costs are borne by stock centers and other facilities, each spending significant resources to gather overlapping data, which are not verified by an objective third party.

The RRID system improves this calculation, making all data harvested by the RRID automated and semi-automated pipelines available on the specific RRID webpage, letting scientists know which paper used a particular antibody, but also letting the stock center know which salamanders are more highly cited. If the RRID system of citing resources is adhered to more broadly, the list of citations to each resource can indeed grow into a new resource impact index that will be useful in answering questions about resources.

Limitations of this study

The data collected for NHPRR was collected very thoroughly but less systematically than we would have liked, making comparisons across stock centers a bit more difficult. The stock centers themselves are quite different, as are their user communities, with relatively little overlap. Thus, the author groups that are represented should be fairly distinct, and their animal citation practices may be governed by the norms of those specific communities. This may be a factor with AGSC because it appears that most of those papers cite the name of the stock, usually inscrutable to biologists outside of the community and in recent years the RRID. In contrast, the mouse and zebrafish communities have been using stock center catalog numbers and model organism derived persistent identifiers for at least 10 years potentially making those communities pre-socialized to the concept of RRIDs. Another limitation of this study is that we did not have exact dates when some changes in websites and when campaigns were started at several stock centers, so we have used a coarser measure of the year when a change was implemented as those were more certain. Another limitation is the lack of a control stock center

which never in any way joined the RRID initiative, which would have made for a cleaner study, however our funding was specifically targeted towards the NIH Office of the Director at the supported stock centers, all of which were part of the RRID initiative in some way.

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