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4 Understanding the implications of dissolved organic carbon when
5 assessing antagonism *in vitro*: An example with an estrogen receptor assay
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21 *Submitted to:* Chemosphere

22 *Date Re-submitted:* April 2015
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33 **Abstract**

34 Both estrogenic and anti-estrogenic activity has been observed in water samples. Some studies have
35 suggested that dissolved organic carbon (DOC), which can be co-extracted during sample
36 enrichment, contributes to the apparent antagonistic effect. DOC has a high sorption capacity for the
37 estrogen receptor (ER) agonist 17 β -estradiol, which may reduce the available 17 β -estradiol
38 concentration in the antagonist testing mode and potentially lead to apparent antagonism. The aim
39 of the study was to determine the influence of DOC when assessing antagonism in an ER reporter
40 gene assay. The presence of DOC shifted the 17 β -estradiol concentration-effect curve to higher
41 concentrations, increasing the nominal EC₅₀ value by up to 0.3 log units. However, this shift was
42 within the usual variability associated with repeated measurements of concentration-effect curves.
43 This shift was not due to DOC being an antagonist itself or interfering with fluorescence
44 measurements, but was due to DOC reducing the bioavailability of 17 β -estradiol. This was
45 demonstrated by modelling the DOC sorption corrected 17 β -estradiol concentration using
46 experimental DOC-water partition coefficients (K_{DOC}). While the shift in the 17 β -estradiol
47 concentration-effect curve was minor, sorption of 17 β -estradiol to DOC can have an impact when
48 assessing antagonism. At the EC₅₀ agonist concentration, both modelled and experimental results
49 showed that DOC at concentrations similar to that co-extracted in water samples caused suppression
50 of the agonist at levels that would be classified as antagonism. The suppression was less
51 pronounced at the EC₈₀ agonist concentration, hence this is recommended when assessing
52 antagonism of DOC rich samples, such as surface water and wastewater.

53

54 **Keywords:** antagonism; dissolved organic carbon; estrogen receptor; *in vitro*

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56 **1. Introduction**

57 The aquatic environment contains countless micropollutants from sources including wastewater
58 effluent and agricultural run-off (Schwarzenbach et al., 2006). Of particular concern for aquatic
59 wildlife and human health are endocrine disrupting chemicals, which include natural and synthetic
60 hormones, as well as some industrial compounds and pesticides (Bergman et al., 2013). *In vitro*
61 reporter gene assays, such as the yeast estrogen screen (YES) and ER-CALUX, are commonly
62 applied to assess both estrogenic and anti-estrogenic activity of water samples, including
63 wastewater and surface water (van der Linden et al., 2008; Zhao et al., 2011; Scott et al., 2014). In
64 recent years, many studies have observed both estrogenic and anti-estrogenic effects in water
65 samples (e.g. Ihara et al., 2014; Rao et al., 2014) and this has been attributed to a range of factors
66 from the presence of industrial compounds (e.g. Fang et al., 2012) to potential matrix effects from
67 organic matter (e.g. Conroy et al., 2007).

68
69 Surface water and wastewater can contain high levels of dissolved organic carbon (DOC) and this
70 can be co-extracted with other organic contaminants during solid phase extraction (SPE), which is
71 often used for sample enrichment prior to bioanalysis. Studies focusing on reference DOC, which
72 should not contain micropollutants, have also observed apparent anti-estrogenic (Janosek et al.,
73 2007; Wu et al., 2009) and anti-androgenic effects (Bittner et al., 2012). There are several
74 possibilities to explain these observations: either 1) DOC can act as an antagonist, or DOC
75 interferes with an assay parameter causing experimental artefacts, for example 2) the properties of
76 DOC, such as autofluorescence, interfere with the reporter gene assay measurement, or 3) DOC
77 modulates the agonist concentration used in the assay.

78
79 The potential for DOC to alter the agonist concentration (option 3) has not been evaluated in the
80 literature to date, despite it being plausible, given the experimental methodology applied to assess
81 antagonism for reporter gene assays. A constant concentration of agonist, such as 17 β -estradiol for
82 the estrogen receptor (ER) assay, is added and any antagonistic compounds in the sample can
83 compete with the agonist for binding sites, leading to inhibition of the agonist background. The
84 agonist concentration used in bioassays run in antagonist mode can vary from the concentration
85 causing 50% effect (EC₅₀) up to EC₁₀₀ (van der Linden et al., 2008; Ihara et al., 2014). The
86 commonly used ER agonist 17 β -estradiol, which is a moderately hydrophobic compound, can sorb
87 to DOC, with DOC-water partition coefficients (K_{DOC}) ranging from 5.1 \times 10³ to 1.9 \times 10⁵ L/kg,
88 depending on the DOC properties (Yamamoto et al., 2003; Neale et al., 2008). Given the strong
89 sorption capacity of DOC, it is possible that the reported anti-estrogenic effects in natural waters are
90 related to the presence of co-extracted DOC, which can decrease the available 17 β -estradiol

91 concentration and cause the apparent antagonism. Buckley (2010) attempted to exclude the
92 influence of co-extracted DOC by filtering wastewater SPE extracts through a membrane with a
93 1000 Da molecular weight cut-off. While some fractions of DOC are larger than 1000 Da, such as
94 biopolymers, many fractions are smaller, including humic substances and low molecular weight
95 neutrals (Huber et al., 2011), thus such a filtration processes is unlikely to remove a significant
96 fraction of the total DOC.

97

98 With a specific focus on the ER assay, this study aimed to test the hypothesis that the reported
99 antagonism in the presence of reference DOC is caused by the reduction of the unbound agonist
100 concentration due to sorption to DOC. This was explored using both an experimental and modelled
101 approach by applying experimental K_{DOC} values. Suwannee River humic acid (HA) and fulvic acid
102 (FA) were selected as representative DOC. The study also investigated the implications of co-
103 extracted DOC when assessing antagonism *in vitro* for DOC rich samples.

104

105 **2. Materials and Methods**

106 *2.1. Chemicals*

107 All chemicals were of analytical grade and were purchased from Sigma Aldrich (Castle Hill,
108 Australia), unless otherwise specified. Suwannee River HA (2S101H) and FA (2S101F) standards
109 from the International Humic Substance Society (St. Paul, US) were used as reference DOC.

110

111 *2.2. Predicting 17 β -estradiol binding to dissolved organic carbon*

112 The amount of 17 β -estradiol binding to DOC was estimated using experimental DOC-water
113 partition coefficients (K_{DOC}) from Neale et al. (2008). K_{DOC} is defined as the ratio of the 17 β -
114 estradiol concentration sorbed to DOC (C_{DOC} , ng/kg) to the aqueous 17 β -estradiol concentration
115 (C_{w} , ng/L) (Equation 1), where n_{DOC} is the amount sorbed to DOC (ng), n_{w} is the amount in water
116 (ng), m_{DOC} is the mass of DOC in the system (kg) and V_{w} is the volume of water (L).

117

$$K_{\text{DOC}} = \frac{C_{\text{DOC}}}{C_{\text{w}}} = \frac{n_{\text{DOC}}}{m_{\text{DOC}}} \cdot \frac{V_{\text{w}}}{n_{\text{w}}}$$

118
119 (1)
120

121 The applied log K_{DOC} values were 4.04 and 3.78 L/kg for HA and FA, respectively. The fraction of
122 17 β -estradiol sorbed to DOC (f_{DOC}) can be calculated using Equation 2 (Neale et al., 2011).

123

$$f_{\text{DOC}} = \frac{n_{\text{DOC}}}{n_{\text{DOC}} + n_{\text{w}}} = \frac{1}{1 + \frac{V_{\text{w}}}{(m_{\text{DOC}} + K_{\text{DOC}})}}$$

124

125

126

127 This equation can be re-arranged to calculate the mass of DOC required to bind a certain fraction of
 128 17β -estradiol (Equation 3).

129

$$m_{\text{DOC}} = \frac{V_{\text{w}}}{\frac{1}{(f_{\text{DOC}} - 1)}} \cdot \frac{1}{K_{\text{DOC}}}$$

130

131

132

133 The mass of DOC predicted to sorb 20 to 60% of 17β -estradiol ranged from 9.12×10^{-10} to 5.47×10^{-9}
 134 kg for HA and 1.66×10^{-9} to 9.96×10^{-9} kg for FA. This translates to 22.8 to 136.8 mg_C/L and 41.5 to
 135 248.9 mg_C/L for HA and FA, respectively, based on a final volume of 40 μL in the assay.

136

137 The concentration of 17β -estradiol ($C_{\text{DOC-sorption corrected}}(\text{E2})$) in the presence of DOC in the assay
 138 was calculated from the nominal (i.e., added) concentration ($C_{\text{nominal}}(\text{E2})$) and f_{DOC} (Equation 4). It
 139 is important to note that $C_{\text{DOC-sorption corrected}}(\text{E2})$ relates only to sorption to DOC and binding to
 140 media components, such as cells and serum, was neglected in the current study.

141

$$C_{\text{DOC-sorption corrected}}(\text{E2}) = (1 - f_{\text{DOC}}) \cdot C_{\text{nominal}}(\text{E2})$$

142

143

144

145 2.3. ER assay

146 The GeneBLAzer® ER α -UAS-bla assay (Life Technologies, Mulgrave, Australia) was used in the
 147 current study. The HEK 293T cells were grown in DMEM with GlutaMAX™ supplemented with
 148 10% dialysed fetal bovine serum (FBS), while the assay media was phenol red-free DMEM with
 149 2% charcoal stripped FBS. Ten point concentration-effect curves of agonist 17β -estradiol were
 150 prepared across a 96 well plate using a 2.5×10^{-5} M 17β -estradiol methanol stock, with media only
 151 in the last two columns (plate A), while a second 96 well plate contained HA or FA dissolved in
 152 phenol red-free DMEM at concentrations expected to cause 20 to 60% 17β -estradiol binding in the
 153 final 384 well plate (plate B). Due to subsequent dilution steps, plates A and B were prepared at
 154 concentrations 10 times higher than the final assay concentration. Fifty microliters from each plate

155 A and B were mixed together in a separate 96 well plate and 8 μL was added in duplicate to a 384
 156 well black clear bottom plate containing 32 μL of cells at a density of 6.2×10^5 cells/mL. The
 157 solvent concentration in the 384 well plate was 0.2%. For validation, each plate contained agonist
 158 17β -estradiol and antagonist tamoxifen (with EC_{80} 17β -estradiol constant background)
 159 concentration-effect curves, along with solvent controls and cell free controls. The cells were
 160 incubated overnight in a 5% CO_2 incubator at 37 $^\circ\text{C}$. The following day 8 μL of LiveBLAzer™
 161 FRET substrate mixture was added to each well. Fluorescence at 460 and 520 nm was measured
 162 after excitation at 409 nm using a Fluostar Omega (BMG Labtech, Ortenberg, Germany) at time
 163 zero and after 2 h. The fluorescence of the cell-free controls was subtracted from the samples for
 164 each wavelength and the emission ratio of blue (460 nm) to green (520 nm) (B/G) was calculated
 165 (Equation 5), where F is fluorescence.

$$B/G = \frac{F_{\text{blue}}(T=2) - F_{\text{blue, cell-free}}(T=2)}{F_{\text{green}}(T=2) - F_{\text{green, cell-free}}(T=2)}$$

(5)

171 To assess if the properties of HA and FA were interfering with the fluorescence measurements, the
 172 autofluorescence corrected B/G emission ratio ($B/G_{\text{autofluorescence-corrected}}$) was calculated using
 173 Equation 6. The addition of the FRET reagent changed the emission spectra of HA and FA.
 174 Therefore, fluorescence of the samples measured immediately after the addition of LiveBLAzer™
 175 substrate, minus the fluorescence of the unexposed control, was subtracted from fluorescence of the
 176 samples measured after 2 h for both the blue and green output to correct for possible interference by
 177 autofluorescence of the sample.

$$B/G_{\text{autofluorescence-corrected}} = \frac{F_{\text{blue}}(T=2) - (F_{\text{blue}}(T=0) - F_{\text{blue-unexposed control}}(T=0))}{F_{\text{green}}(T=2) - (F_{\text{green}}(T=0) - F_{\text{green-unexposed control}}(T=0))}$$

(6)

182 2.4. Concentration-effect modelling

183 The B/G emission ratio could be converted to percent effect related to the maximum response (%
 184 effect) using Equation 7 with the B/G emission ratio of the unexposed control ($B/G_{\text{unexposed control}}$)
 185 and maximum B/G emission ratio (B/G_{maximum}).

$$\% \text{ Effect} = \frac{(B/G - B/G_{\text{unexposed control}})}{(B/G_{\text{maximum}} - B/G_{\text{unexposed control}})}$$

187

188

189

190 The concentration-effect curve was modelled using Equation 8, using parameters from an average
 191 17β -estradiol concentration-effect curve, including EC_{50} and slope, and $C(E2)$, which can either be
 192 $C_{\text{nominal}}(E2)$ or $C_{\text{DOC-sorption corrected}}(E2)$ (Equation 4). The concentration-effect curve was modelled
 193 for DOC concentrations expected to cause 20 to 60% binding.

194

$$\% \text{ Effect} = \frac{1}{1 + 10^{(\text{slope} \cdot (\log EC_{50} - \log C(E2)))}}$$

195

196

197

198 3. Results and Discussion

199 3.1. Influence of DOC on ER assay

200 When assessed in classical agonist mode, neither HA nor FA alone caused an effect in the ER
 201 assay, indicating that they are not estrogenic. This was not unexpected and has been observed
 202 previously by Janosek et al. (2007) and Chen et al. (2012). However, when either HA or FA was
 203 added to nominal 17β -estradiol concentration-effect curves at concentrations expected to cause 20
 204 to 60% binding to 17β -estradiol, the curves shifted to the right, leading to higher nominal 17β -
 205 estradiol EC_{50} values in the presence of DOC (Figure 1 (HA only) and Figure SI-1 (FA and replicate
 206 HA experiment)).

207

208 The amount of HA and FA added ranged from 22.8 to 136.8 mg_C/L and 41.5 to 248.9 mg_C/L ,
 209 respectively. Tanghe et al. (1999) also observed an increase in 17β -estradiol and nonylphenol EC_{50}
 210 values in the presence of 150 mg_C/L of HA. Similarly, Holbrook et al. (2005) observed an increased
 211 17β -estradiol EC_{50} value in the presence of colloidal organic carbon from a wastewater treatment
 212 plant and attributed this to the reduction in 17β -estradiol bioavailability due to sorption. In the
 213 current study, the presence of DOC increased the nominal 17β -estradiol EC_{50} value by up to 0.3 log
 214 units. However, it should be noted that the difference in EC_{50} values in the presence of DOC was
 215 within the usual variability observed for 17β -estradiol concentration-effect curves between different
 216 assay runs.

217

218

219 *3.2. Does DOC autofluorescence interfere with assay measurement?*

220 The spectral properties of DOC are known to interfere with bioassay measurements. For example,
221 HA and FA autofluorescence can interfere with chlorophyll fluorescence measurements using
222 imaging pulse amplitude modulation (PAM) fluorometry (Neale and Escher, 2014). Further,
223 Oosterom et al. (2005) also found that coloured compounds can interfere with FRET measurements
224 by increasing green fluorescence only, leading to a reduced B/G emission ratio. The potential for
225 HA and FA to interfere with the fluorescence measurement was assessed by subtracting the
226 background fluorescence at T=0. There was very little difference in the concentration-effect curves
227 with and without autofluorescence correction (Figure 2 (50% HA only) and Figure SI-2 (remainder
228 of HA and FA)), and the difference between corresponding EC₅₀ values was less than 0.05 log
229 units. This indicates that the observed shift in the concentration-effect curve was not due to DOC
230 autofluorescence causing an experimental artefact. Given that DOC does not appear to interfere
231 with the fluorescence measurements, the results will be expressed as percent effect related to the
232 maximum response from here on.

233

234 *3.3. Is DOC a non-competitive antagonist?*

235 The fact that neither HA nor FA significantly shifted the 17 β -estradiol concentration-effect curve to
236 the right indicates that they are not competitive antagonists. However, the presence of both HA and
237 FA, irrespective of concentration, suppressed the maximal B/G emission ratio response. This
238 occurrence has been previously attributed to the presence of non-competitive antagonists (Ihara et
239 al., 2014).

240

241 However, the observed decrease in maximal response did not occur in a dose-dependent manner,
242 which suggests that DOC is not a non-competitive antagonist. Instead, it is possible that HA and FA
243 is interfering with the hydrolysis of fluorescent FRET substrate. ER agonist exposed cells produce
244 enzyme beta-lactamase, which cleaves the fluorescent substrate and increases the blue fluorescence
245 signal. Previous studies have shown that the presence of HA and FA can reduce enzymatic cleavage
246 of proteolytic enzyme Pronase E (Jahnel and Frimmel, 1994).

247

248 To test this hypothesis, cells were exposed to 17 β -estradiol without DOC overnight in a 384 well
249 plate, with HA at concentrations expected to cause 20 to 60% binding added only with the FRET
250 substrate. Fluorescence was measured after 2 h exposure at room temperature. The addition of HA
251 in the FRET substrate did not cause the concentration-effect curve to shift to the right, but the
252 maximal response, now expressed as percent effect, was lower in the presence of HA (Figure 3).

253 This supports the hypothesis that DOC can interfere with the cleavage of the fluorescent substrate at
254 high beta-lactamase concentrations.

255

256 3.4. Contribution of sorption to DOC

257 The observed shift the 17 β -estradiol concentration-effect curve in the presence of DOC does not
258 appear to be related to non-competitive antagonism or the spectral properties of DOC. To test if the
259 increased nominal EC₅₀ values observed in the presence of DOC were due to reduced 17 β -estradiol
260 bioavailability, C_{DOC-sorption corrected} (E2) was predicted based on experimental K_{DOC} values taken
261 from Neale et al. (2008). The K_{DOC} values were quantified at environmentally relevant DOC
262 concentrations using negligible depletion solid-phase microextraction (nd-SPME) (Neale et al.,
263 2008). The experimental and modelled concentration-effect curves were plotted using both C_{nominal}
264 (E2) and C_{DOC-sorption corrected} (E2) (Figure 4). For this comparison, the slope of the concentration-
265 effect curves was fixed to that of 17 β -estradiol in DOC-free media (0.82 and 0.88 in replicate
266 experiments, respectively). When plotted using C_{DOC-sorption corrected} (E2), the experimental and
267 modelled concentration-effect curves overlapped and there was no observed shift to the right. This
268 suggests that the observed increase in nominal EC₅₀ values in the presence of DOC was related to
269 17 β -estradiol binding to DOC and consequently reducing its bioavailability.

270

271 3.5. Implications of co-extracted DOC when assessing antagonism

272 As demonstrated above, the presence of DOC can reduce the available concentration of agonist
273 17 β -estradiol, but the implications of this when assessing antagonism in *in vitro* assays, where a
274 nominal agonist concentration is added, is unclear. The nominal agonist concentration can vary
275 significantly between studies and can range from EC₅₀ to EC₁₀₀. To assess the influence of agonist
276 sorption to DOC, the change in percent effect of the nominal EC₅₀ and EC₈₀ agonist concentrations
277 in the presence of HA was shown in Figure 5A (data for FA in Figure SI-4A). Both the modelled
278 and experimental results showed a decrease in agonist response, with a greater decrease with
279 increasing DOC concentration, though there was considerable variability associated with the
280 experimental results.

281

282 When assessing antagonism, a cut-off of 20% suppression of the background agonist concentration
283 is often applied, with samples suppressing the agonist concentration by more than 20% considered
284 to be antagonists. To determine whether 17 β -estradiol sorption to DOC could lead to apparent
285 antagonism, percent effect was converted to percent suppression for both the nominal EC₅₀ and
286 EC₈₀ agonist concentrations (Figure 5B (HA only) and Figure SI-4B (FA)). Both the modelled and
287 experimental results showed that suppression was more pronounced for the EC₅₀ agonist

288 concentration, with the HA concentrations binding up to 50 to 60% of 17 β -estradiol leading to as
289 much as 35% suppression. This would most likely be reported as detectable antagonism. This effect
290 was less pronounced at the EC₈₀ agonist concentration, with around 20% suppression at the highest
291 HA concentration. The difference between EC₅₀ and EC₈₀ is because the rate of change as a
292 function of concentration is greatest at EC₅₀, hence small changes will have a bigger influence at
293 EC₅₀ compared to EC₈₀, as recently illustrated by Neale and Leusch (2015).

294

295 To put the results into context for environmental water samples, the amount of co-extracted DOC
296 typically added to the ER assay was estimated. This can depend on a number of factors including
297 DOC concentration in the source water, DOC extraction efficiency by SPE and dilution in assay.
298 The DOC concentration in surface water and wastewater can vary considerably and can range from
299 1 to 100 mg_C/L (Steinberg et al., 2006). For illustrative purposes, a DOC concentration of 10 mg_C/L
300 was assumed and in this example 1 L of water was enriched to a final volume of 0.5 mL using SPE
301 to give an enrichment factor of 2000. Regarding SPE extraction efficiency, this can be influenced
302 by the SPE material and DOC properties. Previous work on co-extraction of wastewater derived
303 DOC by Oasis HLB cartridges, a commonly used SPE material for complex water samples, showed
304 DOC extraction efficiency can vary from 40-70% (Neale and Escher, 2014). Consequently, DOC
305 extraction efficiencies of 40 and 70% were applied for this example. Finally, the amount of dilution
306 in the assay can vary depending on sample potency and solvent effects. For this example, 100 times
307 dilution in the assay was assumed, as this is commonly used for environmental samples in the
308 applied assay. Applying these parameters gives a maximum DOC concentration in the assay
309 ranging from 80 to 140 mg_C/L. Based on Figure 5, sorption to DOC in this concentration range
310 could lead to greater than 20% suppression of the agonist concentration, particularly if an EC₅₀
311 agonist concentration is used, and an erroneous description of the sample as "containing anti-
312 estrogenic compounds".

313

314 However, it should be noted that DOC from other sources can have different sorption capacities
315 compared to HA and FA. For example, previous work by Neale et al. (2011) found that the sorption
316 capacity of wastewater derived DOC was less than reference HA. Hence, the role of sorption is
317 expected to be less for wastewater derived DOC.

318

319 **4. Conclusions**

320 In this study, we applied an experimental and modelled approach to demonstrate that sorption to
321 DOC can reduce the available 17 β -estradiol concentration and lead to increased nominal EC₅₀
322 values. This was not due to antagonism or experimental artefacts from DOC autofluorescence. The

323 observed shift in the 17 β -estradiol concentration-effect curve in the presence of DOC was within
324 the variability associated with DOC-free concentration-effect curves over time. However, the
325 influence of sorption to DOC was not insignificant when assessing apparent antagonism, with DOC
326 concentrations expected to cause 50 to 60% binding resulting in up to 35% suppression of the EC₅₀
327 agonist concentration. This is relevant for environmental samples as the final DOC concentration in
328 the assay is expected to be in the same concentration range for DOC rich water samples, such as
329 wastewater, and for complex environmental samples only nominal concentrations in units of
330 relative enrichment factors can be reported.

331

332 The influence of DOC in antagonist mode was explored for the ER reporter gene assay as it is a
333 commonly used endpoint and experimental K_{DOC} values are available for 17 β -estradiol with HA and
334 FA. The observed shift in the agonist concentration-effect curve is also likely for other assays where
335 a moderately hydrophobic compound is used as the agonist (e.g. progestagens such as
336 levonorgestrel in the progesterone receptor assay and androgens such as dihydrotestosterone in the
337 androgen receptor assay) and this may explain the reported anti-androgenicity of organic matter
338 observed by Bittner et al. (2012). However, reliable K_{DOC} values are lacking for these compounds,
339 making it difficult to test this hypothesis.

340

341 When assessing antagonism in DOC rich water samples, such as wastewater, using an agonist
342 concentration of EC₈₀ rather than EC₅₀ is recommended to limit the potential influence of co-
343 extracted DOC. Further, to assess if sorption to DOC could be a factor, studies should measure the
344 DOC concentration of the environmental samples, at least prior to SPE. This is often overlooked,
345 but could be used as a screening step to help researchers identify whether DOC could be potentially
346 interfering with their experiment.

347

348 **Acknowledgements**

349 This study was supported by the National Health and Medical Research Council (NHMRC) –
350 European Union Collaborative Research grant (APP1074775) and is part of the SOLUTIONS
351 project, which is supported by the European Union Seventh Framework Programme.

352

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427 Figure 1: Nominal 17β -estradiol (E2) concentration-effect curves in the presence of humic acid
428 (HA) concentrations, which are expected to cause 20 to 60% binding, compared to DOC free media.

429

430 Figure 2: Nominal 17β -estradiol (E2) concentration-effect curves with humic acid (HA) expected to
431 causing 50% binding with (open symbols) and without (solid symbols) autofluorescence correction.

432

433 Figure 3: Nominal 17β -estradiol (E2) concentration-effect curves with humic acid (HA) at
434 concentrations expected to cause 20 to 60% binding only dosed in the FRET reagent after overnight
435 exposure compared with a DOC free control.

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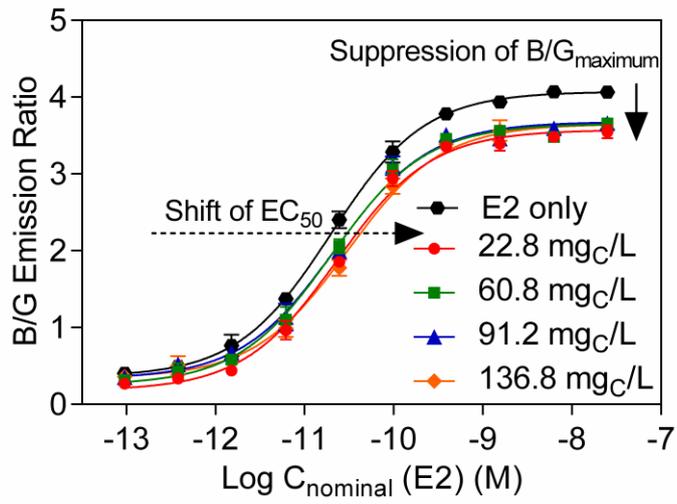
437 Figure 4: Experimental (symbols) and modelled (dashed lines) concentration-effect curves for both
438 nominal (C_{nominal} (E2)) and DOC sorption corrected ($C_{\text{DOC-sorption correction}}$ (E2)) concentrations in the
439 presence of (A, C) humic acid (HA) and (B, D) fulvic acid (FA) (typical experiment). Vertical
440 dotted lines indicate the EC_{50} and EC_{80} concentrations for the E2 only concentration-effect curve.

441

442 Figure 5: Experimental and modelled (A) percent effect and (B) percent suppression of the nominal
443 agonist concentration at EC_{50} (black, closed symbols) and EC_{80} (blue, open symbols) as a function
444 of humic acid (HA) concentration.

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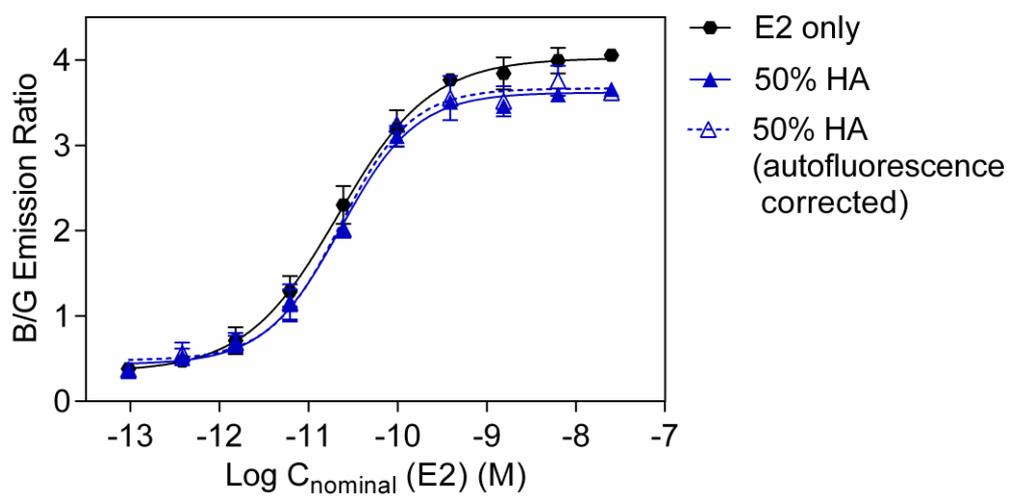
446 **Figure 1**



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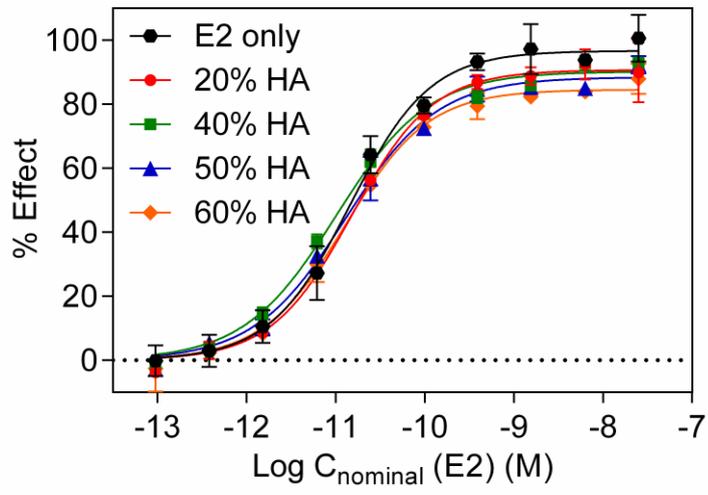
449 **Figure 2**



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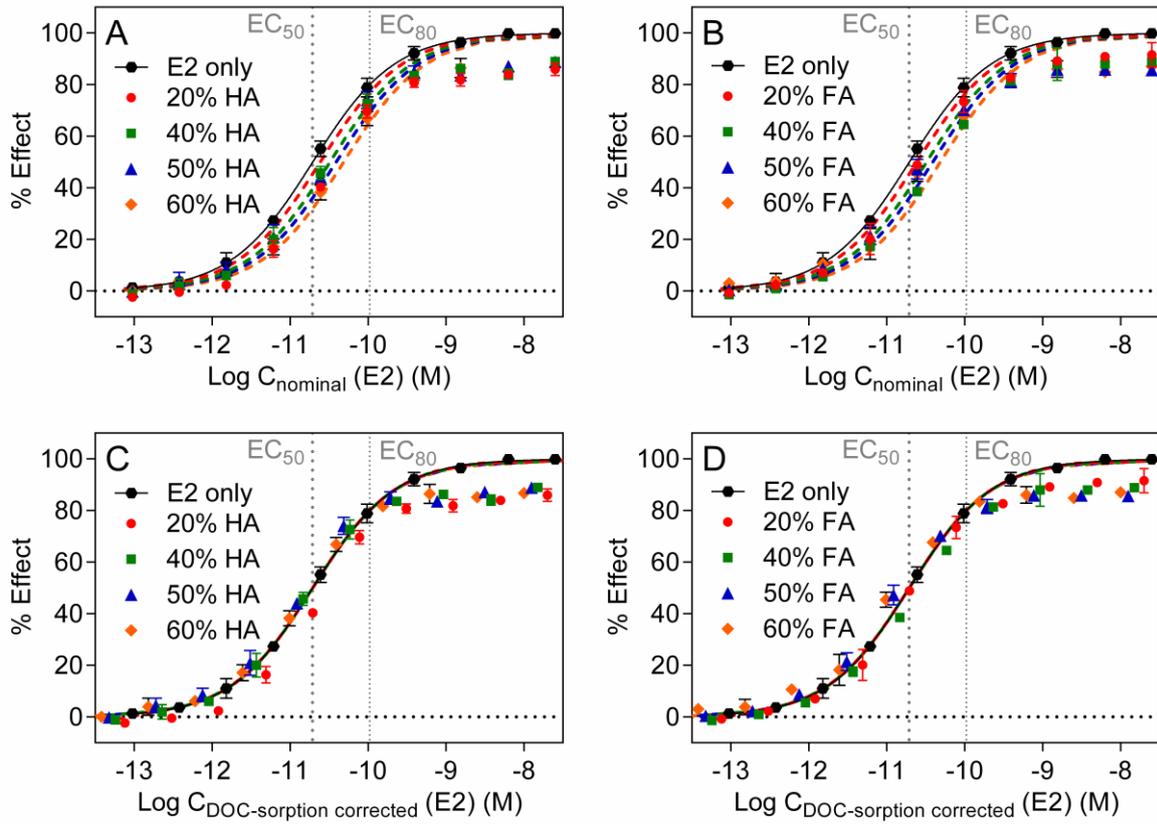
452 **Figure 3**



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455 **Figure 4**



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