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Cellular metabolism in high-throughput *in vitro* reporter gene assays and implications for the quantitative *in vitro-in vivo* extrapolation

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1 Abstract

2 High-throughput in vitro reporter gene assays are increasingly applied to assess the potency of 3 chemicals to alter specific cellular signaling pathways. Genetically modified reporter gene cell 4 lines provide stable readouts of the activation of cellular receptors or transcription factors of 5 interest, but such reporter gene assays have been criticized for not capturing cellular metabolism. 6 We characterized the metabolic activity of the widely applied AREc32 (human breast cancer MCF-7 7), ARE-bla (human liver cancer HepG2), and GR-bla (human embryonic kidney HEK293) 8 reporter gene cells in absence and in presence of benzo(a)pyrene (BaP), an AhR ligand known to 9 upregulate cytochrome P450 in vitro and in vivo. We combined fluorescence microscopy with 10 chemical analysis, real-time PCR, and EROD activity measurements to track temporal changes in 11 BaP and its metabolites in the cells and surrounding medium over time in relation to the expression 12 and activity of metabolic enzymes. Decreasing BaP concentrations and formation of metabolites 13 agreed with the high basal CYP1 activity of ARE-bla and the strong CYP1A1 mRNA induction in 14 AREc32, whereas BaP concentrations were constant in GR-bla, in which neither metabolites nor 15 CYP1 induction were detected. The study emphasizes that differences in sensitivity between 16 reporter gene assays may be caused not only by different reporter constructs but also by a varying 17 biotransformation rate of the evaluated parent chemical. The basal metabolic capacity of reporter 18 gene cells in absence of chemicals is not a clear indication because we demonstrated that the 19 metabolic activity can be upregulated by AhR ligands during the assay. The combination of 20 methods presented here is suitable to characterize the metabolic activity of cells in vitro and can 21 improve the interpretation of *in vitro* reporter gene effect data and extrapolation to *in vivo* human 22 exposure.

TOC Art



25 **I. Introduction**

26 In vitro cell-based reporter gene assays are gaining increasing attention in human health risk 27 assessment of chemicals. Their implementation in high-throughput screening (HTS) format will 28 contribute to cover the high demand on chemical effect assessment associated with the increasing 29 number and variety of manufactured chemicals. In these artificial cell constructs, a specific 30 receptor-chemical interaction or stress-response pathway is monitored using a reporter gene 31 coupled to the response element of the target receptor (e.g., luciferase or ß-lactamase). This 32 mechanistic approach provides deeper insight in the mode of toxic action (MoA) of a chemical 33 than a standard *in vivo* toxicity test for chemical risk assessment. A large battery of *in vitro* reporter 34 gene assays has been already developed, standardized and miniaturized in multi-well plates for 35 HTS.1

36 One of the biggest systematic screening approaches hitherto is the Toxicology Testing in the 21st 37 Century (Tox21) program that involved the assessment of 10,000 chemicals in 64 quantitative high-38 throughput reporter gene assays (<u>https://tripod.nih.gov/tox21/assays/</u>). Interestingly, only 14 cell 39 lines form the basis for the reporter gene assays used in Tox21 with different reporter genes 40 implemented into the same cell lines, most abundantly in the human embryonic kidney and liver 41 cancer cell lines HEK293 (42%) and HepG2 (14%). For example, chemical interaction with the 42 androgen receptor (AR) and glucocorticoid receptor (GR) are evaluated in different reporter gene 43 assays and both are based on HEK293 cells.² No specific attention was given to biotransformation 44 of the chemical by cellular metabolism in the development of the reporter gene assays.

45 Metabolism of xenobiotic chemicals usually involves the addition of polar functional groups to the 46 chemicals for facilitated excretion. These biotransformation processes alter the physicochemical 47 properties of the parent chemicals and its potency to affect signaling pathways in vivo. The 48 biotransformation of chemicals in *in vitro* reporter gene assays can increase or decrease the 49 apparent activity depending on the biological activity of the metabolites relative to their parent 50 chemical. For example, benzo(a)pyrene (BaP) can be bioactivated through oxidation by cytochrome P450 enzymes into the carcinogenic metabolite benzo(a)pyrene-7,8-diol-9,10-epoxid 51 52 (BaP-epoxide).^{3,4} Higher activities of hydroxylated metabolites were measured in MCF-7 estrogen 53 receptor gene assays compared to the parent BaP,⁵ while contrarily lower estrogenic activities were 54 reported for mycotoxins after biotransformation.⁶

55 The cytochrome P450 1A1 enzyme (CYP1A1) is present in all mammalian tissue and plays a key 56 role in metabolism of xenobiotic chemicals by accounting for more than 75% of total metabolism.⁷ 57 ⁸ CYP1A1 gene induction is predominantly mediated by the aryl hydrocarbon (AhR) and cellular 58 tumor antigen receptors (p53) which enter the nucleus upon binding of a chemical and bind to the 59 xenobiotic receptor element (XRE), inducing the CYP1A1 mRNA expression.9.10 The induction of 60 *CYP* genes in *in vitro* cells by chemical exposure was thoroughly investigated in previous studies," amongst others for the native HepG2 and HEK293 cells that are implemented in the ARE-bla and 61 62 GR-bla Tox21 reporter gene assays.^{12,4} For micronucleus frequency in vitro assays, a natural 63 biomarker for DNA damage, it has been shown that the sensitivity of the measurement endpoint 64 strongly depends on the metabolic capability of the applied cell line (MCL-5, TK6, and HepG2 65 cells) to form more toxic metabolites.¹⁵ Such case studies indicated the importance of metabolism 66 in 2D cell assays monitoring specific cellular endpoints that are not directly related to their 67 metabolic activity.

68 The biotransformation of test chemical(s) by metabolism is generally not considered in the 69 evaluation of *in vitro* effect data of reporter gene assays but can represent a significant source of 70 uncertainty. Characterizing the metabolic activity of widely applied in vitro reporter gene cell lines 71 that are incubated in multi-well plates will help to increase the comparability between the assays 72 and is the first step towards a reliable assessment of the potency of chemicals that are metabolized 73 in HTS in vitro reporter gene assays. For MCF-7 cells implemented in the antioxidant response 74 element assay AREc32, fluorescence measurements provided evidence of BaP biotransformation 75 capability,¹⁶ indicating that chemical exposure can induce the expression of CYP enzymes in 76 AREc32, which was observed for native MCF-7 cells during chemical exposure.^{17,18} These studies 77 emphasize the necessity to characterize the metabolic activity of reporter gene cells during 78 exposure to chemicals, whereas investigating the basal metabolic capacity of *in vitro* cells might underestimate their metabolic activity under exposure conditions. 79

For quantitative *in vitro-in vivo* extrapolation (QIVIVE) approaches, characterizing the metabolic activity of the applied *in vitro* reporter gene cell line can clearly support the development of models for human exposure predictions from *in vitro* effect data. *In vitro* hepatic clearance assays with HepaRG and other liver cells can predict metabolic activity in human tissue,^{19,20} and have been implemented in QIVIVE frameworks.²¹ Clearance models have been developed that calculate clearance efficiencies of chemicals in blood based on the amount of metabolically active components in S9, microsomal proteins, or hepatocytes.²² For hepatic assays, cellular metabolism 87 was thoroughly investigated and discussed, however, the link to metabolic processes in *in vitro* 88 reporter gene assays is missing. In studies with *in vitro* reporter gene assays, cellular metabolism 89 was mainly neglected, even for cell lines that were originally developed as models for hepatic 90 metabolism of chemicals.²⁰ This indicates the necessity to investigate the metabolic activity of *in* 91 *vitro* assays if used for human health risk assessment of chemicals and how to foster its 92 implementation in QIVIVE approaches.

93 This study aimed to characterize cellular metabolism in reporter gene assays to investigate its role 94 in the interpretation and extrapolation of *in vitro* effects. Therefore, we analyzed the CYP1A1 95 mRNA expression and applied ethoxyresorufin-O-deethylase (EROD) assays as well as integrated 96 fluorescence microscopy and chemical analysis to track concentrations in the cell and exposure 97 medium. The method was applied to measure the cellular metabolism of BaP in the AREc32, ARE-98 bla (Antioxidant Response Element) and GR-bla (Glucocorticoid Receptor) reporter gene cell lines 99 that were based on human breast cancer cells (MCF-7), hepatocellular carcinoma cells (HepG2), 100 and human embryonic kidney cells (HEK293), respectively. MCF-7 was originally developed for 101 cancer research²⁴ and has been widely applied as AREc32²⁵ for skin sensitization testing²⁶ and 102 environmental monitoring.²⁷ The GR-bla and ARE-bla reporter gene cell lines were both 103 implemented in the Tox21 battery of cell-based bioassays.¹ We hypothesized that (i) a difference 104 in the metabolic activity of the cell lines can have a significant influence on chemical exposure in 105 the medium and cells, potentially leading to sensitivity differences between cell lines towards 106 biotransformed chemicals; (ii) exposure to BaP increase CYP1A1 mRNA expression and total P450 107 CYP1 activity which (iii) leads to an exponential decrease in cellular concentrations of BaP and an 108 increase in metabolite concentrations. We discuss differences in the metabolic activity between the 109 evaluated cell lines considering their tissue origin (breast cancer, kidney, liver) and their relevance 110 for the QIVIVE of biodegradable chemicals measured in *in vitro* reporter gene assays.

111 **2. Materials and Methods**

112 **2.1** Chemicals and cell lines

113 ≥96%), 3-hydroxybenzo(a)pyrene ≥99%), Benzo(a)pyrene (BaP, (3-OH-BaP, and 114 benzo(a)pyrene-7,8-dihydrodiol-9,10-epoxide (BaP-epoxide, \geq 99%) were purchased from Sigma 115 9-Hydroxybenzo(a)pyrene (9-OH-BaP, ≥99%), (\pm) -trans-4,5-Dihydroxy-4,5-Aldrich. 116 ≥99%), (±)-trans-7,8-Dihydroxy-7,8dihydrobenzo(a)pyrene (4,5-OH-BaP, dihydrobenzo(a)pyrene (7,8-OH-BaP, ≥99%), and *trans*-9,10-Dihydroxy-9,10-dihydroxy-9,10-117 118 dihydrobenzo(a)pyrene (9,10-OH-BaP, ≥99%) were acquired from the Biochemical Institute for 119 Environmental Carcinogens. 7-ethoxyresorufin and NaOH (≥98.8 %) were purchased from Th. 120 Geyer and resorufin (95%) and dicoumarol from Merck. TRIS buffer was purchased from 121 AppliChem.

122 **2.2** Cell cultivation and assay conditions

123 ARE-bla, GR-bla and AREc32 cells were cultivated in Dulbecco's Modified Eagle Medium 124 (DMEM GlutaMAX, Thermo Fisher) amended with 10% fetal bovine serum (FBS) in cell culture 125 flasks. Untreated FBS was used for AREc32 cells and dialyzed FBS for GR-bla and ARE-bla cells. 126 Reaching a confluency of 70 - 90%, the cell number was quantified with a cell counter CASY MODEL TT (Roche Innovatis). The cells were washed twice with phosphate buffered saline (PBS, 127 128 8% NaCl, 0.2% KCl, 1.442% Na₂HPO₄ and 0.25% KH₂PO₄ in H₂O) and resuspended in DMEM 129 GlutaMAX with 2% untreated FBS. This cell suspension was split into two different treatments: 130 (i) 10 mL were split into five cell culture flasks each and (ii) 90 µL were seeded into each well of 131 poly-D-lysine-coated 96-well polystyrene plates with a clear and flat bottom for GR-bla and ARE-132 bla and AREc32 was seeded into a tissue culture treated 96-well plate (Corning). The cell numbers 133 were previously optimized and adjusted to 1.5×10^6 (ARE-bla), 9×10^5 (AREc32), and 1.3×10^6 (GRbla) in the cell culture flasks (25 cm² for quantitative PCR) to reach a confluency of 70-90 % after 134 135 48 h and 15,000 (ARE-bla), 11,000 (AREc32), and 11,000 (GR-bla) in the wells, respectively. The 136 culture flasks and well plates were incubated for 24 h at 37 °C and 5% CO₂ for cell attachment 137 before starting the experiments.

138 **2.3 BaP exposure experiments**

139 The cells were exposed to BaP either in 96-well plates for fluorescence measurement (Section 2.4),

140 chemical analysis (Section 2.5), and EROD measurement (Section 2.7), or in cell culture flasks for

141 *CYP1A1* mRNA expression analysis (Section 2.6). The nominal BaP concentration in the exposure

142 medium was 0.25 mg L^{-1} , which ensured quantifiable concentrations in the medium but did not 143 cause cytotoxicity.¹⁶

Complying with protocols to avoid solvent-associated artefacts in multi-well plates,^{28, 29} 30 µL of 144 preequilibrated (>1 h) exposure medium containing 1 mg L^{-1} BaP were pipetted to 90 μ L cell 145 146 suspension of each well, resulting in a final methanol content of 0.5%. For each multi-well plate 147 experiment, three plates containing four sampling time points with 24 replicates were prepared. 148 Additionally, 24 unexposed wells with cells and 24 BaP exposed cell-free wells were prepared and 149 extracted after 24 h of incubation. Fluorescence intensities were measured in 6 well replicates per 150 sampling point as described in Section 2.4. Ten sampling points within 24 h after dosing (0 h, 1 h, 151 2 h, 4 h, 6 h, 8 h, 12 h, 16 h, 20 h, 24 h) per experiment were tested and each cell line was tested in 152 two independent experiments. In each well ten replicate images at different positions were 153 captured. Simultaneously to the fluorescence measurements, the 60 µL exposure medium of 20 154 independent wells were pooled and extracted as described in Section 2.5. In additional experiments, 155 the medium was removed from BaP exposed and unexposed cells (0 h) after 2 h, 4 h, 8 h, 16 h, and 156 24 h for EROD measurements as described in Section 2.7.

The culture flasks containing 10 mL medium were dosed by pipetting 45 μ L of a methanolic stock solution (55.5 mg L⁻¹) to 5 mL medium which were taken out of the flasks and transferred to sterile falcon tubes. The dosed medium was vortexed and transferred back to the flasks marking the start of the BaP exposure. Three independent biological replicates per cell line were tested. The cells were harvested before (0 h) and after 2 h and 24 h of BaP incubation, and PCR was conducted as described in Section 2.5.

163 **2.4 Fluorescence microscopy to measure cell exposure**

The cell exposure to BaP was tracked over time by fluorescence microscopy using a Zeiss PALM CombiSystem (Zeiss) that allowed simultaneous acquisition of bright and fluorescence images of 2D cells in 96-well plates. The detailed protocol of image acquisition and analysis is described elsewhere.¹⁶ Briefly, fluorescence emissions at 435 nm were measured in a 7.5 μm Z-layer at ten equally distributed positions in the well, thereby avoiding overlapping of images and capturing of 169 well edges. BaP was excited at 384 nm for 20 ms following detection of emission maxima at 170 different excitation wavelengths. Images were processed in the KNIME workflow from Fischer et al.¹⁶ integrating ImageJ and morphological image operations to discriminate the extra- and 171 172 intracellular space in the bright-field images, in which the fluorescence intensity in the medium 173 (FI_{medum mask}) and in the cells (FI_{cel mask}) was quantified from the fluorescence images. The mean 174 fluorescence intensity in the cells (FI_{eel}) in each well was calculated by subtracting FI_{medium mask} from FI_{eel} 175 _{max}, thereby accounting for the overlapping signals that result from the broad Z-layer of 7.5 μ m (eq. 176 1).

177
$$FI_{cell} = FI_{cell mask} - FI_{medium mask}$$
 (1)

178 2.5 Analytical determination of medium concentrations of BaP and BaP-metabolites

179 Conventional solvent extraction followed by high-performance liquid chromatography (HPLC) 180 was used to measure BaP and metabolite concentrations in the exposure medium over the assay 181 duration of 24 h. For detection of 3-OH-BaP, 4,5-OH-BaP, and 7,8-OH-BaP, a PAH LC column 182 (Phenomenex, 100 x 3.0 mm, 2.6 µm) was equipped and coupled to a fluorescence light detector 183 using a H₂O:acetonitrile solvent gradient over 8.2 min (Table S1). For detection of BaP, 3-OH-184 BaP, 9-OH-BaP, 9,10-OH-BaP, and BaP-epoxide, a ZORBAX Eclipse Plus C18 column (Agilent, 185 4.6 x 100 mm, 5µm) was equipped using a H₂O:acetonitrile solvent gradient over 16.5 min (Table S2). Calibration standards of BaP and metabolites were prepared at a concentration range of 0.0001 186 $-2 \text{ mg } \text{L}^{-1}$ in acetonitrile. The solvent extraction was optimized to maximize the recovery of BaP 187 188 and 3-OH-BaP as described in Section S2. For each time point, 100 µL medium of 18 independent 189 wells of the 96-well plate were pooled and transferred to a 4 mL storage vial (neoLab). 1.8 mL 190 ethyl acetate (HPLC grade, Merck) were added and the suspension was shaken horizontally for 15 191 min at 250 rpm on an orbital shaker (MaxQ6000, Thermo Fisher) and centrifuged at 4000 rpm for 192 5 min for phase separation. 1.2 mL of the supernatant was transferred into a 1.5 mL HPLC vial 193 (Th. Geyer) and evaporated to complete dryness under nitrogen. The residues were dissolved in 50 194 µL acetonitrile and BaP and metabolite concentrations in the extracts were quantified by HPLC (Agilent 1260 system). 195

196 **2.6 CYP1A1 mRNA expression by quantitative real-time PCR**

197 The expression of CYP1A1 mRNA in the cell lines was measured by quantitative real-time PCR 198 (qPCR). DNA primers for the CYP1A1 gene and the housekeeping genes ACTB and EEF1A1 were 199 designed using the open source software Primer3 and purchased from Eurofins Genomics (Section 200 S3). The cells were collected as wet pellets with cell numbers varying between 7×10^5 and 6×10^6 . 201 RNA isolation from the cells was performed according to standard protocols using the QIAgen 202 RNeasy mini kit and RNA concentrations and purity in the aqueous solution was measured by 203 spectral photometry (Nanodrop, PEQlab Biotechnologies). Prior cDNA synthesis, a DNAse digest 204 of the RNA was performed (Thermo Fisher). For cDNA synthesis 2 µL random hexamer primer 205 were added to 0.35 µg RNA and mixed, centrifuged and incubated for 5 min at 65 °C and 206 immediately chilled on ice. A mixture of 4 μ L reaction buffer, 0.5 μ L ribonuclease inhibitor, 2 μ L 207 dNTPs, and 1 µL RevertAid H Minus reverse transcriptase (Thermo Fisher) was added and the 208 cDNA was synthesized in a thermocycler at 25 °C for 10 min and 42 °C for 75 min. The reaction 209 was stopped at 70 °C for 10 min and the cDNA solution was stored on ice. A qualitative, standard 210 PCR was used beforehand to investigate if the evaluated cell lines express CYP1A1 mRNA (Section 211 S4).

The qPCR reaction was conducted in 96-well fast optical reaction plates (Thermo Fisher) in a StepOne qPCR System (Applied Biosystems) using the SYBR green master mix for detection, containing 1 μ L of cDNA mixed with 6.25 μ L SYBR green fluorescence solution (Bioline), 4.25 μ L bidistilled water, and 0.5 μ L of forward and reverse primer. The PCR reaction was initiated at 95 °C for 10 minutes followed by 40 cycles of 95 °C for 15 s (DNA denaturation), 56 °C for 15 s (annealing) and at 72 °C for 20 s (elongation). Efficiencies of primers were 109.88 % for *CYP1A1*, 99.07 % for *ACTB* and 100.80 % for *EEF1A1*. The Primer sequences are reported in Section S3.

219 *CYP1A1* mRNA expression was calculated relative to the reference genes *ACTB* and *EEF1A1* as 220 well as to control cells using the $2^{-\Delta\Delta Ct}$ -method.^{30, 31} The threshold cycle value (C_q) of the target 221 gene (C_{q,CYP1A1}) was subtracted from the C_q of the reference gene (C_{q,RG}) to receive $\Delta C_{q,CYP1A1}$ for 222 all samples and cell lines (eq. 2).

223

$$\Delta C_{q,CYP1A1} = C_{q,CYP1A1} - C_{q,RG}$$
⁽²⁾

The $\Delta C_{q,CYP1A1}$ of the BaP exposed cells ($\Delta C_{q,CYP1A1}$ (BaP)) was compared to the control cells ($\Delta C_{q,CYP1A1}$ (control)) (eq. 3) to calculate the fold induction of *CYP1A1* (Ind_{CYP1A1} (0h \rightarrow 24h)) during BaP exposure (eq. 4).

$$\Delta\Delta C_{q,CYP1A1} = \Delta C_{q,CYP1A1} \text{ (BaP)} - \Delta C_{q,CYP1A1} \text{ (control)}$$
(3)

228
$$\operatorname{Ind}_{CYP1A1} (0h \to 24h) = 2^{-\Delta\Delta C_{q,CYP1A1}}$$
(4)

229 2.7 EROD assay to determine CYP1 enzyme activity

230 The activity of the CYP1 subfamily enzymes after BaP exposure was measured using the 231 ethoxyresorufin-O-deethylase (EROD) assay that is based on the CYP1-mediated degradation of 232 the 7-ethoxyresorufin (ETX) substrate into the fluorescent resorufin. Further degradation of 233 resorufin was avoided using the reductase inhibitor dicoumarol. A 800 µM ETX stock solution in 234 methanol and a 1 mM discouraged stock solution in tris(hydroxymethyl)aminomethane (TRIS) 235 buffer (AppliChem) were used to prepare an ETX working solution of $8 \mu M ETX + 10 \mu M$ 236 dicoumarol in PBS.³² At each sampling point, the medium was removed from the wells and the wells were rinsed twice with 120 µL PBS. 120 µL of ETX working solution was added to each 237 238 well. Fluorescence intensity of resorufin (586 nm) was measured after excitation at 571 nm in a preheated microplate reader (plate reader Infinite 200 PRO, Tecan) at 37 °C for 10 min with 239 240 measurement intervals of 30 s. Cells without BaP exposure and the ETX solution without cells served as negative controls. Liver S9 (0.002 mgprotein mL⁻¹) was applied as positive control. The 241 background fluorescence signal of the ETX negative control was subtracted from the sample wells. 242 243 The amount of resorufin (n_{resorufin}) in the samples were quantified using a linear resorufin calibration curve that was measured in PBS in parallel.³³ The increase of resorufin over the 10-min 244 measurement (n_{resorufin} min⁻¹) was normalized to the cell number in the well,³⁴ which was estimated 245 from the increase in the cell mask measured by bright-field imaging using the fluorescence 246 microscope.¹⁶ The measured CYP1 enzyme activities A_{BaP} (n_{resorufin} 10⁶ cells⁻¹) were plotted against 247 BaP exposure time to fit the slope of the CYP1 enzyme activity rate m_{CYP} ($n_{resorutin}$ h⁻¹ 10⁶ cells⁻¹) 248 249 with linear regression with the y-intercept set to the basal CYP1 enzyme activity measured for the 250 control cells at time 0 ($A_{\text{control.t0}}$) (eq. 5).

251

$$A_{\text{BaP}}(t) = m_{\text{CYP}} \cdot t + A_{\text{control}}(t0)$$
(5)

252 **2.8** Kinetic model to describe chemical transport and metabolism

We hypothesized that the chemical fate of BaP in the assay system depends on (i) the chemical partitioning between the medium and the cells and (ii) the elimination of the chemical in the cells (Figure 1). Volatilization of BaP could be neglected because the medium-air partition constant

 $K_{\text{medium/air}}$ of BaP is more than four orders of magnitude higher than the threshold where evaporative 256 257 losses would be expected (log $K_{\text{medium/air}}$ of 10⁴).³⁵ Furthermore, in 96-well plates and medium supplemented with 2% medium the loss to the polystyrene of the well-plate is expected to be 258 <2%.³⁶ A two-compartment model was applied to characterize the metabolic activity of the cells 259 that integrates these two kinetic processes and sequentially fits first-order uptake ($k_{\text{medium}\rightarrow\text{cell}}, h^{-1}$) 260 and elimination $(k_{cell \rightarrow medium}, h^{-1})$ rate constants of the parent in non-metabolically active cells. 261 262 These rate constants were then fixed to derive the metabolic rate constant k_{met} (h⁻¹) from the experimental FI_{cell} over time. The FI_{cell} was assumed to be the sum of the fluorescence signal of 263 264 BaP and its fluorescent metabolites and its decrease expressed as k_{met} can be related to the formation 265 of non-fluorescent metabolites. The metabolites are also eliminated from the cell, but this process 266 could not be detected with the fluorescence method applied in this study. Preliminary emission 267 measurements showed that BaP and all evaluated metabolites show fluorescence emission at 435 268 nm, which was the emission wavelength captured by the fluorescence microscope (Section S5). 269 The emission scans of the monohydroxylated BaP metabolites and BaP showed considerably 270 higher fluorescence emission than the dihydroxylated metabolites and the BaP-epoxide (Figure S4). For instance, the BaP fluorescence was ~18x higher than the fluorescence of the BaP-epoxide. 271 Following the results of the emission scans, the decrease in FI_{cell} and FI_{medium} in our experiments 272 was ascribed to the metabolization of BaP and the primary metabolites (monohydroxylated BaPs) 273 274 to the secondary metabolites 4,5-, 7,8- and 9,10-dihydroxy-BaP and the BaP-epoxide (Figure 1).



Figure 1 Kinetic processes between and within the exposure medium (blue) and the cells (red) in *in vitro* reporter gene assays. The parent chemical in the medium is taken up by the cells ($k_{\text{medium}\rightarrow\text{cell}}$), metabolized (k_{met}) based on the availability and induction of CYP1 enzymes and both, the BaP and its metabolites, are released into the medium ($k_{\text{cell}\rightarrow\text{medium}}$). The FBS in the medium binds the parent chemical and excreted metabolites.

As medium and cells are in permanent contact, changes in FI_{medium} and FI_{cell} over time *t* can be described by two coupled differential equations (eqs. 6 and 7).

283
$$\frac{\mathrm{dFI}_{\mathrm{medium}}}{\mathrm{d}t} = k_{\mathrm{cell}\to\mathrm{medium}} \cdot \mathrm{FI}_{\mathrm{cell}}(t) - k_{\mathrm{medium}\to\mathrm{cell}} \cdot \mathrm{FI}_{\mathrm{medium}}(t) \tag{6}$$

284
$$\frac{dFI_{cell}}{dt} = k_{medium \rightarrow cell} \cdot FI_{medium}(t) - (k_{cell \rightarrow medium} + k_{met}(t)) \cdot FI_{cell}(t)$$
(7)

 $k_{\text{medium}\rightarrow\text{cell}}$ and $k_{\text{medium}\rightarrow\text{cell}}$ are the first-order rate constants (h⁻¹) that describe the kinetics of chemical partitioning of the sum of the fluorescent species between the medium and cells. For cells that are not metabolic active, $k_{\text{cell}\rightarrow\text{medium}}$ and $k_{\text{medium}\rightarrow\text{cell}}$ can be fitted from FI_{medium} (*t*) and FI_{cell} (*t*) by setting $k_{\text{met}} = 0$. We accounted for a temporal increase in the basal k_{met} because it is dependent on the increase in CYP1 activity (m_{CYP}) compared to unexposed cells (A_{control}) assuming a linear relationship between enzyme activity rate constant $\frac{m_{CYP}}{A_{\text{control}}}$ and time (eq. 8).

291
$$k_{\text{met}}(t) = k_{\text{met}} \cdot t \cdot \frac{m_{\text{CYP}}}{A_{\text{control}}}$$
(8)

The experimental FI_{medium} and FI_{cell} of AREc32, ARE-bla, and GR-bla cells were fitted with eqs. 6 and 7 using the damped least-squares (DLS) method for multiparameter fitting, yielding the derivation of $k_{medium\rightarrow cell}$, $k_{medium\rightarrow cell}$, and k_{met} . As the fit robustness decreased substantially with each added fit variable, we first fitted $k_{medium\rightarrow cell}$ and $k_{medium\rightarrow cell}$ using the FI_{medium} and FI_{cell} of the metabolic inactive GR-bla cells, and resulting $k_{medium\rightarrow cell}$, $k_{medium\rightarrow cell}$ were subsequently applied to fit k_{met} of the metabolic active AREc32 and ARE-bla cells. The fit program was set up in R Studio Version 1.2.5019 and is reported in the Supporting Information, Section S6.

299 **3. Results and Discussion**

300 **3.1 Basal and exposure-induced expression of** *CYP1A1* and activity of CYP1 enzymes

301 CYP1A1 mRNA were identified with standard PCR analysis in all three evaluated reporter gene cell lines in absence of BaP, (Section S4) agreeing with CYP studies on native MCF-7, HepG2, 302 303 and HEK293 cells.^{12,13} As *CYP1A1* is described as the dominant and most abundant target enzyme of the AhR receptor and the metabolism of aromatic hydrocarbons like BaP³⁷ and considering that 304 305 CYP1A1 is involved in \sim 75% of the biodegradation processes of xenobiotics,^{7,8} we focused on 306 CYP1A1 gene expression as indicator gene for cellular metabolism. The qPCR analysis indicated 307 that the basal expression of CYP1A1 mRNA, reported as $\Delta C_{q,CYP1A1}$, was relatively stable over time 308 from 0 to 24 h in all cell lines in chemical-free exposure medium (Figure S5 in Section S7). The 309 basal expression of CYP1A1 without BaP exposure was 300 and 1000 times higher in ARE-bla 310 compared to the AREc32 and GR-bla cells after 24 h (Figure 2A). Consistently, the basal EROD 311 activity in absence of BaP was $\sim 26 \times$ and $\sim 5 \times$ higher in ARE-bla and AREc32 than in GR-bla, 312 respectively. Note that the $\Delta C_{q,CYP1AI}$ and corresponding Ind_{CYP1AI} values (Figure 2A) are not entirely 313 comparable due to variabilities in the expression of the control gene between the cell lines,^{31, 38} but 314 there remain substantial differences between the high Ind_{CYPIAI} of 1,220 for AREc32 and the low 315 Ind_{CYP1A1} of 11 for ARE-bla, that cannot be caused by this experimental variability.



316

317 **Figure 2A.** Expression of *CYP1A1* mRNA ($\Delta C_{q,CYP1A1}$, bars) and Ind_{*CYP1A1*} (reported numbers over bars) in AREc32, ARE-bla, and GR-bla after 24 h of incubation in chemical-free (control, dotted 318 319 bars) or BaP spiked medium (clear bars) with significant differences between the treatments 320 marked with an asterisk (p < 0.05, unpaired t-test in GraphPad PRISM, v. 8.3). **B.** Basal and BaP-321 induced CYP1 activity over 24 h BaP exposure and corresponding fit (r² (AREc32) = 0.83; r² 322 (ARE-bla) = 0.94) that was used in the kinetic model to describe the increase in CYP1 activity 323 m_{CYP1} (eq. 8), with experimental basal activities $A_{control}$ of 0.003 ± 0.005 (GR-bla), 0.051 ± 0.023 324 (AREc32), and 0.143 ± 0.051 (ARE-BLA) (n = 5). For ARE-bla, the 24 h measurement point was 325 not included in the linear fit.

326 The qPCR showed that BaP exposure significantly induced *CYP1A1* expression in AREc32 (p =

327 0.01) and ARE-bla (p = 0.02) cells but not in GR-bla cells (p = 0.99, Figure 2A, unpaired t-test),

328 which also lead to an increase in the EROD activity over the 24 h assay (Figure 2B). The resulting

- 329 CYP1A1 expression was similar for AREc32 and ARE-bla but since basal levels differed, the
- 330 *CYP1A1* expression induced by BaP led to an Ind_{CYP1A1} of 71 after 2 h and 1,220 after 24 h of BaP
- 331 exposure in AREc32 but only a 11× increase in ARE-bla after 24 h (Figures 2A and S6). For ARE-
- bla levels of *CYP1A1* gene expression were higher after 2 h ($Ind_{CYP1A1} = 26$) than at 24 h exposure
- 333 (Ind_{CYP1A1} = 11, Figure S5A). This difference between the cell lines was expected, as HepG2

(ARE-bla) and MCF-7 (AREc32) cells were reported to be highly sensitive to *CYP* gene induction
 by chemicals,^{12, 14} whereas kidney cells (HEK293 for GR-bla) were not expressing *CYP1A1* to a
 measurable extent.¹³

337 Consistent with induced *CYP1A1* expression, the EROD activity increased linearly in AREc32 338 whereas it remained constant for GR-bla during BaP exposure (Figure 2B). The increased basal 339 and chemical-induced expression and activity of CYP1 enzymes in the cancer cell lines AREc32 340 and ARE-bla could also be the result of p53-BaP complex binding as p53 transcription factors are upregulated in tumor cells compared to normal tissue.³⁹ While CYP1A1 expression did not increase 341 342 in GR-bla during BaP exposure, it can be noted that GR-bla have a basal CYP1A1 gene expression 343 and a basal CYP1 activity, which appears not be influenced by BaP exposure (Figure S5C). As 344 AhR receptors were identified in kidney tissue, the signaling pathway of the ligand-AhR complex and following binding to the XRE transcription factor might be interrupted in GR-bla cells.⁴⁰ The 345 346 analysis of BaP-induced CYP1A1 mRNA expression and CYP1 EROD activity demonstrated that 347 (i) the basal metabolic capacity of the reporter gene cell lines can substantially differ and (ii) that 348 the metabolic activity of reporter gene cell lines can vary greatly over the typical assay duration in 349 presence of AhR ligands.

350 **3.2** Temporal BaP and metabolite concentrations in the exposure medium

351 BaP concentrations in the exposure medium ($C_{\text{mediumBaP}}$) of ARE-bla and AREc32 decreased 352 considerably over the 24-h experiments whereas it remained constant in the GR-bla assay (Figure 353 3A). This observation agreed well with the high basal and BaP-induced expression of CYP1A1 and 354 CYP1 EROD activity in ARE-bla and AREc32 and the low CYP1A1 expression in GR-bla (Figure 2A). Even though the decrease in C_{medumBaP} was similar in AREc32 and ARE-bla over the first 8 hours, 355 356 the decrease in C_{medumBaP} is more pronounced in ARE-bla after 12 h compared to AREc32. Still, BaP decreased linearly in both cell lines. The linear decrease of $C_{medium RaP}$ in AREc32 matches the CYP1A1 357 358 mRNA expression levels (Figure 2A) and the linearly increasing CYP1 activity (Figure 2B). For 359 ARE-bla, the basal expression of CYP1A1 was almost as high as for AREc32 after 24 h and the 360 increase of the CYP1 activity (m_{cYP1}) was >2× higher, which explains the faster decrease in $C_{mediumBaP}$ 361 in ARE-bla.



362

Figure 3 BaP and metabolite concentrations measured over time in the exposure medium (C_{medium}) of AREc32, ARE-bla, and GR-bla cells. The dotted lines indicate the limits of detection (LOD) for each chemical in the HPLC measurements.

Given that the BaP metabolites were not detected in GR-bla cells that were tested with the same experimental setup, the continuous reduction in C_{medumBaP} in AREc32 and ARE-bla stemmed from cellular metabolism and was evidenced by substantial metabolite formation (Figures 3B-G). Stable mono- and dihydroxylated BaP served as indicators for *in vitro* metabolism of BaP. Although it is more challenging to quantify BaP metabolites with limited stability as the BaP-epoxide,⁴¹ we were able to quantify the BaP-epoxide in concentrations of 0.05-0.2 μ mol L⁴ in the medium of AREc32 and ARE-bla. The BaP-epoxide was first detected after 6 h in ARE-bla and after 16 h in AREc32, 373 respectively, indicating that the transformation of BaP in AREc32 is slower compared to ARE-bla 374 (Figure 3G), further evidenced by the earlier detection of mono- and dihydroxylated BaP 375 metabolites in ARE-bla than in AREc32 (Figures 3B-F). After 12 h, these metabolites were no 376 longer detected in ARE-bla and C_{medum} of the BaP-epoxide was likewise decreasing, agreeing with 377 the observation that the CYP activity of ARE-bla remains stable between 16 and 24 h (Figure 2B). 378 Interestingly, the C_{modes} of 7,8-OH-BaP increased substantially in the first 8 h in ARE-bla but was 379 not detected after 12 h (Figure 3E), at which C_{medum} of the BaP-epoxide was detected (Figure 3G). 380 Likewise, 7,8-OH-BaP concentrations decreased with increasing BaP-epoxide concentrations in 381 AREc32 after 12 h. 7,8-OH-BaP was shown to be transformed into the BaP-epoxide in rat liver 382 microsomes⁴² and our results indicate that this metabolic pathway is likewise present in human *in* 383 vitro cells. The molar mass balance of BaP and metabolites ascribed ~15% of the reduction in 384 $C_{\text{mediumBaP}}$ to the transformation to the BaP-epoxide in ARE-bla after 12 h and ~20% for AREc32 after 385 24 h. The formation of 3-OH-BaP, 9-OH-BaP, 4,5-OH-BaP, and 9,10-OH-BaP contributed < 2% 386 to the mass balance, but the continuous decrease in C_{medium} of BaP and all evaluated metabolites 387 indicates further degradation of the transformation products. In vivo, glucuronyl conjugates are 388 formed that are excreted in urine.⁴³ Our results indicate that BaP is metabolized in AREc32 and 389 ARE-bla to various intermediate and end products, still, a comprehensive investigation of the 390 metabolic pathway would require the measurement of additional metabolites, which was outside 391 the scope of this study.

392 3.3 Fluorescence kinetics in cells and exposure medium

Measuring the emission wavelengths of BaP and all evaluated chemicals revealed that the BaP and monohydroxylated BaP metabolites exhibited a substantially higher fluorescence intensity than the dihydroxylated metabolites and the BaP-epoxide at the wavelength captured by the fluorescence microscope (435 nm) (Figure S4). Therefore, we interpreted FI_{cell} and FI_{medium} as a proxy of the total concentration of BaP and monohydroxylated BaP metabolites, while ascribing a decrease in FI_{medium} and FI_{cell} to a further metabolization to dihydroxylated BaP and the BaPepoxide or similar structures.



400

401 **Figure 4** Fluorescence intensities (FI_{cell}, black dots) in AREc32 (A.), ARE-bla (B.), and GR-bla 402 (C.) cells and corresponding fluorescence intensities in the exposure medium (FI_{medium}, red 403 triangles) over 24 h. FI_{cell} and FI_{medium} were fitted with eqs. 6 and 7 to derive medium-cell 404 partitioning and metabolic rates for the cells.

405 Uptake of BaP by *in vitro* cells was reported to take ~ 2 h to reach equilibrium with 2% FBS in the exposure medium.¹⁶ We were able to reproduce these findings for the evaluated cell lines that all 406 407 reached a maximum FIcell within 2 h (Figure 4). The maximum of FIcell in GR-bla cells remained 408 constant until the end of the experiment (24 h). Contrarily, Fl_{cell} in AREc32 and ARE-bla 409 continuously decreased after reaching the maximum after ~2 h. Considering the constant medium 410 and incubation conditions applied for all three evaluated cell lines as well as the high basal and 411 exposure-induced expression of CYP1A1 encoding mRNA and EROD activity in AREc32 and 412 ARE-bla (Figure 2), we can attribute this decrease in cell exposure to cellular metabolism. The 413 maximum FIcell was lower for AREc32 and ARE-bla than for GR-bla. Since the steady-state 414 without metabolism should be independent of the cell line, we can assume that the reduction of 415 the maximum FI_{cell} was caused by metabolism.

416 The experimental FI_{cell} and FI_{medium} of the cell lines were fitted using eqs. 6 and 7 as described in 417 Section 2.8. The resulting k_{met} and corresponding fits describe the experimental FI_{cell} and FI_{medium} reasonably well (SE reported in Figure 4). A possible error in the model is that FI_{cell} and FI_{medium} 418 419 are mixed signals of BaP and foremost monohydroxylated metabolites (Figure S4). For fitting of 420 k_{met} , we used the $k_{\text{medium}\rightarrow\text{cell}}$ and $k_{\text{medium}\rightarrow\text{cell}}$ determined for the metabolic inactive GR-bla cells 421 (eq. 7). These k might not represent the chemical partitioning of BaP metabolites between medium 422 and cells, which would explain why the fit deviates from the experimental FI_{cell} and FI_{medium} to a 423 higher extent towards the end of the experiment, at which a higher proportion of the measured 424 fluorescence signal is expected to result from BaP metabolites (Figures 3B-G).

425 The transport and metabolism of chemicals in *in vitro* reporter gene assays is influenced by several 426 factors (Figure 1). As shown in earlier studies, the medium is the dominant sorptive reservoir in 427 the assays that can continuously deliver chemicals into the cells.⁴⁴ After dosing of the chemicals 428 into the medium, they can be taken up by the cells by passive diffusion through the membranes 429 and potentially by active co-transport by FBS endocytosis,¹⁶ visible in our experiments in the 430 increasing FI_{edl} over the first 2 h after chemical dosing (Figure 4). The maximum FI_{edl} in GR-bla 431 was attained faster (after ~ 1 h) and was considerably higher than the maximum FI_{att} in ARE-bla 432 and AREc32 (~160 cps compared to ~104 cps after ~2 h). In these metabolic active cells, the 433 kinetics of metabolism are concurrent with the uptake kinetics of BaP from the medium, leading 434 to the observed turning point after ~4 h at which BaP degradation is faster or cancels out BaP 435 uptake (Figures 4A and B). The BaP exposure led to an increase in CYP1A1 expression in AREc32 436 and ARE-bla (Figure 2), increasing the metabolic rate and exponentially decreasing FI_{all} over time, 437 which was observed for ARE-bla (Figure 4B) but not for AREc32 cells in our experiments (Figure 438 4A). The measured amount of CYP1A1 mRNA in AREc32 was a factor of 14 lower than in ARE-439 bla after 2 h and a factor of 3 lower after 24 h, which would explain that FI_{eet} in ARE-bla decreased 440 to unexposed cell levels after 12 h while FI_{edl} was still measurable after 24 h in AREc32. FI_{edl} and 441 FI_{medium} were constant for GR-bla after chemical equilibrium between the cells and medium was 442 achieved (Figure 4C). This does not necessarily mean that GR-bla cells are completely uncapable 443 of biotransformation, as evidenced by their measurable basal EROD activity (Figure 2B), but their 444 metabolic activity is too low to measure a significant decrease in FI_{cell} and FI_{medum} in our experiments.

445 **3.4 Relevance of** *in vitro* metabolism for high-throughput screening

446 Our experiments demonstrated the complexity and variability of *in vitro* metabolism over time and 447 between reporter gene assays that implement different cell lines. The difference of metabolic 448 activity of *in vitro* reporter gene assays can reduce their significance and comparability, as variable 449 exposure can occur dependent on the metabolic capacity of the cell line applied. In *in vitro* effect 450 databases, effect concentrations are generally reported for each chemical, such as the 50% activity 451 concentrations (AC₅₀) in the Tox21 database. These AC₅₀ are based on nominal concentrations, i.e., 452 those dosed to the system and will be affected by *in vitro* metabolism of the evaluated chemical to 453 different degrees depending on the metabolic activity of the cells during the assay. Furthermore, 454 many chemicals are only biologically active after metabolic activation. Eventually, the cells are

455 exposed to the parent chemical that is redelivered from the medium as well as to its metabolites 456 (Figure 1). The extent and chronology of exposure depends on the metabolic activity of the applied 457 cell line, potentially leading to variable AC_{so} of the same chemicals in different assays that are not 458 resulting from differences in the sensitivity of the receptor but from varying exposure conditions. 459 For instance, the antioxidant response element (ARE) is implemented in MFC-7 cells (AREc32 460 assay) and HepG2 cells (ARE-bla assay), thus effects of chemicals that are metabolized by the 461 cytochrome P450 enzyme complex might be less comparable between the assays, as shown 462 exemplarily for BaP in this study. Accounting for the metabolic activity of *in vitro* reporter gene 463 cells would enhance the interpretability of effect data of the biotransformation of chemicals. As 464 shown for AREc32, it is generally not sufficient to measure the basal metabolic capacity in absence 465 of chemical exposure but measuring the induction of relevant enzymes during exposure to AhR 466 ligands is needed. This study focused on CYP1A1 mRNA expression and CYP1 enzyme activity. 467 More data is needed on the expression and the activity of other CYPs and other enzyme families 468 involved in the metabolism of chemicals to comprehensively characterize the metabolic activity 469 of *in vitro* reporter gene cell lines. Existing effect data could be corrected for the metabolic rate of 470 the evaluated chemical by deriving the area under the curve that accounts for the reduced cell 471 exposure of the parent chemical over time. However, it can be expected that the metabolic activity 472 of the cells is not only dependent on their biological origin, but also on the composition and volume 473 of the medium applied as well as the test vessels used, as differences in the cellular health and 474 growth were observed for 2D cultures at different FBS contents¹⁶ and in different multi-well plate 475 materials.45 The immortalization of in vitro cells can lead to an upregulated expression of CYP 476 enzymes,⁴⁶ which agrees with the general observation of a high CYP enzyme activity in cancer 477 cells.³⁹ An experimental approach targeting the assessment of the parent chemical would be to 478 inhibit the metabolic activity of the cells, e.g., by the chemical piperonyl butoxide,⁴⁷ but bears the 479 risk for mixture effects between the metabolism inhibitor and the tested chemical.

480 **3.5 Integration of** *in vitro* metabolism in quantitative *in vitro-in vivo* models

In studies targeting the extrapolation of *in vitro* effects (QIVIVE), *in vitro* metabolism is generally desired to mimic the realistic exposure conditions in the human body. Even though metabolism is one of the key parameters to predict blood concentrations *in vivo*,⁴⁸⁵⁰ *in vitro* metabolism was so far neglected in most QIVIVE studies. A mathematical extrapolation of *in vitro* metabolism to *in vivo*

485 exposure scenarios was recently derived, however, under the premise that *in vitro* and *in vivo* cells 486 are equally metabolic active,²² so far not accounting for differences in the metabolic activity of 2D 487 and 3D cell cultures. For improved QIVIVE of biodegradable chemicals, we need to achieve 488 comparable (not equal) metabolic activities in vitro and in vivo. Experimental metabolic clearance 489 rates of well-studied AhR and p53 ligands would enable the derivation of correction factors that 490 account for differences in the metabolic activity of cells in vitro and in vivo, and could be 491 implemented in existing QIVIVE models.²² An experimental solution would be to combine reporter 492 gene assays with S9 proteins for which metabolic clearance rates are well-documented,^{s1} either 493 directly in the exposure medium during incubation, or in a fraction of the medium that is 494 subsequently dose the sample on the cells. The application of S9 proteins would mimic the 495 enzymatic degradation by the liver and could represent exposure conditions suitable for 496 extrapolation to the realistic in vivo situation. For in vitro assays that apply protein- and lipid-rich 497 FBS in the medium, in vitro metabolic clearance always needs to be related to the total medium 498 concentrations and not solely based on the free fraction. The chemicals sorbed to the medium FBS 499 can desorb to the water phase of the medium, effectively being likewise accessible for 500 biotransformation. Furthermore, the co-transport of chemicals by FBS endocytosis can increase 501 the concentration in the cells, which had been already indicated,16 a scenario that might be 502 comparable to the chemical exposure of *in vivo* cells over human serum albumin in blood.³²

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