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- 1 Title
- 2 Impact of cholesterol and sphingomyelin on intrinsic membrane permeability
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13 Abstract

14 Transwell experiments with Caco-2 or MDCK cells are the gold standard for determining the intestinal 15 permeability of chemicals. The intrinsic membrane permeability (P_0), that can be extracted from these 16 experiments, might be comparable to P_0 measured in black lipid membrane (BLM) experiments and P_0 17 predicted by the solubility-diffusion model. Unfortunately, the overlap between experimental P_{0,Caco-} 2/MDCK and PO,BLM data is very small. So far, differences between both approaches have been attributed 18 19 to the cholesterol and sphingomyelin content of cell membranes, but the database is too sparse to 20 thoroughly test this theory. To create a diverse dataset, we measured P_{0,BLM} of ten chemicals in BLM 21 experiments using DPhPC and DPhPC/cholesterol/sphingomyelin membranes. The results were 22 compared to predicted BLM data and experimental Caco-2/MDCK data obtained from literature. While 23 P_{0,BLM} of all chemicals was well predicted by the solubility-diffusion model, P_{0,Caco-2/MDCK} was only predictable for rather hydrophilic compounds with logarithmic hexadecane/water partition 24 25 coefficients below -0.5. The effect of cholesterol and sphingomyelin on P_{0.BLM} was negligibly small.

26

27 Abbreviations

BLM, black lipid membrane; Caco-2, human colorectal adenocarcinoma cells; Chol, cholesterol; D_{hex},
diffusion coefficient in hexadecane; DPhPC, 1,2-diphytanoyl-sn-glycero-3-phosphocholine; D_w,
diffusion coefficient in water; f_n, fraction of the neutral species; K_{hex/w}, hexadecane/water partition
coefficient; LSER, linear solvent energy relationship; MDCK, Madin-Darby canine kidney cells; P₀,
intrinsic permeability; P_{ABL}, aqueous boundary layer permeability; P_{app}, apparent permeability; P_{cyt},
cytosol permeability; P_m, membrane permeability; SM, sphingomyelin; x_m, thickness of membrane
hydrocarbon core

35

36 Key words

37 passive permeability, black lipid membrane, Caco-2, MDCK, cholesterol, sphingomyelin

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- 39

40 1. Introduction

Understanding the permeation across cell membranes is a crucial step in predicting the intestinal absorption of chemicals in vivo [1]. The main mechanisms involved in permeation are passive transcellular, passive paracellular and active transport. In this paper, we focus on passive transcellular transport as the most common transportation route in the intestine for all except very hydrophilic molecules [2].

The apparent passive transcellular permeability (P_{app}) of a chemical is determined by its apical and basolateral aqueous boundary layer permeability (P_{ABL}), apical and basolateral membrane permeability (P_m) and cytosol permeability (P_{cyt}) [1]:

49
$$\frac{1}{P_{app}} = \frac{1}{P_{ABL}} + \frac{1}{P_m} + \frac{1}{P_{cyt}}$$

(equation 1)

50 P_{ABL} and P_{cyt} are independent of the speciation of the chemical, because neutral and ionic species have 51 the same diffusion coefficients in aqueous media. In contrast, according to the pH-partition hypothesis, 52 membranes are not permeable to the ionic species of a chemical. Therefore, P_m is defined by the 53 neutral species and thus dependent on pH [1,3]. For better comparability, the intrinsic permeability 54 (P_0), which is independent of pH, was introduced. It can be calculated from P_m and the fraction of the 55 neutral species (f_n) at the respective pH [3]:

56
$$P_0 = \frac{P_m}{f_n}$$
 (equation 2)

57 In vitro, P₀ can be determined from transwell experiments with human colorectal adenocarcinoma 58 cells (Caco-2) or Madin-Darby canine kidney cells (MDCK) [1,4]. This method is complex because active 59 and paracellular transport, retention and biotransformation in the cells as well as cytosol and filter 60 permeability have to be taken into account when extracting Po from experimental data [1]. Black lipid 61 membrane (BLM) experiments, where a well-mixed donor and acceptor chamber are separated by a 62 phospholipid bilayer spanning over an aperture [5], are free of these artefacts [6] and often used as a 63 simplified model for biological membranes [7]. The composition of these artificial membranes is well 64 defined and can be altered systematically, which makes this experimental approach suitable for 65 mechanistic studies.

Although phospholipid bilayers are heterogenous due to the amphiphilic structure of lipids [8], it can
be assumed that the inner hydrophobic hydrocarbon core is the limiting barrier for permeation of
rather hydrophilic chemicals [6,9]. This hydrocarbon core consists of C16, C18 and other long-chain
fatty acids [10] and hexadecane is often used to model its properties due to the comparable chain
length [11,12]. Consequently, P₀ should be predictable by the simple solubility-diffusion model as a
function of the diffusion coefficient in hexadecane (D_{hex}), the partition coefficient between hexadecane
and water (K_{hex/w}) and the thickness of the hydrocarbon core (x_m) [13]:

73
$$P_0 = \frac{D_{hex} * K_{hex/w}}{x_m}$$
 (equation 3)

Indeed, a comparison between P₀ calculated according to Eq. 3 and P₀ derived from BLM experiments
 has shown good agreement for a diverse set of more than 30 chemicals [6].

- Based on these results, it can be hypothesized that the P₀ extracted from Caco-2/MDCK experiments
 might be predictable by both BLM experiments as well as the solubility-diffusion model. Unfortunately,
- there is almost no overlap between published Caco-2/MDCK and BLM data. Lomize and Pogozheva [9]
- 79 identified only five organic chemicals where experimental values are available for both systems. To
- 80 expand the dataset, they also included six experimental liposome permeabilities in the comparison. All

permeabilities were higher in BLM and liposome experiments than in cell experiments. The authors hypothesized that this discrepancy could be explained by the different lipid composition of artificial and biological membranes. They mentioned especially cholesterol and sphingomyelin because cholesterol is known for increasing the order and thickness of phospholipid membranes, thereby decreasing the permeability [14].

Therefore, the aims of this study were to: (i) examine the influence of physiological amounts of cholesterol and sphingomyelin on BLM permeability, (ii) create an overlap between BLM data and existing Caco-2/MDCK data and (iii) compare predicted and experimental BLM data with Caco-2/MDCK data.

90

91 2. Material and methods

92 2.1. BLM experiments

93 2.1.1. Selection of test compounds

94 The test compounds were selected based on a review of P₀ extracted from MDCK/Caco-2 experiments 95 [1]. Zwitterions were excluded, because the permeability of zwitterions might be substantially lower 96 than the permeability of the neutral species as studies with amino acids indicated [15]. Furthermore, 97 we excluded chemicals for which active transport might have affected the calculation of P_{0,Caco-2/MDCK}. 98 Eleven chemicals were selected based on their diversity in P_{0,Caco-2/MDCK} and predicted P_{0,BLM}, sufficient 99 water solubility and detectability via LC-MS. One of these chemicals, cimetidine, was subsequently 100 excluded due to effects on membrane integrity (see Supplementary data for details). All selected 101 chemicals are listed in Table S1 in the Supplementary data. Salicylic acid was chosen to validate the 102 system, because both BLM and Caco-2/MDCK data are published for this compound.

103 2.1.2. Selection of membrane lipids

1,2-diphytanoyl-sn-glycero-3-phosphocholine (DPhPC) was used for membrane formation due to its
high stability [16] and permanent liquid crystalline state at room temperature [17]. To create
membranes with a more physiological composition, we also used a mix of 58 mol% DPhPC, 36 mol%
cholesterol (Chol) and 6 mol% sphingomyelin (SM) based on a publication by Symons et al. on the lipid
composition of MDCK plasma membranes [18].

109 2.1.3. Selection of experimental pH

110 We selected a suitable pH based on the permeability measured in Caco-2/MDCK experiments and 111 predicted by the solubility-diffusion model. In preliminary experiments, we determined a log PABL of 112 about -3.6, which corresponds to a total ABL thickness of about 250 µm. To assure that the effect of 113 the ABL is negligible, log P_{app,BLM} of the test compound at the chosen pH had to be about -4.1 or lower. Reducing the f_n by adapting the buffer pH allowed us to adjust P_{app,BLM} in accordance with Eq. 2. Limited 114 115 by the instability of the membrane at extreme pH, we used the following buffers between pH 4 and 116 10: 10 mM β -alanine (pH 4), 5 mM β -alanine and 5 mM MES (pH 5), 10 mM MES (pH 6), 10 mM MOPS 117 (pH 7), 10 mM TAPS (pH 8 and pH 9) and 10 mM CAPSO (pH 10). All buffer solutions contained 1 mM 118 KCl buffer for electrical measurement of membrane capacitance.

119 2.1.4. Measurement

- 120 The experiments were conducted at room temperature (20-27 °C). The experimental setup consisted
- 121 of a Delrin bilayer chamber and a polystyrene cup (diameter: 13 mm) with a customized aperture
- 122 (diameter: 1 mm) (Multi Channel Systems MCS GmbH a division of Harvard Bioscience, Inc., Reutlingen,

123 Germany). The aperture was pre-painted with DPhPC (total lipid concentration: $20 \,\mu g/\mu l$) or 124 DPhPC/Chol/SM mix (total lipid concentration: $28 \mu g/\mu l$) dissolved in decane to create a hydrophobic 125 anchor. A higher total lipid concentration was used in the DPhPC/Chol/SM mix because no stable 126 membrane could be formed with less lipid. The assembled chamber was placed on a Cimarec i Mono 127 Direct Stirrer (Thermo Fisher Scientific Inc., Waltham, USA) set to about 400 rpm. 1 ml buffer solution 128 was added to each compartment. Ag/AgCl electrodes were placed in each compartment and an eONE 129 single channel amplifier and the corresponding software Elements Data Reader version 3.7.14 and 130 3.8.3 were used (Elements SRL, Cesena, Italy) for electrical measurements. Membranes were painted 131 according to Mueller et al. [19,20] using the same lipid composition as for pre-painting. Specific capacitance values between 0.3 and 0.6 µF/cm² indicated the formation of a membrane. During 132 133 electrical measurements, a faraday cage was placed on top of the chamber to reduce noise. After 134 30 min, 50 µl buffer was removed from both sides and analysed for possible contaminations. The 135 volume was replaced with fresh buffer. 100-200 µl buffer was removed from the donor chamber and 136 replaced with the stock solution of the chemical of interest. We aimed to keep the concentration on 137 the donor side as low as possible to avoid effects of the test compound on membrane integrity, but 138 sufficiently high to be still detectable on the acceptor side. 50 μ l samples from the acceptor side were taken after 15 min, 1 h and then every hour until the membrane collapsed or the capacitance was 139 140 outside the predefined range. Due to instability at pH 10, the samples were taken after 15 min, 1 h and 141 then every 30 min. The removed sample volume was replaced with fresh buffer each time. All 142 experiments were performed at least in duplicate.

143 2.1.5. Sample analysis

144 Sample analysis was conducted using an Infinity II 1260 LC system coupled to a 6420 triple quadrupole 145 with ESI source (Agilent Technologies Inc., Santa Clara, USA). Depending on the peak shape and area 146 either Kinetex[®] F5 (2.6 μm; 100 Å; 50 * 3.0 mm) or Kinetex[®] C18 (2.6 μm; 100 Å; 50 * 3.0 mm) LC 147 columns were used (Phenomenex Inc., Torrance, USA). The columns were protected by KrudKatcher™ 148 ULTRA HPLC In-Line Filters and SecurityGuard[™] ULTRA Catridges (Phenomenex Inc., Torrance, USA). 149 Double distilled water with 5 mM ammonium acetate and 1 % MeOH (pH 7.3) or double distilled water 150 with 1 % MeOH and 0.1 % HCOOH (pH 2.7) was used as eluent A, while MeOH with 0.1 % HCOOH was 151 used as eluent B.

- 152 2.1.6. Data analysis
- 153 P_{app,BLM} for each time interval was calculated as follows:

154
$$P_{app,BLM} = \frac{c_{tx} - c_{tx-1} * 0.95}{t_x - t_{x-1}} * \frac{V}{A * \Delta c}$$
 (equation 4)

155 Where c_{tx} and c_{tx-1} are the acceptor concentrations measured at the two consecutive time points t_x and 156 t_{x-1} . A dilution correction factor of 0.95 accounts for the removal of 50 µl acceptor volume and the 157 replacement with fresh buffer during sampling. V is the volume of the acceptor chamber, A is the 158 membrane area and Δc is the applied concentration difference. $P_{app,BLM}$ from each time interval and 159 replicate were averaged to obtain the mean $P_{app,BLM}$ and the associated standard deviation.

Given that P_{cyt} is non-existent in BLM experiments and the impact of P_{ABL} is negligible at the selected buffer pH, $P_{app,BLM}$ was equated to P_m and $P_{0,BLM}$ was calculated according to Eq. 2. f_n was calculated based on the experimental $pK_{a (25 °C)}$ provided by Avdeef [1] (see Eq. S1 in the Supplementary data) and checked for plausibility with JChem for Office [21]. If no experimental $pK_{a (25 °C)}$ was available, it was recalculated from $pK_{a (37 °C)}$ as described elsewhere [22].

165

166 2.2. Prediction of P_{0,LSER} by the solubility-diffusion model

167 $P_{0,LSER}$ was calculated according to Eq. 3. $D_{hex (25 °C)}$ was assumed to be one tenth of the diffusion 168 coefficient in water ($D_{w (25 °C)}$). [6] $D_{w (25 °C)}$ was estimated from the molecular weight (MW) of the 169 compound [23]:

170
$$D_{hex} = 0.1 * 10^{(-4.13 - 0.453 * \log(MW))}$$
 (equation 5)

171 Based on experimental Linear Solvation Energy Relationship (LSER) descriptors, $K_{hex/w}$ (25 °C) was 172 predicted using UFZ-LSER database [24] (see Table S2 in the Supplementary data). Experimental 173 descriptors were taken from "UFZ-preselected published values" dataset if available. Otherwise, the 174 "Abraham Absolv" dataset was used. The hydrocarbon core thickness x_m was estimated from the 175 specific capacitance (C_m) using the vacuum permittivity (ϵ_0) of 8.85 * 10⁻¹² F/m and the dielectric 176 constant of the hydrocarbon core (ϵ_m) of 2.1 [16,25]:

177
$$x_m = \frac{\varepsilon_0 * \varepsilon_m}{c_m}$$
 (equation 6)

178 For C_m between 0.3 and 0.6 μ F/cm² this results in a x_m of about 40 Å.

179 2.3. Comparison of BLM and LSER data with Caco-2/MDCK data

To compare P_{0,BLM} and P_{0,LSER} at 25 °C with P_{0,Caco-2/MDCK} at 37 °C, adjustments were necessary. A temperature correction factor of 1.348 was included in the calculation of D_{hex} [4]. P_{0,BLM} and P_{0,LSER} were multiplied by 2 because cell membranes with 20 Å [25] are only half as thick as BLM formed with decane as solvent. The presence of two (apical and basolateral) membranes in cell experiments was considered by adding their resistances and a correction factor of 24 was included in the calculation of the permeability of the apical membrane to take into account that the surface area is increased by microvilli [6,26]:

187
$$P_{0^*(37\ ^\circ C)} = \frac{1}{R_{apical} + R_{basolateral}} = \frac{1}{\frac{1}{P_0(25\ ^\circ C)^{*1.348*2*24} + \frac{1}{P_0(25\ ^\circ C)^{*1.348*2}}}}$$
(equation 7)

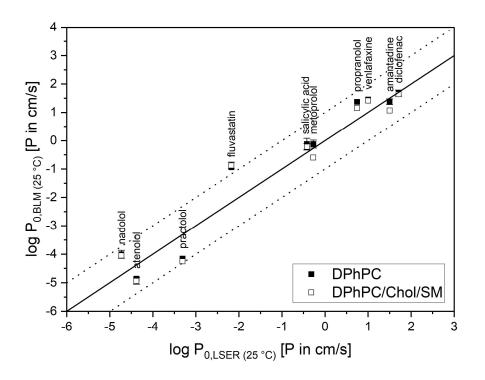
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189 3. Results and Discussion

190 3.1. Prediction of log P_{0,BLM} by the solubility-diffusion model

191 Papp, BLM of ten chemicals was determined in BLM experiments. The resulting log P_{0,BLM} values cover six orders of magnitude. Log PO, BLM of salicylic acid was measured to validate the system because BLM data 192 from literature are available for this compound. With log P_{0,BLM} [P in cm/s] of -0.13, our result is in good 193 194 agreement with the reported values of 0.08 [27], -0.11 [28,29] and -0.15 [30], although different lipids 195 and membrane forming techniques are used. While Gutknecht [28], Gutknecht and Tosteson [30] and 196 Walter and Gutknecht [29] used egg lecithin and the painting technique, Saparov et al. [27] used DPhPC 197 and the folding technique [31]. The comparable results suggests that log P_{0,BLM} of pure lipid membranes 198 is not significantly affected by the used lipid or technique. This assumption is supported by a study by 199 Walter and Gutknecht [29] who also reported negligible differences between used lipids and 200 techniques for three organic acids.

To verify the hypothesis that log P_{0,BLM} should be predictable by the solubility-diffusion model, log P_{0,LSER} values predicted with Eq. 3 are compared to experimental log P_{0,BLM} values in Fig. 1. For all compounds the deviation between both values is within about one order of magnitude. This range was expected given the uncertainty associated with estimating K_{hex/w} from experimental LSER descriptors with varying quality. It supports the work of Bittermann and Goss [6] who also found good agreement
 between experimental log P_{0,BLM} and predicted log P_{0,LSER} of 37 compounds.



207

Figure 1: Comparison of predicted log $P_{0,LSER}$ and experimental log $P_{0,BLM}$ derived from pure DPhPC and DPhPC/Chol/SM membranes. Symbols represent the average log $P_{0,BLM}$ of two to three replicates +/- standard deviation. Error bars are only shown when they exceed the size of the symbol. All values are listed in Table S3 in the Supplementary data.

211

212 3.2. Difference between pure DPhPC and DPhPC/Chol/SM membranes

213 To examine the effect of Chol and SM on BLM permeability, log P_{0.BLM} was determined for both pure 214 DPhPC membranes and DPhPC membranes containing physiological amounts of Chol and SM. As shown in Fig. 1, log P_{0,BLM} of pure DPhPC membranes is slightly higher than log P_{0,BLM} of DPhPC/Chol/SM 215 membranes for all compounds except fluvastatin. Nevertheless, with 0.14 log units on average, the 216 217 difference in log P_{0,BLM} between both membrane types is mostly within the observed standard 218 deviation and could be attributed to measurement uncertainties. More significant differences were 219 reported by Finkelstein who compared the permeability of pure lecithin membranes and lecithin 220 membranes containing 67 % cholesterol and found differences of 0.6 up to 1.1 log units for four organic compounds [12]. Xiang et al. got a similar difference of 0.6 log units when comparing the permeability 221 222 of two compounds across lecithin membranes with and without 30 mol% cholesterol [32]. This 223 permeability decreasing effect of cholesterol is attributed to the ordering effect on acyl chains [33] as 224 well as the condensing effect that reduces the surface area per lipid molecule and therefore increases 225 the membrane thickness [14,33]. A possible reason for the smaller impact of cholesterol on our 226 membranes is the usage of DPhPC instead of lecithin. The methylated acyl chains of DPhPC may impede 227 the ordering effect of cholesterol by steric hindrance [34]. It may be also possible that the coexistence 228 of SM reduces the ordering effect of cholesterol. This hypothesis is supported by a study by van Duyl 229 et al. [35] who examined the influence of SM on cholesterol-containing DOPC membranes. They found 230 that SM-containing membranes are less ordered by cholesterol and attributed this to the high affinity 231 of Chol to SM, resulting in the formation of Chol/SM rich domains at ambient temperature. This implies that less Chol is located in the glycerophospholipid part of the membrane and the ordering effect isreduced.

3.3. Comparison of predicted log P_{0,LSER*} and experimental log P_{0,BLM*} and log P_{0,Caco-2/MDCK}

235 For comparison with log P_{0,Caco-2/MDCK} obtained from literature [1], we did not adjust the prediction of 236 log P_{0.LSER} to the Chol and SM content of cell membranes, because the effect seems to be negligible. 237 But nevertheless we used log P_{0,BLM} derived from experiments with DPhPC/Chol/SM membranes due 238 to the higher similarity to cell membranes. Log P_{0,BLM} as well as log P_{0,LSER} were adjusted for differences 239 in temperature, surface area, number and thickness of membranes according to Eq. 7. The resulting 240 log P_{0,BLM*} and log P_{0,LSER*} are plotted against log P_{0,Caco-2/MDCK} in Fig 2. For five compounds all three 241 datasets are in good accordance, but there are substantial differences for the five remaining 242 compounds. Therefore, our results do not support the hypothesis by Lomize and Pogozheva [9] that 243 the differences between log P_{0,BLM} and log P_{0,Caco-2/MDCK} are caused by the Chol and SM content of cell 244 membranes. Even differences of about 0.6 log units between the permeability of cholesterol-245 containing and cholesterol-free membranes as described by Finkelstein [12] and Xiang et al. [32] could 246 not explain these discrepancies of up to 4.7 log units. Instead, prevailing differences seem to be related 247 to log K_{hex/w}. The five compounds in our dataset, where log P_{0,BLM*}, log P_{0,LSER*} and log P_{0,Caco-2/MDCK} are in 248 good accordance, are those with low log $K_{hex/w}$ (log $K_{hex/w}$ = -4.87 to -0.72). Neglecting liposome 249 permeabilities, the five organic compounds included in Lomize and Pogozheva's [9] comparison of 250 experimental log P_{0,BLM} and log P_{0,Caco-2/MDCK} also have low log K_{hex/w} (log K_{hex/w} = -7 to -0,72). The 251 maximum deviation between both values in their dataset does not exceed 1.3 log units, which supports 252 our assumption that BLM experiments can be used to predict log P_{0,Caco-2/MDCK} of hydrophilic 253 compounds. The five deviating compounds in our dataset are those with high log K_{hex/w} which 254 implicates that the prediction of experimental log P_{0,Caco-2/MDCK} is problematic for rather lipophilic 255 compounds. Based on the solubility-diffusion theory, log P0,Caco-2/MDCK should increase with increasing 256 log K_{hex/w}. It is therefore contrary to mechanistic understanding that compounds with high log K_{hex/w} as 257 metoprolol, propranolol, venlafaxine, amantadine and diclofenac (log K_{hex/w} = -0,44 to 1,56) permeate 258 slower through cell membranes than compounds with smaller log Khex/w such as salicylic acid (log Khex/w 259 = -0,72). A possible explanation is the limiting effect of the ABL. Rather lipophilic compounds may find 260 their main resistance in the ABL instead of the membrane leading to inaccurate calculations of 261 log P_{0,Caco-2/MDCK}. Nevertheless, this explanation seems unlikely because Avdeef took great care to 262 eliminate the effects of the ABL in his data collection [1]. Another possible reason is that biological 263 membranes consist of more than phospholipids, cholesterol and sphingomyelin. Membrane proteins 264 might reduce the passive permeability of chemicals by reducing the accessible membrane surface area 265 or increasing the membrane thickness [36]. But these effects should decrease the permeability of all 266 molecules, not only lipophilic ones. Apart from differences in the composition of artificial and biological 267 membranes, it must also be considered that effects in the cytosol could be responsible for the 268 deviation of rather lipophilic compounds. This will be the main focus of our future research.

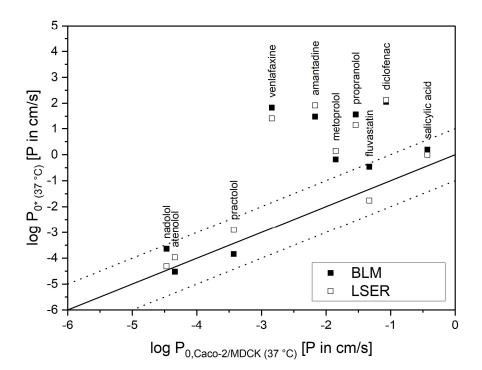




Figure 2: Comparison of predicted log P_{0,LSER}, experimental log P_{0,BLM} and experimental log P_{0,Caco-2/MDCK}. Log P_{0,LSER} and log P_{0,BLM} were calculated from respective log P_{0,LSER} and log P_{0,BLM} derived from DPhPC/Chol/SM membranes and adjusted for temperature, surface area, number and thickness of membranes. All values are listed in Table S3 in the Supplementary data.

274

275 **4. Conclusion**

276 Log P_{0,BLM} is well predicted by the solubility-diffusion model using LSER, especially when high-quality

277 experimental descriptors are available. The influence of Chol and SM on log P_{0,BLM} seems to be minimal.

278 Nevertheless, using experimental log $P_{0,BLM}$ as well as predicted log $P_{0,LSER}$ to predict log $P_{0,Caco-2/MDCK}$

279 remains problematic. While compounds with log $K_{hex/w}$ values below -0.5 seem to be well predicted,

compounds with higher log $K_{hex/w}$ values show unexpectedly low log $P_{0,Caco-2/MDCK}$. This deviation of rather lipophilic compounds has to be addressed in future research.

282

283 Appendix A. Supplementary data

284

285 References

- [1] A. Avdeef, Absorption and drug development. Solubility, permeability, and charge state, 2nd ed.,
 John Wiley & Sons, Hoboken N.J., 2012.
- P. Artursson, K. Palm, K. Luthman, Caco-2 monolayers in experimental and theoretical
 predictions of drug transport, Adv. Drug Deliver. Rev. 64 (2012) 280–289.
- 290 https://doi.org/10.1016/j.addr.2012.09.005.
- [3] A. Avdeef, Physicochemical profiling (solubility, permeability and charge state), Curr. Top. Med.
 Chem. 1 (2001) 277–351. https://doi.org/10.2174/1568026013395100.

293 [4] A. Avdeef, P. Artursson, S. Neuhoff, L. Lazorova, J. Gråsjö, S. Tavelin, Caco-2 permeability of 294 weakly basic drugs predicted with the double-sink PAMPA pKa(flux) method, Eur. J. Pharm. Sci. 295 24 (2005) 333–349. https://doi.org/10.1016/j.ejps.2004.11.011. 296 [5] P. Mueller, D.O. Rudin, H.T. Tien, W.C. Wescott, Reconstitution of cell membrane structure in 297 vitro and its transformation into an excitable system, Nature 194 (1962) 979–980. 298 https://doi.org/10.1038/194979a0. 299 [6] K. Bittermann, K.-U. Goss, Predicting apparent passive permeability of Caco-2 and MDCK cell-300 monolayers: A mechanistic model, PLoS ONE 12 (2017) e0190319. 301 https://doi.org/10.1371/journal.pone.0190319. [7] Š. Skalová, V. Vyskočil, J. Barek, T. Navrátil, Model Biological Membranes and Possibilities of 302 303 Application of Electrochemical Impedance Spectroscopy for their Characterization, 304 Electroanalysis 30 (2018) 207–219. https://doi.org/10.1002/elan.201700649. 305 [8] C. Hannesschlaeger, A. Horner, P. Pohl, Intrinsic Membrane Permeability to Small Molecules, 306 Chem. Rev. 119 (2019) 5922–5953. https://doi.org/10.1021/acs.chemrev.8b00560. 307 [9] A.L. Lomize, I.D. Pogozheva, Physics-Based Method for Modeling Passive Membrane 308 Permeability and Translocation Pathways of Bioactive Molecules, J. Chem. Inf. Model. 59 (2019) 309 3198–3213. https://doi.org/10.1021/acs.jcim.9b00224. 310 [10] G. Enkavi, M. Javanainen, W. Kulig, T. Róg, I. Vattulainen, Multiscale Simulations of Biological 311 Membranes: The Challenge To Understand Biological Phenomena in a Living Substance, Chem. 312 Rev. 119 (2019) 5607–5774. https://doi.org/10.1021/acs.chemrev.8b00538. 313 [11] A. Walter, J. Gutknecht, Permeability of small nonelectrolytes through lipid bilayer membranes, 314 J. Membr. Biol. 90 (1986) 207–217. https://doi.org/10.1007/BF01870127. 315 [12] A. Finkelstein, Water and nonelectrolyte permeability of lipid bilayer membranes, J. Gen. 316 Physiol. 68 (1976) 127–135. https://doi.org/10.1085/jgp.68.2.127. [13] A. Missner, P. Pohl, 110 years of the Meyer-Overton rule: predicting membrane permeability of 317 318 gases and other small compounds, Chemphyschem 10 (2009) 1405–1414. 319 https://doi.org/10.1002/cphc.200900270. 320 [14] F. de Meyer, B. Smit, Effect of cholesterol on the structure of a phospholipid bilayer, Proc. Natl. 321 Acad. Sci. USA 106 (2009) 3654–3658. https://doi.org/10.1073/pnas.0809959106. 322 [15] A.C. Chakrabarti, D.W. Deamer, Permeability of lipid bilayers to amino acids and phosphate, 323 Biochim. Biophys. Acta Biomembr. 1111 (1992) 171–177. https://doi.org/10.1016/0005-324 2736(92)90308-9. 325 [16] T. Baba, Y. Toshima, H. Minamikawa, M. Hato, K. Suzuki, N. Kamo, Formation and 326 characterization of planar lipid bilayer membranes from synthetic phytanyl-chained glycolipids, 327 Biochim. Biophys. Acta Biomembr. 1421 (1999) 91–102. https://doi.org/10.1016/S0005-328 2736(99)00114-5. 329 [17] H. Lindsey, N.O. Petersen, S.I. Chan, Physicochemical characterization of 1,2-diphytanoyl-sn-330 glycero-3-phosphocholine in model membrane systems, Biochim. Biophys. Acta Biomembr. 555 331 (1979) 147-167. https://doi.org/10.1016/0005-2736(79)90079-8. 332 [18] J.L. Symons, K.-J. Cho, J.T. Chang, G. Du, M.N. Waxham, J.F. Hancock, I. Levental, K.R. Levental, 333 Lipidomic atlas of mammalian cell membranes reveals hierarchical variation induced by culture 334 conditions, subcellular membranes, and cell lineages, Soft Matter 17 (2021) 288–297. 335 https://doi.org/10.1039/d0sm00404a. 336 [19] P. Mueller, D.O. Rudin, H.T. Tien, W.C. Wescott, Methods for the Formation of Single 337 Bimolecular Lipid Membranes in Aqueous Solution, J. Phys. Chem. 67 (1963) 534–535. 338 https://doi.org/10.1021/j100796a529.

- [20] T. Gutsmann, T. Heimburg, U. Keyser, K.R. Mahendran, M. Winterhalter, Protein reconstitution
 into freestanding planar lipid membranes for electrophysiological characterization, Nat. Protoc.
 10 (2015) 188–198. https://doi.org/10.1038/nprot.2015.003.
- 342 [21] ChemAxon, JChem for Office v21.3.0.817 (2021). http://www.chemaxon.com.
- [22] N. Sun, A. Avdeef, Biorelevant pK(a) (37 °C) predicted from the 2D structure of the molecule and
 its pK(a) at 25 °C, J. Pharmaceut. Biomed. 56 (2011) 173–182.
- 345 https://doi.org/10.1016/j.jpba.2011.05.007.
- [23] A. Avdeef, Leakiness and size exclusion of paracellular channels in cultured epithelial cell
 monolayers-interlaboratory comparison, Pharm. Res. 27 (2010) 480–489.
- 348 https://doi.org/10.1007/s11095-009-0036-7.
- [24] N. Ulrich, S. Endo, T.N. Brown, N. Watanabe, G. Bronner, M.H. Abraham, K.-U. Goss, UFZ-LSER
 database v3.2.1 (2017). http://www.ufz.de/lserd.
- [25] R. Fettiplace, D.M. Andrews, D.A. Haydon, The thickness, composition and structure of some
 lipid bilayers and natural membranes, J. Membr. Biol. 5 (1971) 277–296.
 https://doi.org/10.1007/BF01870555.
- [26] S.L. Palay, L.J. Karlin, An Electron Microscopic Study of the Intestinal Villus: II. The Pathway of
 Fat Absorption, J. Biophys. Biochem. Cytol. 5 (1959) 373–384.
- 356 https://doi.org/10.1083/jcb.5.3.373.
- 357 [27] S.M. Saparov, Y.N. Antonenko, P. Pohl, A new model of weak acid permeation through
 358 membranes revisited: does Overton still rule?, Biophys. J. 90 (2006) L86-8.
 359 https://doi.org/10.1529/biophysj.106.084343.
- [28] J. Gutknecht, Aspirin, acetaminophen and proton transport through phospholipid bilayers and
 mitochondrial membranes, Mol. Cell. Biochem. 114 (1992) 3–8.
 https://doi.org/10.1007/BF00240290.
- 363 [29] A. Walter, J. Gutknecht, Monocarboxylic acid permeation through lipid bilayer membranes, J.
 364 Membr. Biol. 77 (1984) 255–264. https://doi.org/10.1007/BF01870573.
- [30] J. Gutknecht, D.C. Tosteson, Diffusion of weak acids across lipid bilayer membranes: effects of
 chemical reactions in the unstirred layers, Science 182 (1973) 1258–1261.
- 367 https://doi.org/10.1126/science.182.4118.1258.
- 368 [31] M. Montal, P. Mueller, Formation of bimolecular membranes from lipid monolayers and a study
 369 of their electrical properties, Proc. Natl. Acad. Sci. USA 69 (1972) 3561–3566.
 370 https://doi.org/10.1073/pnas.69.12.3561.
- 371 [32] T.X. Xiang, J. Chen, B.D. Anderson, A quantitative model for the dependence of solute
 372 permeability on peptide and cholesterol content in biomembranes, J. Membr. Biol. 177 (2000)
 373 137–148. https://doi.org/10.1007/s002320001107.
- [33] T. Róg, M. Pasenkiewicz-Gierula, I. Vattulainen, M. Karttunen, Ordering effects of cholesterol
 and its analogues, Biochim. Biophys. Acta 1788 (2009) 97–121.
- 376 https://doi.org/10.1016/j.bbamem.2008.08.022.
- 377 [34] W.C. Hung, F.Y. Chen, H.W. Huang, Order–disorder transition in bilayers of diphytanoyl
 378 phosphatidylcholine, Biochim. Biophys. Acta Biomembr. 1467 (2000) 198–206.
 379 https://doi.org/10.1016/S0005-2736(00)00221-2.
- [35] B.Y. van Duyl, D. Ganchev, V. Chupin, B. de Kruijff, J. Killian, Sphingomyelin is much more
 effective than saturated phosphatidylcholine in excluding unsaturated phosphatidylcholine from
 domains formed with cholesterol, FEBS Lett. 547 (2003) 101–106.
- 383 https://doi.org/10.1016/S0014-5793(03)00678-1.
- 384 [36] K. Mitra, I. Ubarretxena-Belandia, T. Taguchi, G. Warren, D.M. Engelman, Modulation of the
- 385 bilayer thickness of exocytic pathway membranes by membrane proteins rather than

- 386 cholesterol, Proc. Natl. Acad. Sci. USA 101 (2004) 4083–4088.
- 387 https://doi.org/10.1073/pnas.0307332101.