

1 **TITLE**

2 Resource requirements for ecotoxicity testing: A comparison of traditional and new approach
3 methods

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5 **Authors and Affiliations**

6 Krittika Mittal^{†*}, Doug Crump[‡], Jessica A. Head[†], Markus Hecker[§], Gordon Hickey[†], Steve
7 Maguire[⊥], Natacha Hogan[∇], Jianguo Xia[†], Niladri Basu[†]

8
9 [†]*Faculty of Agricultural and Environmental Sciences, McGill University, Montreal, QC, Canada*

10 [‡]*National Wildlife Research Centre, Environment and Climate Change Canada, Ottawa, ON,*
11 *Canada*

12 [§]*School of Environment and Sustainability, Toxicology Center, University of Saskatchewan,*
13 *Saskatoon, SK, Canada*

14 [⊥]*University of Sydney Business School, Sydney, Australia*

15 [∇]*Department of Animal and Poultry Science, Toxicology Center, University of Saskatchewan,*
16 *Saskatoon, SK, Canada*

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19 *Corresponding Author: Krittika Mittal (krittika.mittal@mcgill.ca)

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23 methods

24 **ABSTRACT**

25 Toxicity testing is under transformation as it aims to harness the potential of New Approach
26 Methods (NAMs) as alternative test methods that may be less resource intensive (i.e., fewer
27 animals, cheaper costs, quicker assays) than traditional approaches while also providing more
28 data and information. While many stakeholders are of the opinion that this unfolding
29 transformation holds significant promise as a more efficient and ethical way forward, few studies
30 have compared the resources required for NAMs versus those needed for traditional animal-
31 based toxicity tests, particularly in the field of ecotoxicology. The objective was to compare
32 resources needed for traditional animal-based ecotoxicity tests versus alternative tests using
33 emergent NAMs. From a bibliometric review, we estimate that traditional tests for a single
34 chemical cost \$118,000 USD, require 135 animals, and take 8 weeks. In comparison, alternative
35 tests cost \$2,600, require 20 animals (or none), and take up to 4 weeks to test 16 (to potentially
36 hundreds of) chemicals. Based on our analysis we conclude that NAMs in ecotoxicology can be
37 more advantageous than traditional methods in terms of resources required (i.e., monetary costs,
38 number of animals needed, and testing times). We note, however, that the evidence underpinning
39 these conclusions is relatively sparse. Moving forward, groups developing and applying NAMs
40 should provide more detailed accounts of the resources required. In addition, there is also a need
41 for carefully designed case studies that demonstrate the domain of applicability of NAMs (and
42 make comparisons to traditional tests) to ultimately build confidence among the user community.

43 *Keywords:* animals, ecotoxicology, toxicity tests, alternative testing strategies, 3Rs

44

45 INTRODUCTION

46

47 Scientific research is increasingly emphasizing the global threat posed by potential chemical
48 contamination (Rockström et al. 2009; Landrigan et al. 2017). The traditional approach to
49 toxicity testing of environmental chemicals and complex mixtures, which uses live animals and
50 characterizes apical measures (e.g., survival, growth, development), has been the mainstay of
51 toxicity testing since the 1920s. However, this approach is now shifting towards a diverse range
52 of new approach methods (NAMs; Supplemental Figure SF1). The term NAM first originated at
53 a European Chemicals Agency (ECHA) workshop in 2016. NAM is defined by the U.S.
54 Environment Protection Agency (US EPA) as *any technology, methodology, approach, or*
55 *combination thereof that can be used to provide information on chemical hazard and risk*
56 *assessment that avoids the use of intact animals*, and thus NAMs are recognized as
57 encompassing *any alternative test methods or strategies to reduce, refine, or replace vertebrate*
58 *animals including in silico modeling, in vitro bioassays, early-life stage testing and*
59 *toxicogenomics* (European Chemicals Agency 2016; US EPA 2019). The contemporary basis for
60 this shift was spurred by the U.S. National Research Council (NRC) report “Toxicity Testing in
61 the 21st Century – a Vision and Strategy” (NRC 2007) which advocated modernization of
62 toxicity testing into a more predictive, mechanistic and resource-efficient approach, and
63 ultimately one that could better satisfy regulatory and societal needs.

64

65 Many stakeholders within academia, government, non-governmental organizations, and industry
66 are of the opinion that the unfolding transformation in toxicity testing holds significant promise
67 as a more efficient and ethical way forward. However, few studies have compared the resources
68 required for NAMs versus those needed for traditional animal-based toxicity tests. Of the

69 comparisons made, most are from the human health perspective (e.g., mammalian toxicology),
70 and relatively little is known about vertebrate tests that underpin ecotoxicity assessments (Rovida
71 and Hartung 2009; Settivari et al. 2015; Stanton and Kruszewski 2016; Meigs et al. 2018). The
72 objective of this study was to compare three key resource parameters (monetary costs, number of
73 animals needed, and time required to perform the tests) between traditional ecotoxicity testing
74 methods that use vertebrate models against possible replacement NAMs. Analyses such as these
75 are difficult to perform accurately due to complex testing requirements, varied national
76 regulations, difference in type of information obtained from the two types of methods and
77 various toxicological endpoints to be considered (Burden et al. 2016; Lillicrap et al. 2016).
78 Therefore, two strategies were adopted here to help overcome this difficulty. First, the objective
79 was addressed through a mixed-methods literature review. Second, in addition to a general
80 comparison of the three resource parameters across various ecotoxicity tests, we present a
81 specific case, the fish acute toxicity test, for which a fish embryo test and a cell line assay have
82 been standardized as NAMs. An evaluation of the resources required for traditional methods
83 versus NAMs is timely and necessary to help document the extent to which emerging NAMs in
84 ecotoxicology might indeed be more efficient, as there remain professional and organizational
85 barriers towards the transition (Mondou et al. 2020; Pain et al. 2020).

86

87 **METHODS**

88

89 We compiled data following bibliometric literature searches of specific search terms
90 (Supplemental Table ST1). From the papers retrieved, a snowball sampling approach was taken
91 to identify additional information sources. Only papers that provided specific numbers pertaining
92 to the aforementioned three resource parameters were included. The bibliometric searches were
93 conducted in October 2018 and resulted in over 1,000 publications. We focused on reports that
94 examined standardized tests, outlined large-scale projects, and/or presented numbers for
95 regulatory purposes. For monetary costs of most traditional tests, we relied on information from
96 an OECD guidance document on chemical testing from 2017 and a number of publications (rows
97 3 to 6, Supplementary Table ST2). For the number of animals and testing times we
98 predominantly used OECD and US EPA guidelines for various tests (rows 13 to 27,
99 Supplementary Table ST2). As our bibliometric search yielded a relatively small database to
100 work from, we were not able to find numbers for some tests. In these cases, we also consulted
101 with experts in the field, obtained cost estimates via personal communication from contract
102 testing organizations, and drew from our own experiences in conducting ecotoxicity tests.
103 Ultimately, we gathered data from 14 OECD and 2 US EPA guidelines, 16 publications, reviews,
104 and annual reports on animal testing, approximate costs from companies and our own
105 experiences (Supplementary Table ST2).

106

107 Fish, birds and amphibians are the most common vertebrates used in ecotoxicology for effluent
108 testing and testing of individual chemicals, though fish are used in the highest numbers and
109 global estimates of fish used for effluent testing exceed 5 million per annum (Burden et al. 2016;

110 Norberg-King et al. 2018). Further, a study examining various toxicological endpoints required
111 for regulatory testing identified four endpoints with high fish usage where substantial savings
112 could be realized from the incorporation of NAMs, namely, assessment of 1) acute toxicity, 2)
113 chronic toxicity, 3) bioaccumulation, and 4) endocrine disruptors (Burden et al. 2016).
114 Therefore, we examined resource needs for common ecotoxicity tests, across the three species,
115 but focus on the fish acute toxicity test for the specific case study.

116

117

118 **RESOURCE COMPARISONS BETWEEN TRADITIONAL AND NEW APPROACH**

119 **METHODS**

120 Here, we first provide a general comparison of resources required for traditional tests and NAMs
121 for fish, birds, and amphibians. Following this, we provide a comparison of the resources
122 required for the specific traditional test for fish acute toxicity and the corresponding fit-for-
123 purpose NAMs that have been proposed or accepted as alternatives.

124

125 *General comparison*

126 We identified a total of 12 traditional tests (fish = 7; avian = 3; frogs = 2) and 7 tests using
127 NAMs (fish = 3; avian = 3; species agnostic in vitro tests = 1). For each of these tests we
128 examined the requirements with respect to: A) monetary costs, B) number of animals used, and
129 C) testing times. For specific details on estimates, assumptions, and references see
130 Supplementary Table ST3.

131

132 *Monetary Costs*

133 The monetary costs per chemical (in USD) of common ecotoxicity tests following standard
134 guideline tests using vertebrate models range from \$15,598 for the fish acute toxicity test to
135 \$580,000 for a multi-generational test (Bottini and Hartung 2009; Willett et al. 2011; OECD
136 2017). Tests using alternative assays range from just under \$1,000 for a primary avian
137 hepatocyte test to \$136,410 for an early-life stage fish test (Figure 1A). The median value of
138 traditional tests (\$118,000) is about 45-fold higher than the median value of alternative tests
139 (\$2,600).

140
141 The monetary costs of tests can differ across species but also within a particular species group
142 depending on the nature of the test. Within traditional tests, we see that overall the median cost
143 for fish varies widely from \$15,598 to \$411,800 per test (26-fold) whereas the cost for birds
144 ranges from \$116,000 to \$319,000 per test (2.8-fold) and in amphibians ranges from \$87,000 to
145 \$250,560 per test (2.9-fold). Similarly, in terms of NAMs, the cost of testing across the three fish
146 tests ranges from \$1,200 to \$136,410 (113-fold), whereas the tests in birds (\$700 to \$1,500) and
147 species-agnostic cell-free assays (\$1,200 to \$4,000) do not vary largely. The wide range in costs
148 of the fish NAMs is largely due to the tests involving embryo exposures which require a more
149 elaborate setup. As a point of comparison, the cost for OECD approved in vitro alternatives for
150 eye irritation and skin sensitization tests, such as TG 430, 431, 437 and 439, range from \$1,400
151 to \$4,060 (Humane Society International; Costin 2014)

152
153 Rovida and Hartung (Rovida and Hartung 2009) estimated the monetary costs associated with
154 chemical testing in the EU based on REACH requirements. They estimated that the number of
155 new chemicals expected to fall under REACH would range from 68,000 to 100,000, and, using

156 the lower estimate, they determined that monetary costs would total \$13.6 billion. This scenario
157 looked at a total of 28 tests of which the ecotoxicity tests included one avian test (OECD TG
158 223) and three fish tests (OECD TG 203, 210 and 305). Based on differing test requirements for
159 specific chemicals based on their production volumes, it was estimated that 9,000 ecotoxicity
160 tests would be needed at an estimated cost of \$186 million (1.4% of the total). It is very difficult
161 to determine how much is spent annually on ecotoxicity testing worldwide, but we propose a
162 simple calculation, as follows. Worldwide, it has been estimated that \$2.8 billion is spent
163 annually on animal experimentation for toxicological research (Hartung 2009). Using the
164 aforementioned 1.4% as an estimate of the share of the total expenditure realized by these four
165 fish and avian tests, we estimate that over \$39 million is spent worldwide every year for these
166 ecotoxicity tests. This estimate, calculated based on data available from 2009, is highly
167 simplified and likely a gross under-estimation of the true costs (e.g., it does not consider other
168 ecotoxicity tests and study species including invertebrates, testing for environmental monitoring
169 or compliance efforts).

170

171 *Animal Numbers*

172 The number of animals required for standardized guideline ecotoxicity tests on vertebrate models
173 ranges from 42 to 350 per test, while tests using NAMs call for 0 (in the case of commercial cell-
174 lines) to 20 animals or 12 to 320 embryos per test (Figure 1B). The median number of animals
175 needed for traditional tests (135) is over 6-fold higher than the median number of embryos or
176 animals needed for alternative tests (20), although it is difficult to definitively make such a
177 comparison since many alternative tests do not rely on animals (Willett et al. 2011; OECD
178 2017).

179

180 Within traditional tests we report that overall the median number of fish (150) and birds (120)
181 required per test is somewhat lower than the median number of amphibians (200). In terms of
182 NAMs, the numbers needed for fish embryos (320), avian embryos (4 to 40) and cell-based or
183 cell-free assays (0 to 20) are higher than for rodents and other mammalian species; however,
184 since many such tests rely on cell lines or in silico methods, the animal usage is essentially zero
185 irrespective of the species.

186

187 Similar to our understanding of the monetary costs, there have been few estimations of the
188 number of animals needed for traditional toxicity tests on a global scale. One paper estimated
189 that approximately 54 million vertebrates would be needed to test about 68,000 chemicals in the
190 EU based on REACH requirements (Rovida and Hartung 2009). Under this scenario, the number
191 of fish and birds required for 9,000 of the four ecotoxicity tests (described in the previous
192 section; OECD TG 223, 203, 210, and 305) was estimated at 1 million (2.2%) (Rovida and
193 Hartung 2009). Worldwide annual estimates of the usage of animals in the laboratory range from
194 20 to 100 million (Taylor et al. 2008; Lush 2014). However, for countries such as the USA, these
195 estimates do not include fish and birds and hence may be an underestimate of the true numbers
196 of animals from these taxa. Certain countries do report the number of birds and fish used; for
197 example, in the United Kingdom, 34,700 fish and 17,700 birds were used in 2012 for toxicology
198 experiments; and in New Zealand 27,949 fish and over 12,000 birds were used for research,
199 testing and teaching (Lush 2014). While it is not always possible to obtain accurate estimates for
200 the number of birds and aquatic species used specifically for toxicity testing, using the
201 aforementioned 2.2% as the share of birds and fish being used for the four ecotoxicity tests and

202 depending on the estimate of total number of animals being considered (20 to 100 million), at a
203 minimum we may estimate that the worldwide annual usage of fish and birds ranges from
204 440,000 to 2.2 million.

205
206 The numbers of animals being used in toxicity testing are much greater when considering
207 environmental monitoring and regulatory compliance needs. For example, in 2018, numbers
208 from the Canadian Council on Animal Care (CCAC) showed that in total 52,018 birds (chicken)
209 and fish (fathead minnow, rainbow trout and zebrafish) were used for regulatory testing of
210 products for the protection of humans, animals or the environment (CCAC 2018a). This report
211 also stated that over 84,000 rainbow trout are used annually in relation to two key Canadian
212 regulations governing effluent testing for metal mining and pulp and paper mill industries
213 (CCAC 2018b). As of 2017, the compliance rate for these two regulations was greater than 97%,
214 essentially indicating that only 3% of these effluents displayed adverse effects in the fish (i.e.,
215 only 2,520 fish exhibited symptoms) (ECCC 2017a; ECCC 2017b). In the private sector, Shell
216 reported that in Canada, the USA, and the European Union, they used approximately 85,000 fish
217 for regulatory testing in 2015 although this number reduced to approximately 34,000 in 2017
218 (Shell 2017). Looking at these numbers it appears that incorporating NAMs into monitoring and
219 compliance testing could provide an important avenue for notable reductions in the number of
220 animals required for monitoring and compliance purposes.

221

222 *Testing Times*

223 The time required to conduct standard guideline tests on vertebrate models ranges from 2 to 38
224 weeks, while tests using NAMs typically need 2 to 4 weeks (Figure 1C). The median number of

225 weeks needed for traditional tests (8) is about 2-fold higher than the median number of weeks
226 needed for alternative tests (4).

227

228 Within traditional tests we see that the median number of weeks needed for avian tests (24) is 2-
229 to 3-fold higher than the median number of weeks needed for tests involving fish (8) or
230 amphibians (12.5). In terms of NAMs, the fish studies we report upon need 4 weeks, the avian
231 studies need 2 to 4 weeks, and cell-free or cell-line based tests need 2 to 3 weeks. In terms of
232 biomedical species, similar timelines (i.e., few days to a week) are expected owing to the
233 availability of established cell lines and other alternative testing models.

234

235 There is limited information on the time needed to test panels of chemicals as would be
236 necessary in a screening program. In the human health domain, it took an estimated 30 years to
237 obtain toxicity data on 300 chemicals using animal tests compared to the U.S. ToxCast program
238 which generated data across 600 mechanistic endpoints for 300 chemicals in about five years
239 (Groff et al. 2014). Looking at the avian ToxCast as an example in ecotoxicology,
240 transcriptomics data for 16 flame retardants using a chicken hepatocyte culture model were
241 collected in under 4 weeks (Porter et al. 2014). In comparison, performing egg injection studies
242 for all 16 chemicals (even if exposures were performed for two chemicals at a time) would have
243 taken approximately 8 months to complete, and much longer (potentially years) if these were
244 whole animal studies.

245

246 *Resource comparison of a fit for purpose test*

247 Assessment of acute toxicity is required by REACH for registration of chemicals produced at
248 ≥ 10 tons/y and is often a primary component for effluent compliance testing. The accepted
249 traditional test for fish acute toxicity is OECD TG 203 in which small fish are exposed to test
250 substances for a period up to 96 hrs during which lethality is monitored (OECD 2019).
251 Alternative tests proposed for OECD TG 203 include the fish embryotoxicity test (FET) and fish
252 cell cytotoxicity assays. In Europe, according to the Scientific Directive on Animal
253 Experimentation, protection is afforded to fish at the onset of exogenous feeding (Embry et al.
254 2010; Halder et al. 2010) and hence, many countries have adopted the FET as an alternative test.
255 In 2013, the OECD approved the FET (i.e., Test No 236: Fish Embryo Acute Toxicity Test) as a
256 standardized test for fish acute toxicity (OECD 2013a). In 2021, the OECD approved the
257 rainbow trout gill cytotoxicity assay (i.e., Test No 249: Fish Cell Line Acute Toxicity) as a
258 standardized in vitro test to predict fish acute toxicity (OECD 2021).
259
260 Resources required for the OECD TG 203 test include monetary costs that range from \$7,056 to
261 \$24,140, and 42 fish per test chemical. In comparison, the FET (OECD TG 236) costs ~\$26,000
262 and requires 320 embryos, and the OECD TG 249 assay costs ~\$2,600, and requires no live fish
263 since an established cell line is used. Based on the number of chemicals registered for specific
264 production volumes, there are an estimated 7,656 chemicals produced at over 10 tons/y
265 (<https://echa.europa.eu/reach-registrations-since-2008>). Thus, conducting OECD TG 203 on all
266 these chemicals would cost ~\$119.4 million and use ~321,000 fish. In an alternate scenario, all
267 7,656 chemicals could be initially screened using OECD TG 249 (Fish Cell Line Acute Toxicity)
268 at a cost of ~\$19.9 million and no use of animals. Assuming that 15% of these chemicals (i.e.,
269 1,148) are flagged for subsequent toxicity testing using OECD TG 203, then the cost would be

270 an additional ~\$17.9 million. The combined cost of this tiered approach would be ~\$37.8
271 million and use 48,216 fish. The overall savings would be ~\$81.6 million and ~273,000 fish
272 lives (Table 1).

273

274

275 **DISCUSSION**

276

277 In ecotoxicology there is a shift underway from toxicity tests that expose whole animals and
278 measure apical outcomes to ones that use NAMs to test chemicals *in vitro* and in early-life stage
279 organisms and yield mechanistic information. While such NAMs are considered to be cheaper,
280 faster, and more ethical than the traditional methods, there has been a lack of empirical evidence
281 to support such assertions. Here we aimed to synthesize information from available data-
282 streams to provide a glimpse of the evolving field of ecotoxicity testing and the various costs
283 associated with traditional and alternative toxicity testing methods. Such an examination is
284 especially needed as there remain professional and organizational barriers towards this transition
285 (e.g., concerns over error costs and pattern of familiarity (Mondou et al. 2020)).

286

287 Our analysis provides evidence that NAMs are faster, cheaper and use less animals than
288 traditional toxicity testing methods. In terms of testing a single chemical using traditional animal
289 tests, we estimate that the median cost of a test is \$118,000 and that it requires approximately
290 135 animals and 8 weeks. In comparison, the median cost of an alternative test is \$2,600 and
291 would require approximately 20 animals (or 40 embryos) and up to 4 weeks to test from 16 to
292 400 chemicals since several chemicals may be batch-tested. Refer to Table 2 for a snapshot of
293 the monetary cost, animals and time needed for a representative traditional and alternative test
294 using fish (fathead minnow or zebrafish) and birds (Japanese quail).

295

296 Testing is costly. For example, countries worldwide spend 7 to 24 billion dollars annually on
297 pollution abatement and control activities (Statistics Canada 2012; MAPI 2015; Eurostat 2017).

298 In terms of testing chemicals, scenarios out of the European Union present numbers that extend
299 into billions of dollars (Rovida and Hartung 2009). Even if the backlog of chemicals were
300 adequately tested, there will always be a need to perform toxicity tests given the introduction of
301 500 to 1000 new chemicals annually into commerce (Arnold 2015) and the growing number of
302 environmental sites that require monitoring. Some reports have started to investigate whether the
303 incorporation of NAMs into testing programs may realize monetary and non-monetary cost
304 savings. An earlier study concluded that animal testing needs could be reduced by up to 70% by
305 the adoption of intelligent testing strategies such as quantitative structure activity relationships
306 (QSARs), grouping and read-across methods (Van der Jagt et al. 2004). A more recent study
307 estimated that 3 – 15% of chemicals initially screened using NAMs would be prioritized for *in*
308 *vivo* testing as part of a tiered testing program (Thomas et al. 2017). These initial studies
309 demonstrate that NAMs may help increase efficiencies though more rigorous evaluations are
310 needed.

311
312 Incorporation of NAMs in toxicity testing is starting to be realized by key stakeholders in the
313 human health domain. A key example is the U.S. EPA's ToxCast program that has screened
314 thousands of chemicals via hundreds of *in vitro* assays at a fraction of the cost to test these
315 chemicals using animal bioassays (Dix et al. 2007; Thomas et al. 2019). In ecotoxicology,
316 regulatory decisions still rely on the outcomes of whole animal studies though progress is being
317 made in terms of adopting NAMs. First, we are seeing the emergence and acceptance of new
318 testing systems that may serve as alternatives to animal tests. In 2018, the U.S. EPA listed
319 OECD Test Guideline #236 (Fish Embryo Acute Toxicity, FET, Test) as an “*alternative test*
320 *methods or strategies the Administrator has identified that do not require new vertebrate animal*

321 *testing and are scientifically reliable, relevant, and capable of providing information of*
322 *equivalent or better scientific reliability and quality to that which would be obtained from*
323 *vertebrate animal testing”* (US EPA 2018). However, European researchers examining the
324 ability of this OECD Test Guideline #236 to predict outcomes in standard acute fish toxicity tests
325 for regulatory purposes highlighted several limitations (e.g., the fish embryo test does not capture
326 key modes of action, or is challenging to use for certain classes of chemicals) (Sobanska et al.
327 2018), thus illustrating the need for more research activities on the fish embryo test system. For
328 birds, researchers at Environment and Climate Change Canada (ECCC) have proposed the
329 standardization of early-life stage toxicity tests using avian eggs though this particular study only
330 evaluated eight chemicals in one avian species and thus there is a need for additional studies
331 (Farhat et al. 2019).

332
333 Second, there is a need for NAMs to be made available in a more consistent and commercial
334 manner while also being affordable and reliable. Within the ‘omics fields we are starting to see
335 the arrival of products in the marketplace that can aid in the investigation of the transcriptome,
336 proteome, and metabolome of species of ecotoxicological interest. For example, a Canadian
337 team of academic, government and industry partners is co-designing 384-well qPCR arrays
338 (EcoToxChips) and a corresponding data evaluation tool (www.ecotoxxplorer.ca) to help
339 characterize, prioritize and manage environmental contaminants and complex mixtures of
340 regulatory concern (Basu et al. 2019). We estimate that coupling such a toxicogenomic tool with
341 alternative testing systems (e.g., the aforementioned fish embryo test or avian egg injection
342 method) may enable rapid and deeper hazard characterization for ~\$1,000 -5,000 per tested
343 chemical.

344

345 Finally, as we enter a big data era, the information resulting from NAMs must be rapidly
346 processed and be amenable for decision-making under a range of contexts. Frameworks such as
347 adverse outcome pathways (AOPs) and the OECD's AOP Knowledgebase
348 (<https://aopkb.oecd.org/>) along with standardized reporting templates and Findable, Accessible,
349 Interoperable and Reusable (FAIR) principles could better help enable the user community to
350 maximize the use of data. The ecotoxicological community is also starting to benefit from a
351 diverse set of relevant and publicly accessible tools that allow users to efficiently query large
352 databases of chemicals and toxicological information (e.g., U.S. EPA's CompTox Dashboard
353 and the ECOTOX Knowledgebase), perform species read-across assessments (U.S. EPA's
354 SeqAPASS, EnviroToxDatabase.org), conduct risk assessments (HESI Risk 21, CAFÉ), derive
355 transcriptomic points of departure (BMDExpress2, FastBMD - www.fastbmd.ca), and analyze
356 various 'omics data: EcoToxXplorer (www.ecotoxplorer.ca), NetworkAnalyst
357 (www.networkanalyst.ca), MetaboAnalyst (www.metaboanalyst.ca), and MicrobiomeAnalyst
358 (www.microbiomeanalyst.ca).

359

360 Nevertheless, there are a number of challenges associated with the adoption of NAMs. For
361 instance, the two approaches examined here – traditional methods and NAMs – provide different
362 types of data; risk assessment and regulatory decisions are typically made based on apical results
363 including mortality, reproductive or developmental effects, which are obtained from traditional
364 methods. However, NAMs typically provide mechanistic information including cytotoxicity,
365 receptor binding, enzyme activity, and large sets of omics data (Villeneuve and Garcia-Reyero
366 2011). Extrapolating such results from NAMs across various levels of biological organization,

367 i.e., sub-cellular and cellular level to predict effects in the whole organism in an accurate manner
368 presents a major challenge in obtaining biologically relevant information (van Vliet 2011). Thus,
369 the predictive capacity of NAMs to whole animal methods is one of the main obstacles to
370 implementing and integrating them into the decision making process.

371
372 The question regarding the biological relevance of data obtained from these methods leads to the
373 issue of acceptance of the methods within regulatory bodies. While there has been increased
374 interest in the development of these types of methods, acceptance of these methods within the
375 ecotoxicological community is lacking. Thus, if the NAMs being developed and validated do not
376 gain acceptance, they are perhaps of not much practical use regardless of how resource efficient
377 they may be. Other challenges associated with NAMs are related to the difference in national
378 regulations. Data from studies for the same endpoints in one country may not be acceptable in
379 other countries thus resulting in the need to repeat the study and thereby increase costs. Further,
380 the analyses of complex data generated by NAMs often require specialized skills and knowledge
381 and thus calling upon additional assistance for data analysis can add to the total costs.

382
383 Based on our analysis, here we conclude that NAMs in ecotoxicology can be more advantageous
384 than traditional methods in terms of resources required (i.e., monetary costs, number of animals
385 needed, and testing times). However, there is a need for carefully designed case studies that
386 demonstrate the domain of applicability of NAMs to ultimately build confidence among the user
387 community (Kavlock et al. 2018). Thus, we note that the evidence underpinning these
388 conclusions is relatively sparse and that moving ahead, groups developing and applying NAMs
389 should provide more detailed accounts of the resources required.

390

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590 **TABLES AND FIGURES**

591
592

593 **Table 1:** Comparison of the traditional fish acute toxicity test (OECD TG 203) and fish new
594 approach method (OECD TG 249) to test 7,656 chemicals produced over 10 tons/y. Assume
595 15% of the chemicals (1,148) are prioritized for further testing. OECD = Organization for
596 Economic Cooperation and Development; TG = Test Guideline

597

Test type	Traditional	Alternative	Strategy 1 - traditional		Strategy 2 - alternative		Total	Savings
			OECD 203 for 7,656 chemicals	OECD 249 for 7,565 chemicals	OECD 203 for 1,148 chemicals	OECD 203		
Monetary cost	15,598	2,600	\$119,418,288	\$19,905,600	\$17,906,504	\$37,812,104	\$81,606,184	
Number of animals	42	0	321,552	0	48,216	48,216	273,336	
Time (weeks)	2	1	15,312	7,656	2,296	9,952	5,360	

598

599

600 **Table 2:** Comparison of resources needed to evaluate one chemical in a traditional (whole
601 animal) test versus an alternative (new approach method) test for a fish and a bird in terms of
602 monetary costs, number of animals used, and test duration. OECD = Organization for Economic
603 Cooperation and Development; TG = Test Guideline; ECCC = Environment and Climate Change
604 Canada

Species	Tests	Money (USD)	# of Animals	Time (weeks)
Fish (Fathead minnow or Japanese medaka)	OECD TG 229 (traditional)	104,922	72	8
	OECD TG 210 (alternative)	5,250	320 eggs	4
Japanese quail	OECD TG 223 (traditional)	120,000	70	6
	ECCC <i>in ovo</i> injections (alternative)	1,250	40 eggs	4

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607 **FIGURE CAPTIONS**

608

609 **Figure 1:** Costs associated with traditional and alternative testing strategies in terms of A)

610 monetary costs in USD (United States Dollar; where possible, data are presented as median

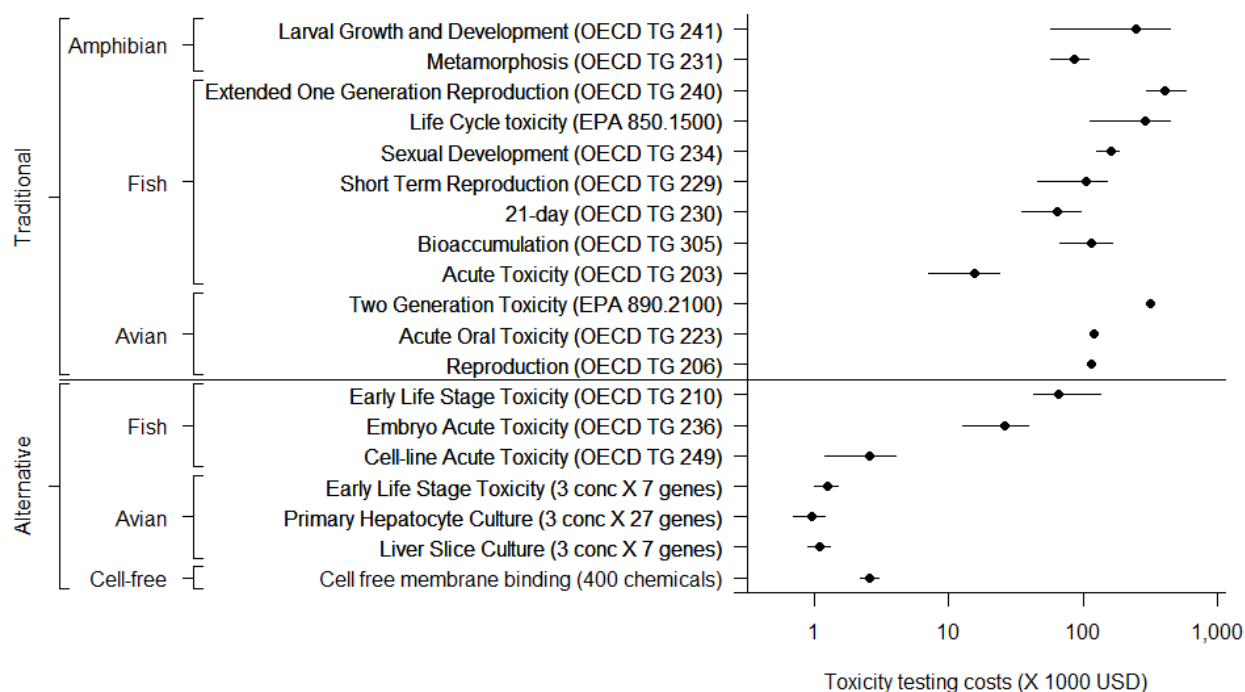
611 (black circle) and the range (bar represents minimum to maximum cost)), B) number of adult

612 animals or embryos, and C) time in weeks. For further details on the tests and references please

613 see Supplementary Table ST3.

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615 A



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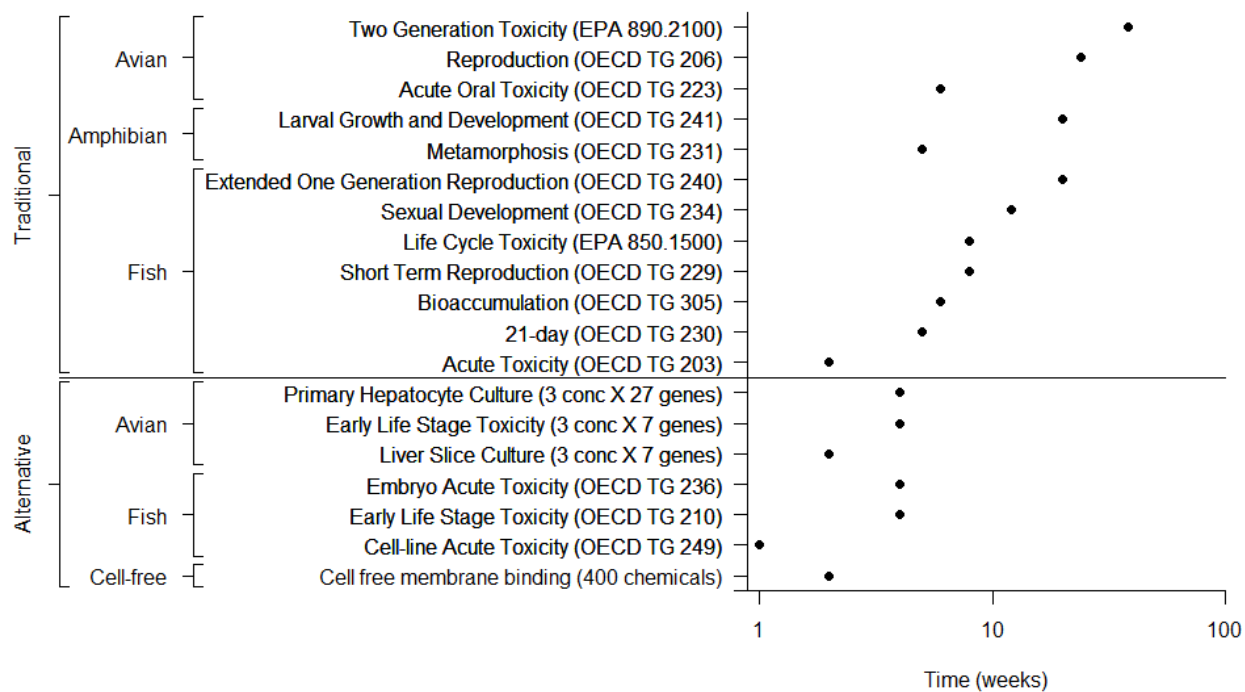
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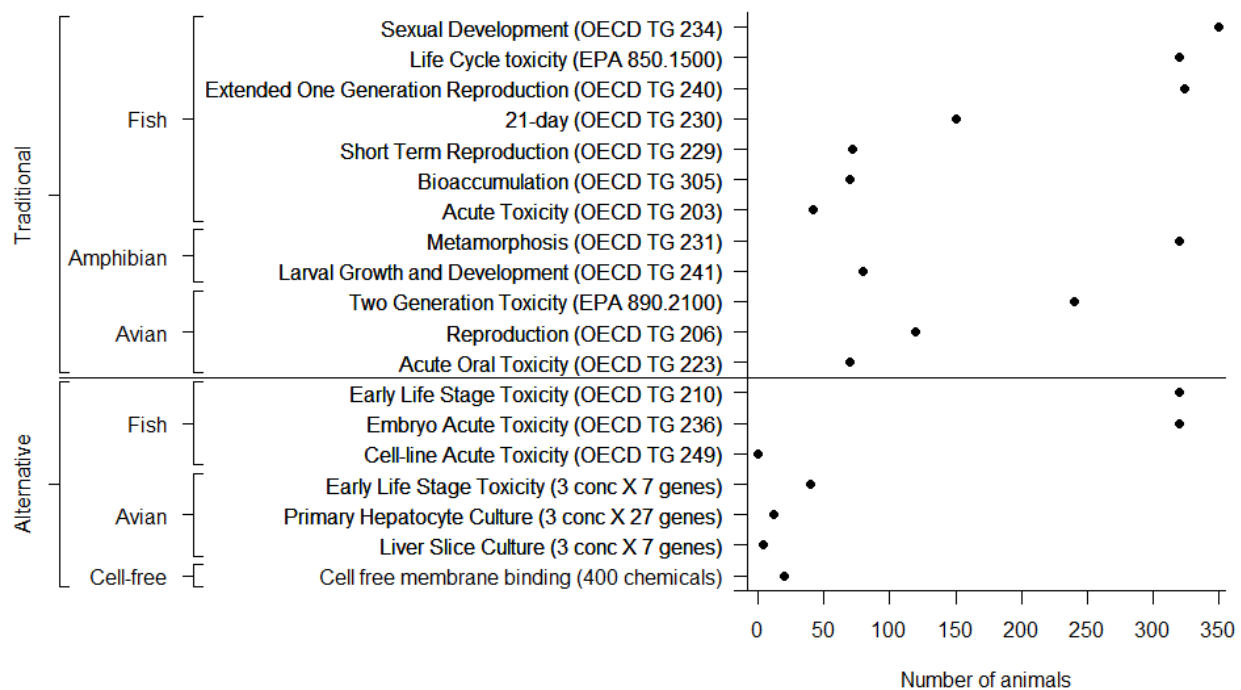


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