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2 **Strategies in genotoxicology: Acceptance of innovative scientific methods in a**  
3 **regulatory context and from an industrial perspective.**  
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16 **Abstract**  
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18 The tests used and the general principles behind test strategies are now often over 30  
19 years old. It may be time by now, given that our knowledge of genetic toxicology has  
20 improved and that we also technically are better able to investigate DNA damage  
21 making use of modern molecular biological techniques, to start thinking on a new test  
22 strategy. In the present paper, it is demonstrated that the time is there to consider a new  
23 approach for genotoxicity assessment of substances. A fit for all test strategy was  
24 discussed making use of the most recent technological methods and techniques.  
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26 It was also indicated that *in silico* tools should be more accepted by regulatory  
27 institutes/bodies as supporting information to better conclude which tests should be  
28 required for each separate substance to demonstrate its genotoxic potency. Next to that  
29 there should be a good rationale for performing *in vivo* studies. Finally, the need for  
30 germ cell genotoxicity testing, essential when classification and labeling of substances is  
31 mandatory, was discussed. It was suggested to change the GHS for genotoxicity  
32 classification and labelling from *in vivo* tests in germ cells into *in vivo* tests in somatic  
33 cells.  
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35 Quantitative genotoxicology was also discussed. It appeared that we are currently at a  
36 transition, where the science developing to justify carrying out human health risk  
37 assessments based on genetic toxicology data sets supported by mechanistic data and  
38 exposure data. However, implementation will take time, and acceptance will be  
39 supported through the development of numerous case studies. Major remaining  
40 questions are: is genetic damage a relevant endpoint in itself, or should the risk  
41 assessment be carried out on the apical endpoint of cancer and which genotoxic  
42 endpoint should be used to derive the point of departure (PoD) for the human exposure  
43 limit?  
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45 **Keywords**

46 Strategy in genotoxicology; Adverse Outcome Pathway (AOP); Germ cells and Global  
47 Harmonized System (GHS); Quantitative genotoxicity.

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## 50 **Introduction**

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52 This paper is a report from a workshop “Strategies in genotoxicology: Acceptance of  
53 innovative scientific methods in a regulatory context: Strengths and Weaknesses. From  
54 a regulatory point of view to an industrial perspective” at the 47<sup>th</sup> Annual Meeting of the  
55 European Environmental Mutagenesis and Genomics Society, held in Rennes, France in  
56 May 2019. Registrations of products always require the assessment of their genotoxic  
57 potential in order to protect humans and the environment. During this workshop  
58 strategies in genotoxicity were observed from a regulatory, an industrial and a  
59 quantitative perspective. The views expressed in these presentations are always  
60 exclusively those of the speakers.

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## 63 **Discussion**

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65 All new and existing chemicals, drugs, food ingredients, cosmetic ingredients, etc. are  
66 tested before marketing to be sure that they do not pose a risk for public health. These  
67 substances are tested on every toxicological endpoint, including genotoxicity. Testing for  
68 genotoxicity has a dual-purpose: i) hazard assessment and ii) classification and labelling  
69 according to the Global Harmonisation System (GHS).

70 Often, for instance for chemicals in Europe, genotoxicity has a special place in this  
71 assessment since for genotoxic substances that are also carcinogenic a non-  
72 thresholded risk assessment is mandatory.

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74 Genotoxicity testing has some main principles. The maximum level of information should  
75 be obtained with a minimum number of tests. The tests therefore have to be very  
76 adequate and efficient. Next to that the extent of genotoxicity testing should be related to  
77 the extent of (potential) human exposure: the more human exposure the more testing.  
78 And finally the number or use of animals should be reduced. This means that *in vitro*  
79 tests are strongly preferred.

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81 Genotoxicity testing has three genotoxic endpoints gene mutations (mutagenicity),  
82 structural chromosome aberrations (clastogenicity) and numerical chromosome  
83 aberrations (aneuploidy). For a complete assessment of genotoxicity of substances all  
84 endpoints have to be covered. Unfortunately, there is no genotoxicity test to cover all  
85 endpoints, indicating that a combination of tests is necessary to cover genotoxicity. The  
86 result is a strategy for genotoxicity testing.

87 For testing, a number of both *in vitro* and *in vivo* tests are available. Since 1982,  
88 recommendations for the conduct of the commonly used tests are provided in the  
89 Organization for Economic Co-operation and Development (OECD) test guidelines  
90 describing the major steps of the tests. However, many tests are older and were already  
91 developed (long) before the OECD started its test guidelines program. Since 1982 not  
92 much has changed. A few tests were deleted in 2014 e.g. the Sister Chromatid

93 Exchange (SCE) test, the *Saccharomyces* and *Drosophila* tests as well as the *in vitro*  
94 Unscheduled DNA Synthesis (UDS) test. The decision to delete some test guidelines  
95 was made based on the observation that these tests are rarely used in the various  
96 legislative jurisdictions, and on the availability of newer tests showing a better  
97 performance for the same endpoint. The deleted test guidelines should not be used for  
98 new testing and are no longer a part of the set of OECD recommended tests; however,  
99 data previously generated from these deleted test guidelines can still be used in a risk  
100 assessment or other types of regulatory decisions.

101 Only a few new tests were introduced: the *in vitro* mammalian micronucleus test (OECD  
102 487 [1]), the transgenic gene mutation test (OECD 488 [2]) and the *in vivo* comet assay  
103 (OECD 489 [3]). The former test guideline (OECD 476) was divided in two test  
104 guidelines: one covering hprt/xprt mutations (revised as and a new guideline covering tk  
105 mutations in recommended TK6 cells and L5171Y cells (OECD 490 [4]). All other tests,  
106 were several times updated or revised. However, it may be clear that the possibilities to  
107 keep updating or revising these tests are limited. There comes a point that a revision  
108 becomes nit-picking.

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110 At least within Europe, the genotoxicity testing strategy between regulatory bodies  
111 (ECHA, EFSA, SCCS, EMA, COM) is rather similar. The strategy consists of a stepwise  
112 approach starting with *in vitro* tests. In the event of negative *in vitro* results, it can be  
113 concluded that the substance has no genotoxic potential. Positive *in vitro* results trigger  
114 appropriate *in vivo* studies to assess whether the genotoxic potential observed *in vitro* is  
115 expressed *in vivo*. A negative result in these confirming *in vivo* tests overrules the *in vitro*  
116 positive result and the substance is considered not genotoxic. Positive *in vivo* results  
117 make the substance tested a genotoxicant. For substances which are genotoxic in  
118 somatic cells *in vivo*, the potential for germ cell mutagenicity should be considered. It is  
119 recognised that standard reproduction studies do not cover all germ cell effects. Next to  
120 that genotoxicity testing is more or less a pre-screen for carcinogenicity and as such  
121 many legislations ask for a carcinogenicity test when a substance is a mutagen.

122 Still, consideration should be given to whether specific features of the test substance  
123 might require substitution of one or more of the recommended *in vitro* tests by other *in*  
124 *vitro* or *in vivo* tests in the basic battery. The *in vivo* test to be performed is dependent  
125 on the genotoxic endpoint that is positive *in vitro*, e.g. a positive *in vitro* micronucleus  
126 test should be followed by an *in vivo* micronucleus test.

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128 As an example, under the REACH regulation, the required *in vitro* assays for  
129 genotoxicology are always the same. The Ames test (OECD 471) [5] is required for a  
130 substance production or importation from 1 to 10 tons/year; the upper band tonnage  
131 between 10-100 tons/year requires two additional tests (e.g. the *in vitro* micronucleus  
132 test (OECD 487) [1] and *in vitro* mammalian cell gene mutation tests using the thymidine  
133 kinase gene (OECD 490) [4]. If all these three assays are found to be negative, i.e. do  
134 not generate any genotoxic response, then the substance is considered to be non-  
135 genotoxic and no additional *in vitro* or *in vivo* assays are then required. Under REACH,  
136 the use of animals for genotoxicity assessment is possible but needs to be justified.

137 Scientifically, this testing battery proposed by REACH regulation sounds acceptable  
138 according to literature for assessing substance genotoxicity. In a review of Kirkland et al.  
139 (2011) [6], the authors demonstrated that a battery of only two *in vitro* tests, the Ames

140 test (OECD 471) [5] and the *in vitro* micronucleus assay (OECD 487) [1], is enough as  
141 both are covering all three endpoints of genotoxicology, i.e. gene mutations,  
142 clastogenicity and aneuploidy. Nearly 100% (958 out of 962) of rodent carcinogens or *in*  
143 *vivo* genotoxins were correctly detected with these two tests, which make this battery a  
144 particular high sensitive combination.

145 Consequently, it may be justified to wonder whether *in vitro* tests alone are sufficient for  
146 both single substance or mixture genotoxic potency assessment. Such philosophy would  
147 be also in line with United States Environmental Protection Agency's (US-EPA) intention  
148 which targets to ban animal use in toxicology studies by 2035 [7].

149 The tiered approach required by most regulations could then focus on *in vitro* tests and  
150 on (Q)SAR in order to avoid unnecessary use of animals.

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153 Table 1: predictivity of 3 common genotoxicity tests: Gene mutation test in  
154 bacteria (Ames test); MLA: mouse lymphoma assay (gene mutation test in  
155 mammalian cells); CA: chromosome aberration test. (modified or calculated from  
156 Kirkland et al., 2005 [8])

	Ames	MLA	CA	Ames + CA	Ames + CA + MLA
<b>Sensitivity (%)</b>	<b>58.8</b>	<b>73.1</b>	<b>65.6</b>	<b>82.2</b>	<b>84.7</b>
<b>Specificity (%)</b>	<b>73.9</b>	<b>39.0</b>	<b>44.9</b>	<b>33.1</b>	<b>22.9</b>
<b>Concordance (%)</b>	<b>62.5</b>	<b>62.9</b>	<b>59.8</b>	<b>71.1</b>	<b>64.8</b>

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159 However, the sensitivity (percentage of correctly predicted genotoxic substances) as  
160 well as previously reported the specificity (percentage of correctly predicted non-  
161 genotoxic substances) of the current test is rather poor. In table 1 the specificity and  
162 sensitivity of the most commonly used *in vitro* genotoxicity tests are shown. It is clear  
163 that particularly the specificity of some tests is much too low for tests that are used for  
164 regulatory decisions [8], [9]). As the possibilities to update these tests are limited as was  
165 discussed before, the chances to improve the specificity and sensitivity are limited as  
166 well. That is why such a proposed standalone *in vitro* battery of tests can still be  
167 challenged regarding its lack of specificity.

168 Indeed, there is a strong ethical pressure and policy against the use of experimental  
169 animals. For example, there is already legislation for the testing of cosmetic ingredients  
170 where the use of *in vivo* tests is prohibited. That leads to carcinogenicity assessment  
171 being dependent on *in vitro* genotoxicity tests only, for which we just concluded that they  
172 are not optimal.

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174 Since 2005, several initiatives have been undertaken to improve the specificity of the *in*  
175 *vitro* tests without compromising sensitivity, e.g. preference for p53-competent human  
176 cells, cytotoxicity measures based on cell proliferation, carefully controlling the upper  
177 limit of cytotoxicity or the highest non-toxic concentration, all of which have been  
178 incorporated into the OECD guideline revisions [4].

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180 When *in vivo* studies are required, registrants are often sensitive to the 3R principles.  
181 This has contributed to an increase in the assessment of multiple genotoxic endpoints  
182 from the same animals . As an example, it is common that data from assays which  
183 combine a subacute toxicology study in the rodent, with micronucleus assessment in the  
184 blood, as well as comet assay in the liver [10] (figure 1) are presented in submitted  
185 dossiers. Combined studies are even recommended by regulations like the ICH S2 (R1)  
186 (step 4 version, 2011) [11] for assessing the potential genotoxicity of a substance under  
187 pharmaceutical regulation.

188 There is also be a good rationale to perform *in vivo* assays in rats rather than in mice for  
189 the *in vivo* micronucleus test. The logic behind is that there is usually more kinetic data  
190 available on rats compared to mice (e.g. absorption, distribution, metabolism, and  
191 excretion (ADME) studies). Toxicokinetic (TK) information is required in most regulations  
192 and is performed mainly on rats compared to mice, so when TK information is already  
193 available from previous TK studies, it is not required to repeat the generation of TK data  
194 during an *in vivo* micronucleus assay.

195 In addition, if the absorption has to be assessed during a micronucleus test to prove  
196 animal's exposure, rats should be also prioritized, if possible, since it is possible to use  
197 one animal for assessing the two different endpoints, i.e. bioanalysis and micronucleus  
198 assessment. In mice, assessment of both parameters would require double the animals  
199 because there is not enough blood available per animal to assess both endpoints.

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206 Figure 1: Combine multi-assay in *in vivo* rodent

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209 It is generally accepted that standard genotoxicity tests are rather old. The test strategy  
210 may use some refreshment. Most regulatory guidelines contain a list of tests which have  
211 to be ticked off, and they do not cover new endpoints or new groups of chemicals. It may  
212 also be time to think about a new approach for genotoxicity testing. A requisite for a new  
213 strategy is that the three genotoxic endpoints, gene mutations, structural chromosome  
214 aberrations and numerical chromosome aberrations are still covered. Moreover, there  
215 should be room for classic as well as new tests, but this will required a paradigm shift in  
216 genotoxicity thinking. A new harmonised and more advanced approach, should include  
217 options to use mechanism-based assays, and additionally, both toxicokinetics and  
218 exposure have to be included. Of course also the Adverse Outcome Pathway (AOP)

219 science will be a substantial part of it. However, the most dramatic change in thinking,  
220 will be that the test substance and not the list of tests (the strategy) should be the main  
221 consideration. On a substance by substance basis the real strategy for each specific  
222 substance has to be determined. The idea is that there is a general framework of a  
223 strategy that will be fine-tuned for each single substance, and chemical group.  
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225 One of the major changes will be that, based on the strong ethical pressure and policy  
226 against the use of experimental animals, the framework predominantly or even  
227 exclusively consists of *in vitro* genotoxicity tests. Fortunately, there is already experience  
228 with what can be expected when *in vivo* tests are not allowed. Since the marketing ban  
229 of March 11, 2013 [12], in Europe *in vivo* testing is prohibited for cosmetic products or  
230 ingredients, irrespective of the availability of alternative non-animal tests. This major  
231 change, lead to evaluations on genotoxicity of cosmetic ingredients being done  
232 exclusively *in silico*, i.e. QSAR and read across, or on *in vitro* tests, i.e. the gene mutation  
233 test in bacteria and the *in vitro* micronucleus test. A conclusion when one of the two  
234 tests was positive (considered genotoxic) or negative (considered non-genotoxic) may  
235 be clear but difficulties were expected when one or the 2 tests was positive. In the end  
236 the problems were excellently tackled by collaboration between all stakeholders,  
237 including industry and regulatory institutes. It resulted in a revised Notes of Guidance  
238 [13] in which it is stated that the test should be critically evaluated for e.g. false positive  
239 results. The latter may, for example, be the result of the quality of a study, excessive  
240 cytotoxicity, positive results inside the historical control data or by the presence of  
241 impurities. For specific tests like the gene mutation test in bacteria, the reason for a false  
242 positive result may be bacterial toxicity or specific metabolism in bacteria.  
243

244 If after checking for false negatives the positive result remains, then further testing may  
245 be considered. Further tests can be classic genotoxicity tests like the mammalian  
246 chromosomal aberration test or the gene mutation test in mammalian cells, but also  
247 tests for which an OECD test guideline is not available like the 3D-skin micronucleus  
248 test, the 3D-skin comet assay,  $\gamma$ H2AX assay, the hen's egg test (Het) micronucleus test,  
249 indicator approaches like Multiflow or Toxtracker and even techniques which are very  
250 new like array approaches, next generation sequencing or recombinant cell models. A  
251 prerequisite is that a justification for the test is available and that the final conclusion is  
252 made on weight of evidence. Until now, excessive problems in deciding whether a  
253 substance is genotoxic or not did not occur. Industry screens their new substances also  
254 for genotoxicity and uses sensitive new techniques including systems biology and high  
255 throughput tests. Why is it not possible to use new approaches for decision making as  
256 well, rather than sticking with the rather old fashioned tests low throughput and low  
257 content assays as described before!  
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259 A common comment on why these new approaches are not suitable, is that they are not  
260 validated and that an OECD test guideline for these tests is not available. Of course this  
261 is true, and the lack of protocol standardisation comes with its own issues. On the other  
262 hand, adequate scientific justification of why a specific test is used along with a clear  
263 study design and test protocol, should be sufficient to overrule the comment that an  
264 OECD test guideline is not available. Moreover, the tests mentioned are already known

265 in the genotoxic community as well as their characteristics. Concerning validation, that is  
266 a more difficult story. The present validation project is a long, time consuming and  
267 expensive course. Today, there is much discussion regarding the simplification of the  
268 validation process [14, 15]. Hopefully this will lead in the near future to a shorter process  
269 without losing the same level of quality.

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271 It may be time to think about a new strategy for genotoxicity testing [16], or at least  
272 introducing increased flexibility for inclusion of new approaches. When developing a new  
273 strategy, it would be worthwhile considering an overall strategy for genotoxicity testing  
274 that fits for all substances: chemicals, drugs, cosmetic ingredients, food etc. It is clear  
275 that all strategies are similar, which is expected since they are all designed for detecting  
276 hazard. Determination of genotoxic hazard can be performed identically according to  
277 one single strategy for all groups of substances. However, divergences in regulatory  
278 guidelines become important when the risk of the hazard is considered: e.g. no  
279 genotoxic substance in food or a risk/benefit approach for drugs/chemicals.

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281 Such a new framework is already described by the “clean sheet” workgroup of the  
282 Genetic Toxicology Technical Committee (GTTC) of the Health and Environmental  
283 Sciences Institute (HESI) [16]. In this framework the substance is leading. Figure 2  
284 clearly shows the different steps to be taken in such a new approach. It is clear that next  
285 to the planning and scoping, also exposure, knowledge base, test selection and  
286 appropriate Point of Departure (PoD) selection play a very important role. In the paper  
287 by Dearfield et al., 2017 [16] all steps are clearly explained. In the end it should lead to  
288 estimated acceptable levels for endpoint of human exposure and risk characterization.  
289 This “Clean Sheet framework” is now tested with (industrial) case studies.

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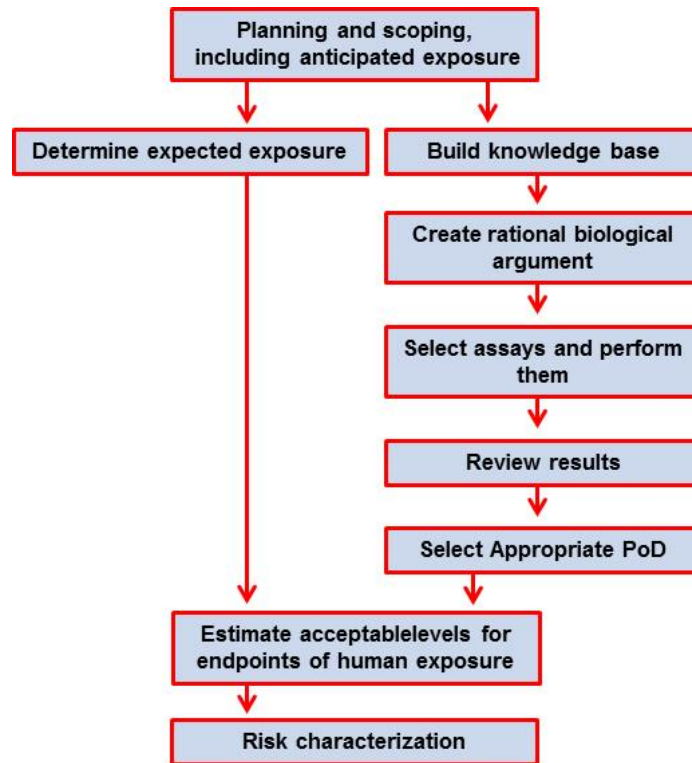
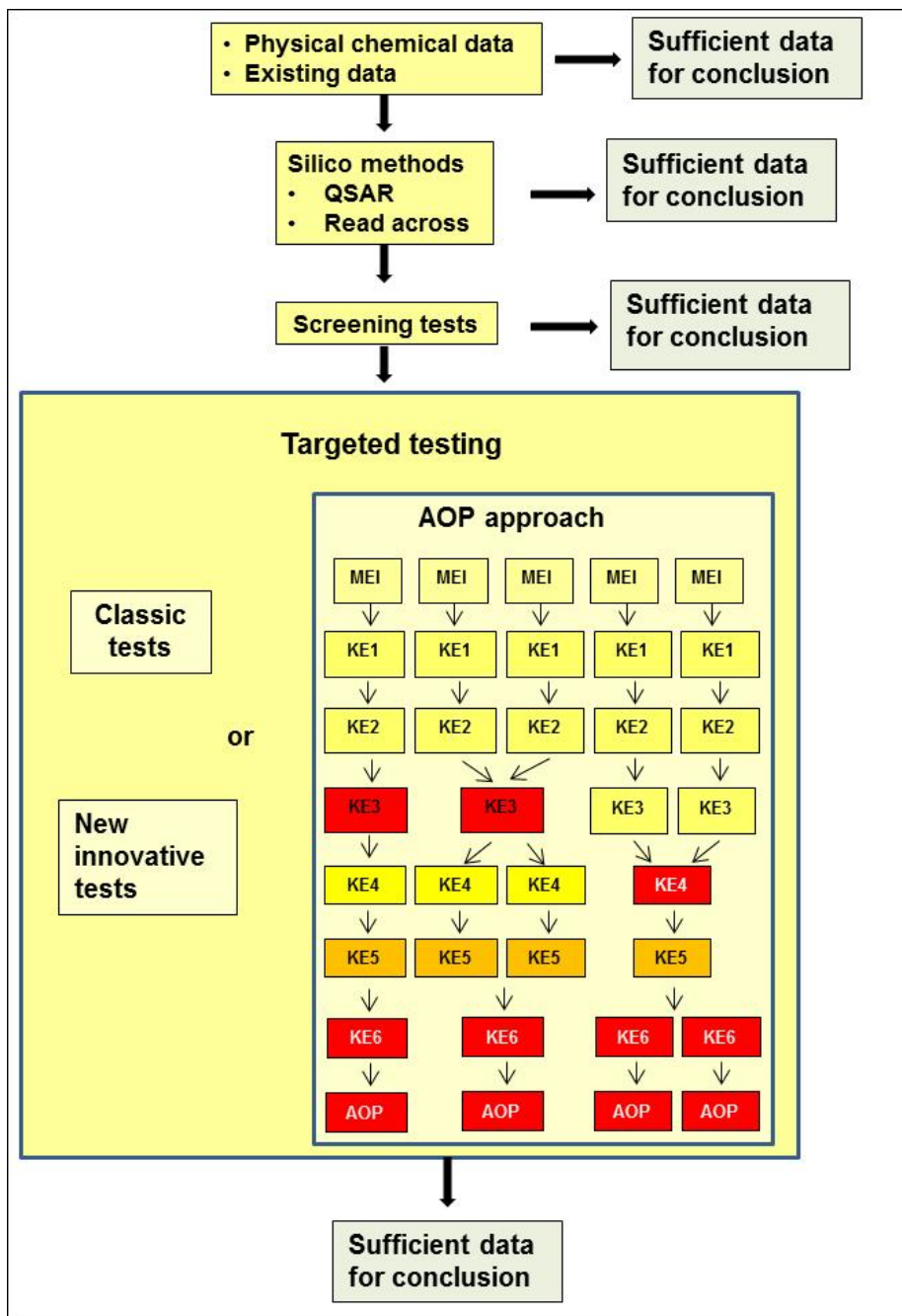


Figure 2: Strategy for examining genomic damage (from Dearfield et al., 2017 [16])

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In figure 3, this theoretical framework is filled in in a more practical way. Still the substance is leading and it starts with a planning and scoping including which factors are important for a specific risk assessment of a specific substance. Relevant questions are, for example, how humans are exposed, are some population groups more sensitive for the substance, which legislation is applicable. The first step in a putative framework could deal with consideration of physical chemical data and/or existing data. Theoretically this may give enough information for a conclusion on genotoxicity of the substance, e.g. when there is no exposure, testing is redundant. Other follow up levels may be *in silico* methods, like quantitative structure activity relationship (QSAR) and read across as well as screening tests.





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Figure 3: Putative strategy to determine the genotoxicity of substances. Following exposure with a substance, a Molecular Initiating Event (MEI) will be generated followed by Key Event(s) (KE) leading to the characterization of an AOP in a dedicated matrix (cell, protein-chips, etc.).

Most of EU regulations like REACH regulation EC [17], pesticide (PPP) [18], biocide (BPR) [19] and many others have a common philosophy in line with the above suggestion. The philosophy is to reduce the use of animals for experiments by using a

324 tiered approach, requesting at first alternative, assays like *in vitro* tests and/or *in silico*  
325 tools. The cosmetic regulation (1223/2009) [12] is even more drastic, because animal  
326 use is completely forbidden for experimental use.

327 For screening purposes, these tendencies or requirements have enhanced an  
328 adaptation of industrials from the 2000's in terms of assay development or alternative  
329 method developments. As an example *in silico* tools have been well developed and  
330 applied in genotoxicology for many years, giving a wide range of (Q)SAR tools with a  
331 powerful ability to predict genotoxic potency of a substance [20]. It is nevertheless not  
332 possible to replace completely *in vitro* or *in vivo* assays by these *in silico* tools. In fact,  
333 (Q)SAR are currently considered for providing alerts on hazardous substances.  
334 However, they are also tools which can be used to replace some classic assays for  
335 some regulations like REACH particularly for well studied groups of compounds, and this  
336 option is possible for many endpoints required in REACH, i.e. from ecotoxicology to  
337 toxicology assays (Annex XI of REACH regulation) [17]. Currently, it looks like  
338 nevertheless that these *in silico* tools are essentially accepted as "supporting studies" by  
339 regulators, so the "key study", i.e. the main assay (*in vitro* or *in vivo*) is still essential for a  
340 substance submission under REACH. Thus far, the authors are unaware whether  
341 genotoxicity data obtained by *in silico* tools only was allowed to address the requirement  
342 for a substance submission under REACH.

343 Concerning screening tests, one may think of all kinds of high throughput tests that  
344 already are commonly used for decision making purposes within the industrial setting.  
345 Again the combined information from these different assays may be good enough to  
346 conclude on genotoxicity. However, this conclusion can probably only be taken after  
347 targeted testing and information on a putative mode of action becomes clear. For  
348 targeted testing one should think of using an already available AOP in full in first  
349 instance or a tiered number of classical or new innovative genotoxicity tests. Until now  
350 six genotoxicity AOPs are available [21-23].

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352 Targeted testing may be repeated as one or more modes of action may be applicable.  
353 When *in silico* and *in vitro* analysis does not give a reliable answer, *in vivo* testing may  
354 be considered, but as a last resort. In the end it should lead to a final conclusion on  
355 genotoxicity for this specific substance according to this specific strategy.

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358 Most of the available results in genetic toxicology are focused on bacterial or somatic  
359 cells. Currently, the Global Harmonized System (GHS) which is used in most of  
360 substance/mixture evaluation regulations (i.e. pesticide, biocide, drug...) [24] contains a  
361 germ cell mutagen classification. Therefore, there seems to be a gap between what is  
362 most available, i.e. data from bacterial and somatic cells and the requirements to  
363 conclude on substance classification, i.e. germ cells.

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365 Today, most EU regulations try to avoid the use of *in vivo* tests in genotoxicology as  
366 much as possible, only some still require such performance independently of *in vitro*  
367 results. For example, pesticide regulation [18] required the systematic performance of an  
368 *in vivo* rodent assay. The consequence is that most results generated for a substance in  
369 genotoxicity assays are mainly available in *in vitro* tests and more seldom in *in vivo* tests  
370 that, are predominantly performed on somatic cells. The impact is not neutral,

371 particularly for the substance classification under the Global Harmonization System  
372 (GHS) [25], because GHS requires germ cell genotoxicity data for classification (Table  
373 2). With data available mainly on somatic cells, it is therefore difficult to conclude on a  
374 substance classification, because nearly no information is available on germ cells [26].  
375 In the GHS, the category 1A or 1B will lead to a market ban of substance or mixtures.  
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377 Another problem is that currently, regulations recognize only animal assays to have the  
378 ability to assess the genotoxic potential in germ cells. Among the *in vivo* assays  
379 available to assess germ cell potent genotoxicity are:

- 380 - The transgenic mice test (OECD 488) [2] which has the ability to detect gene  
381 mutations in the mouse or rat.
- 382 - The rodent dominant lethal test (OECD 478) [27], the mammalian spermatogonial  
383 chromosomal aberration test (OCDE 483) [28] and the mouse heritable  
384 translocation assay (OCDE 485) [29] these last three allow to detect  
385 chromosomal aberration endpoint.

386 These tests are very demanding, use a lot of animals and are therefore far from the 3R  
387 principles. In addition, these tests are not performed by a lot of laboratories which make  
388 their use very difficult for most of industrials.  
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392 Moreover, there is no example of a substance positive only in germ cells and not in  
393 somatic cells in genotoxicity. This statement is clearly indicated in the guidance on  
394 genotoxicity testing and data interpretation for pharmaceuticals intended for human use  
395 (ICH S2 (R1): 2.4 Germ cells paragraph) [11]. Based on the present knowledge and the  
396 presently available tests, which are insensitive and uses large numbers of animals, germ  
397 cell genotoxicity testing may be considered redundant. However, in a recent review  
398 Marchetti et al. (2019, in press) [30] report on indications that many substances may  
399 also be a risk for human germ cells, justifying germ cell testing.

400 To focus on the germ cells is not necessarily to claim that germ cells and somatic cells  
401 are different, it can be more driven by the fact that the kinetics of substances are not the  
402 same between substances. Consequently a substance could be positive in somatic  
403 cells, whilst it is negative in germ cells, for instance because it is not able to reach the  
404 germ cells. Marchetti et al. [30] indicate that if mutation is considered a toxicological  
405 endpoint and mutation will be used in human risk assessment, the PoD for germ cells  
406 surely will be different from PoD's in somatic cells which makes germ cell mutagenicity  
407 testing essential. Therefore, the idea to focus in somatic cells only for the GHS  
408 classification purpose instead of germ cells is not always applicable.  
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415 Table 2: Hazard categories for germ cells mutagens extracted from ECHA guidance (v.5,  
416 2017)

**Annex I: 3.5.2.2.** For the purpose of classification for germ cell mutagenicity, substances are allocated to one of two categories as shown in Table 3.5.1.

**Table 3.5.1**  
**Hazard categories for germ cell mutagens**

Categories	Criteria
<b>CATEGORY 1:</b>	<p>Substances known to induce heritable mutations or to be regarded as if they induce heritable mutations in the germ cells of humans.</p> <p>Substances known to induce heritable mutations in the germ cells of humans.</p>
<b>Category 1A:</b>	<p>The classification in Category 1A is based on positive evidence from human epidemiological studies.</p> <p>Substances to be regarded as if they induce heritable mutations in the germ cells of humans.</p>
<b>Category 1B:</b>	<p>The classification in Category 1B is based on:</p> <ul style="list-style-type: none"> <li>– positive result(s) from in vivo heritable germ cell mutagenicity tests in mammals; or</li> <li>– positive result(s) from in vivo somatic cell mutagenicity tests in mammals, in combination with some evidence that the substance has potential to cause mutations to germ cells. It is possible to derive this supporting evidence from mutagenicity/genotoxicity tests in germ cells in vivo, or by demonstrating the ability of the substance or its metabolite(s) to interact with the genetic material of germ cells; or</li> <li>– positive results from tests showing mutagenic effects in the germ cells of humans, without demonstration of transmission to progeny; for example, an increase in the frequency of aneuploidy in sperm cells of exposed people.</li> </ul>
<b>CATEGORY 2:</b>	<p>Substances which cause concern for humans owing to the possibility that they may induce heritable mutations in the germ cells of humans.</p> <p>The classification in Category 2 is based on:</p> <ul style="list-style-type: none"> <li>– Positive evidence obtained from experiments in mammals and/or in some cases from in vitro experiments, obtained from: <ul style="list-style-type: none"> <li>– Somatic cell mutagenicity tests in vivo, in mammals; or</li> <li>– Other in vivo somatic cell genotoxicity tests which are supported by positive results from in vitro mutagenicity assays.</li> </ul> </li> </ul> <p>Note: Substances which are positive in in vitro mammalian mutagenicity assays, and which also show chemical structure activity relationship to known germ cell mutagens, shall be considered for classification as Category 2 mutagens.</p>

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426 Until now the genotoxicity of chemicals has been evaluated in a yes/no fashion.  
427 Genotoxicity is hazard assessment. But there is already a paradigm shift ongoing from  
428 this qualitative approach into a quantitative approach. Dose response modelling to  
429 establish a PoD was introduced in genotoxicity testing. Assessing the potency and PoD  
430 in addition to the positive/negative effect, leads to the use of mutations for human health  
431 risk assessment. In fact there are already examples where this approach was  
432 successfully used [31-33]. In this approach gene mutation has to be considered as a  
433 toxicological endpoint. For more detail on this consideration see the review by Heflich et  
434 al. (2019, in-press) [34].

435  
436 The idea of quantitative genetic toxicology is to advance beyond the standard hazard  
437 assessment of substances, to a risk based approach. This changes the assessment  
438 from whether substances are genotoxic or not genotoxic to calculations of exposure  
439 levels that are of negligible concern to the exposed population. Advancements have  
440 been made in defining PoD metrics from genetic toxicity data, and this has progressed  
441 the consideration of these data for risk assessment purposes. The standard genetic  
442 toxicity models of the *in vivo* micronucleus assay and the transgenic gene mutation tests  
443 are suitable for dose response analysis and derivation of PoD. These *in vivo* assays can  
444 be assessed using Benchmark Dose (BMD) analysis. The BMD approach uses  
445 statistical models to define a small but measurable increased above the background,  
446 and it is a more advanced statistical approach than pairwise testing which is used to  
447 derive No Observed Effect Levels (NOEL).

448  
449 Some recent developments with the BMD approach have led to increase precision, with  
450 the major ones being the covariate BMD approach put forward by Slob and Setzer [35]  
451 which uses conserved shape parameters to increase precision in the analyses. Another  
452 improved part of BMD analysis comes from adjusting the Critical Effect Sizes (CES)  
453 from the default of 5% or 10% to a higher part of the dose response. Slob [36] and Zeller  
454 et al. [37], used extensive data sets to calculate that for genetic toxicity data sets, a CES  
455 of 50% should be used. Both modifications to the BMD analysis, lead to decreased  
456 range in BMD confidence interval and increased precision in the BMD.

457  
458 There are numerous different approaches for calculating human exposure limits using  
459 genetic toxicity PoD metrics. They are the same as those derived using PoD from other  
460 toxicological endpoints, or even from the cancer bioassay. The calculations involve an  
461 extrapolation to a human comparable dose, and then division by a number of  
462 uncertainty/adjustment factors to cover the diversity of the human population, the study  
463 duration, severity of endpoint, animal model being used, and which metric was being

464 used. This provides a number such as a Permissible Daily Exposure (PDE), Acceptable  
465 Daily Intake (ADI) or other comparable approaches [38]. There is also the less complex  
466 method, where the PoD is divided by the human exposure level, to calculate the Margin  
467 of Exposure (MOE). If the MOE is over 10,000, then it is considered to be of negligible  
468 concern, but a cause for concern if the MOE is below this value.

469  
470 The HESI GTTC has been tasked with publishing case studies, where example  
471 substances are assessed using these different approaches. In the most case examples,  
472 PDEs were calculated and compared based on genetic toxicity data and cancer  
473 bioassay data for certain alkylnitrosamines. These have recently been identified as  
474 impurities in some pharmaceutical products, and the products were recalled. It is  
475 therefore important to determine whether the exposed population has an increased risk  
476 of mutation and cancer due to this exposure. The PDE derived from the cancer bioassay  
477 data were excellent due to the high power and high-quality cancer bioassay study for the  
478 alkylnitrosamines N-nitrosodiethylamine (NDEA) and N-nitrosodimethylamine (NDMA).  
479 Data from the transgenic gene mutation studies were also good, but the studies included  
480 short term dosing, so the adjustment factors were larger and potentially required further  
481 adjustment. However, in this case, the PDEs were comparable and the mutation PDEs  
482 supported the cancer bioassay derived PDEs. For N-Nitrosodibenzylamine (NMBA), no  
483 suitable cancer bioassay data were available, however the gene mutation data were  
484 relevant and usable. These case studies show that PDE can be derived, but there are  
485 still ongoing discussions about when they would be suitable for use in a risk  
486 assessment. The major considerations are that the dosing strategy and study design  
487 should be suitable, and that multiple data sets are available to derive the PoD. Extensive  
488 mechanistic understanding for a defined non-linear or threshold dose response are  
489 required for the PDE or MOE type approach.

490  
491 Benzene has also become an interesting case study. In 2018, ECHA carried out a risk  
492 assessment for benzene, used the *in vivo* micronucleus data to define Occupational  
493 Exposure Levels (OELs), and these were compared to those from OELs using human  
494 exposure data. They were very comparable, and when the *in vivo* MN data were re-  
495 analysed using the new best practice of covariate BMD and a CES of 50%, the data  
496 were of great interest and provided a higher utility than those derived from the previous  
497 analysis [39].

498  
499 We are currently at a transition, where the science used to justify carrying out human  
500 health risk assessments based on genetic toxicology data sets is suitable. However,  
501 there needs to be a development of case studies in order to overcome the numerous  
502 hurdles that are appearing. This will take time, and acceptance will be supported through  
503 the development of numerous case studies in the different areas from pharmaceutical  
504 impurities, food contaminants, industrial chemicals, cosmetics etc.

505  
506 Resistance to using genetic toxicology data for human health risk assessments is  
507 common within the field. The main arguments are;

- 508 1. Is genetic damage a relevant endpoint in itself, or should the risk assessment be  
509 carried out on the apical endpoint of cancer?
- 510 2. Which endpoint should be used to derive the PoD for the human exposure limit?
- 511 3. Which study design, including acute, sub-chronic or chronic dosing, number of  
512 days, replicate number, and more.
- 513 4. The adjustment factors are also a huge area. Issues include which factors to use  
514 for the exposure time, 1-10 or even higher? Severity of endpoints, is mutation as  
515 severe as cancer?
- 516 5. How much mechanistic data is required to support the use of a PDE through the  
517 'threshold mechanism' type approach, outlined in the ICH M7 framework?

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#### 521 Future perspectives for quantitative genetic toxicology

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523 Once the issues have been overcome, the result will be that genetic toxicity data can be  
524 used for risk assessment purposes. *In vivo* data from relevant endpoints of mutation  
525 and/or chromosome damage will be used to derive BMDL metrics from which Health  
526 Based Guidance Values (HBGV) will be calculated. These will be compared with those  
527 derived from other toxicological endpoints, and the most relevant and most conservative  
528 metric will be used as the final value from which the risk assessment is carried out. This  
529 is based on the recognition that mutation is a relevant endpoint and that the human  
530 population should be protected from increased risk of mutation [34]. In addition to this,  
531 mutation is linked with cancer, and the development of case studies will potentially show  
532 that genetic toxicity based HBGV will be comparable to those from the cancer bioassay,  
533 obviously ensuring exposure, tissue, study design, adjustment factors are suitable. Such  
534 a major advancement will lead to a reduction in animal testing through less cancer  
535 bioassay studies being required, and additionally through the increased use of combined  
536 genetic toxicity assays.

537  
538 Additional advances that could improve risk assessment based on genetic toxicity data,  
539 would be the use of next generation sequencing in place of transgenic gene mutation  
540 data. This would lead to mutations in cancer genes and other disease related genes  
541 forming the assessment, which would increase relevance of the mutation endpoint for  
542 use in risk assessment.

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547 **Summary and perspectives**

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549 The field of genetic toxicity testing is strongly in motion. There are many new  
550 developments and approaches, including the development of high throughput and  
551 screening tests. *In silico* approaches like QSAR and read across are generally accepted.  
552 The idea for quantitative genotoxicity, in which genotoxicity is a toxicological endpoint,  
553 gains more and more ground. Taking into account the quality of the current classical  
554 tests as compared to the new developments, it may be clear that genotoxicity testing is  
555 ready for an update.

556 There is no need to immediately go to a clean sheet approach but why not start with  
557 considering the chemical as the lead and not the tests, and think of, next to the classical  
558 strategy, an alternative new approach and framework when preparing a legislation  
559 dossier. Hopefully this will trigger a new framework in the near future.

560

561 Databases using a significant number of substances, indicate that *in vitro* test batteries  
562 using the Ames test as well as the micronucleus assay would have a sensitivity of nearly  
563 100% making the use of animals test not necessary. The drawback is that there is a lack  
564 of specificity of such tests that could make their use, as standalone, critical.

565 Currently, although many data are available on somatic cells, on substances or  
566 mixtures, they will not allow to classify a substance according to the GHS which is  
567 mainly based on germ cells results. As there is no unique germ cell mutagen, it would  
568 therefore be more appropriate to change the GHS for the genotoxicity classification and  
569 propose instead *in vivo* assays in somatic cells instead of germ cells.

570

571 We are currently at a transition, where the science is developing in order to justify  
572 carrying out human health risk assessments based on genetic toxicology data sets,  
573 which is supported by mechanistic data and exposure data. With this in mind, *in vitro*  
574 genetic toxicity data should be used for potency ranking and mechanistic understanding  
575 which can support the *in vivo* derived BMDL and HBGV. Future advances in this area, in  
576 line with the efforts from EPA [40] will lead to *in vitro* to *in vivo* comparisons to allow  
577 calculation of usable BMDL from *in vitro* studies. However, there are numerous issues  
578 that need to be overcome in order to address the shortcomings of the current  
579 approaches in this area. *In silico* analysis combined with potency ranking, chemical  
580 grouping and chemical categorization also offer opportunities to enhance the application  
581 of *in vitro* data.

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587 **Bibliographical review**

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