

## QSAR of estrogen receptor modulators: exploring selectivity requirements for ER $\alpha$ versus ER $\beta$ binding of tetrahydroisoquinoline derivatives using E-state and physicochemical parameters<sup>☆</sup>

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**Abstract**—Considering importance of developing selective estrogen receptor modulators (SERMs), the present paper explores selectivity requirements of tetrahydroisoquinoline derivatives for binding with ER $\alpha$  versus ER $\beta$  receptors using E-state index and physicochemical parameters. The best model [ $n = 21$ ,  $Q^2 = 0.512$ ,  $R_a^2 = 0.613$ ,  $R = 0.819$ ,  $F = 11.6$  (df 3,17)] for ER $\alpha$  binding data obtained from radioligand binding assay showed importance of  $C_1$ ,  $C_{15}$  and lipophilicity ( $\log P$ ) while the best model [ $n = 21$ ,  $Q^2 = 0.768$ ,  $R_a^2 = 0.796$ ,  $R = 0.904$ ,  $F = 40.1$  (df 2,18)] for ER $\beta$  binding data showed importance of  $C_1$  and molar refractivity (MR). While modeling ER $\alpha$ /ER $\beta$  selectivity [ $n = 21$ ,  $Q^2 = 0.695$ ,  $R_a^2 = 0.739$ ,  $R = 0.882$ ,  $F = 19.8$  (df 3,17)],  $C_1$ ,  $C_{15}$  and molar refractivity were found to be significant contributors. The data obtained from cellular transcription assay were also modeled. In case of ER $\alpha$ , the best equation involving E-state values of  $C_1$  and  $C_{14}$  and  $\log P$  explained 62.1% of the variance while the best equation for ER $\beta$  involving E-state values of  $C_1$  and  $C_{15}$  and MR explained 64.6% of the variance of the response variable. In case of ER $\alpha$ /ER $\beta$  selectivity, the best equation involving E-state values of  $O_8$ ,  $C_{14}$  and  $N_{27}$  showed 48.3% explained variance, which increased to 63.5% on deletion of single outlier. From the analysis it appears that the nitrogen atom of the aminoethoxyphenyl substituent and 6-hydroxy substituent of the tetrahydroisoquinoline nucleus play important roles for ER $\alpha$ /ER $\beta$  selectivity in addition to  $R_1$  and  $R_2$  substituents.

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Estrogenic effects have been primarily related with the female reproductive organs and are mediated principally through the estrogen receptor (ER). Estrogens also have direct effect on other tissues, for example, they are known to be present in specific cells of the skeletal and cardiovascular systems.<sup>1,2</sup> ER is a member of the nuclear hormone receptor superfamily.<sup>3</sup> Different ER-ligands induce distinct structural changes in the receptor that influence its ability to interact with other proteins critical for the regulation of target gene transcription. The ER selectivity reflects the diversity of estrogen receptor forms and regulators and the diversity of ER target genes. The principal endogenous ligand for ER in most

species is 17- $\beta$  estradiol. The biological effects of estrogens are known to be mediated by two receptors referred to as estrogen receptor- $\alpha$  (ER $\alpha$ ) and receptor- $\beta$  (ER $\beta$ ).<sup>4</sup> The existence of these two subtypes provide possible explanation for the tissue-selectivity.<sup>5</sup> The two receptors differ in size, with ER $\alpha$  having 595 amino acids and ER $\beta$  having 485 amino acids. The predominant ER in the female reproductive tract and mammary glands is ER $\alpha$ , whereas ER $\beta$  is the primary ER in vascular endothelial cells, bone and male prostate tissues. The compounds that have the potential to modulate selectivity of the different estrogen target tissues are known as selective estrogen receptor modulators (SERMs).<sup>4</sup> An aryl substituted pyrazole derivative was reported to be the first agent that could discriminate between ER $\alpha$  and ER $\beta$  subtypes.<sup>6</sup> This compound was found to have 120-fold higher potency to stimulate ER $\alpha$  than ER $\beta$ .<sup>6</sup> The binding sites of ER $\alpha$  and ER $\beta$  differ in two amino acids (Leu and Met in  $\alpha$  subtype are replaced by Met and Ile respectively in ER $\beta$ ).<sup>7</sup> The existence of two rather than one ER makes

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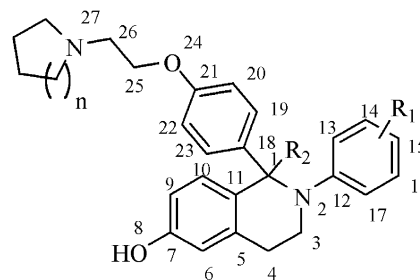
the mechanism of action of estrogens and antiestrogens (SERMs) more complex.<sup>8</sup> Estrogens, upon binding to its high-affinity receptor (or receptors), trigger expression of multiple genes involved in the regulation of cell proliferation and differentiation.<sup>9</sup> Unlike estrogens and antiestrogens, the SERMs exert selective agonist or antagonist effects on different estrogen target sites.<sup>10,11</sup> This unique effect of SERMs may be due to following three mechanisms: (i) differences in estrogen receptor expression in different tissues; (ii) differences in estrogen receptor conformation on ligand binding and (iii) differences in expression and binding to estrogen receptor of coregulatory proteins. ER $_{\alpha}$  is always activator, whereas ER $_{\beta}$  inhibits the actions of estrogen. Therefore, the relative level of expression of these two types of receptors will affect the cellular responsiveness to SERMs.

A number of SERMs are currently in clinical trials and two compounds of this category, tamoxifen and raloxifene, are presently in the market for the treatment of hormone-dependent breast cancer<sup>11,12</sup> and prevention and treatment for osteoporosis.<sup>13</sup> However, both these agents have been linked to increased risks of thromboembolism and tamoxifen has been shown to increase the risk of endometrial cancer.<sup>13–15</sup> Hence the search for more tissue specific analogues continues, so as to develop distinct SERMs with lesser side effects. Recently tetrahydroisoquinolines<sup>16</sup> have been reported as potent ER $_{\alpha}$  selective ligands. The present paper explores selectively requirements of tetrahydroisoquinoline derivatives<sup>16</sup> for binding with ER $_{\alpha}$  versus ER $_{\beta}$  receptors using atom level E-state index and physicochemical parameters (hydrophobicity log *P* and molar refractivity MR). Both radioligand binding (RLB) assay and estrogen response element (ERE) assay data were modeled in the present analysis. The biological activity values [IC<sub>50</sub> (nM)] were first converted to logarithmic scale [pIC<sub>50</sub> (μM)] and then used for the QSAR modeling.

Topological models directly give structural information to guide design of new molecules.<sup>17</sup> The electrotopological state (E-state) of atoms has been reported to be of importance in elucidating the important atoms or substructure in drug–receptor interactions.<sup>18–23</sup> An atom in a molecule is part of a field of information with regard to electronic influences and topological surroundings.<sup>18,24</sup> Quantification of influence of this field on any atom can correlate to the biological performance of a molecule. The contribution of an atom can be expressed as the electrotopological state (E-state),<sup>25</sup> mathematically defined as

$$S_i = I_i + \Delta I_i \quad \text{where,} \quad I = [(2/N)^2 \delta^v + 1]/\delta \quad \text{and} \\ \Delta I_i = \sum (I_i - I_j)/r_{ij}^2$$

*I* is the intrinsic state of an atom,  $\Delta I_i$  is the perturbation effect, *N* is the principal quantum number,  $\delta$  is the number of sigma electrons on the atom (excluding those bonding to hydrogen),  $\delta^v$  is the number of valence electrons (excluding those bonding to hydrogen), *i* and *j* are serial numbers of atoms and  $r_{ij}$  is the shortest graph distance between two atoms *i* and *j* plus one.



**Figure 1.** General structure of tetrahydroisoquinoline derivatives: common atoms are numbered 1–27.

In the present work, the atoms of the molecules were numbered keeping serial numbers of the common atoms same in all the compounds (as shown in Fig. 1). The E-state index values ( $S_X$ ) were calculated using ELECTRO1 program.<sup>26</sup> The physicochemical parameter values (log *P* and MR) were calculated by Chem Draw Ultra 5.0 software<sup>27</sup> using Crippen's fragmentation method.<sup>28</sup> All compounds considered in the present study contain 27 common atoms (excluding hydrogens). Using the program AUTOREG,<sup>26</sup> all possible combinations of predictor variables were tried (all-possible-subsets regression) with a restriction that predictor variables used in an equation are not much intercorrelated ( $|r| < 0.5$ ). Using the program RRR98,<sup>26</sup> regression coefficients with corresponding standard errors and various statistical parameters reflecting quality<sup>29</sup> (like explained variance  $R_a^2$ , correlation coefficient *R*, standard error of estimate *s*, variance ratio *F* and average of absolute values of the residuals AVRES) of the equations were found out. Leave-one-out (LOO) cross-validation<sup>30</sup> was done using the programs KRPRE1 and KRPRE2,<sup>26</sup> which generate predicted variance ( $Q^2$ ), predicted residual sum of squares (PRESS), standard deviation based on PRESS (SPRESS), standard deviation of error of prediction (SDEP) and average of absolute values of predicted residuals (Pres<sub>av</sub>).

While modeling radioligand binding assay data, the best model for ER $_{\alpha}$  binding data shows 51.2% leave-one-out predicted variance while explained variance of the equation is 61.3%.

$$[\text{pIC}_{50}]_{\alpha}^{\text{RLB}} = 0.586(\pm 0.369)S_1 - 0.096(\pm 0.079)S_{15} \\ - 0.158(\pm 0.091)\log P + 2.764 \\ n = 21, \quad R_a^2 = 0.613, \quad R^2 = 0.671, \\ R = 0.819, \quad F = 11.6 \text{ (df 3, 17)}, \\ s = 0.112, \quad \text{AVRES} = 0.087, \\ Q^2 = 0.512, \quad \text{SDEP} = 0.122, \\ \text{SPRESS} = 0.136, \quad \text{Pres}_{\text{av}} = 0.107 \quad (1)$$

Eq. 1 shows importance of C<sub>1</sub>, C<sub>15</sub> and lipophilicity (log *P*) of the molecules. The positive coefficient of *S*<sub>1</sub> and negative coefficient of *S*<sub>15</sub> in Eq. 1 indicates that the ER $_{\alpha}$  binding affinity increases with increase of E-state value of C<sub>1</sub> (mainly influenced by R<sub>2</sub> substituent) and decrease of E-state value of C<sub>15</sub> (mainly influenced by R<sub>1</sub> substituent). Again, the negative coefficient of

$\log P$  indicates that the  $ER_{\alpha}$  binding affinity decreases with increase in lipophilicity.

The best model for  $ER_{\beta}$  binding data (radioligand binding assay) shows leave-one-out predicted variance of 76.8% while explained variance of this equation is 79.6%.

$$[pIC_{50}]_{\beta}^{RLB} = -0.629(\pm 0.637)S_1 - 0.057(\pm 0.013)MR + 8.192$$

$$n = 21, \quad R_a^2 = 0.796, \quad R^2 = 0.817,$$

$$R = 0.904, \quad F = 40.1 \text{ (df 2, 18)},$$

$$s = 0.205, \quad AVRES = 0.147,$$

$$Q^2 = 0.768, \quad SDEP = 0.213,$$

$$S_{PRESS} = 0.231, \quad Pres_{av} = 0.169 \quad (2)$$

From the descriptors appearing in Eq. 2,  $C_1$  and molar refractivity (MR) of the compounds are found important for  $ER_{\beta}$  binding. However, the coefficient of  $S_1$  is found to be negative as opposed to the positive coefficient of  $S_1$  in Eq. 1. This indicates that the  $ER_{\beta}$  binding increases as the E-state value of  $C_1$  decreases. Again, the negative coefficient of MR indicates that molecular size has a negative contribution to the  $ER_{\beta}$  binding.

While modeling  $ER_{\alpha}/ER_{\beta}$  selectivity, 69.5% leave-one-out predicted variance and 73.9% explained variance were obtained and  $C_1$ ,  $C_{15}$  and molar refractivity were found to be significant contributors.

$$[pIC_{50}]_{\alpha/\beta}^{RLB} = 1.351(\pm 0.662)S_1 - 0.187(\pm 0.141)S_{15} + 0.048(\pm 0.013)MR - 4.898$$

$$n = 21, \quad R_a^2 = 0.739, \quad R^2 = 0.778,$$

$$R = 0.882, \quad F = 19.8 \text{ (df 3, 17)},$$

$$s = 0.189, \quad AVRES = 0.139,$$

$$Q^2 = 0.695, \quad SDEP = 0.199,$$

$$S_{PRESS} = 0.221, \quad Pres_{av} = 0.168 \quad (3)$$

The coefficients of different terms in Eq. 3 suggest that the  $ER_{\alpha}/ER_{\beta}$  selectivity increases as the E-state value of  $C_1$  increases (largely influenced by  $R_2$  substituents) and E-state value of  $C_{15}$  (largely influenced by  $R_1$  substituents) and molecular size decrease. The value of  $S_1$  decreases when H at  $R_2$  position is substituted with methyl group while the value of  $S_{15}$  decreases in presence of a  $p$ -substituent at  $R_1$  position, especially when the  $p$ -substituent is an electronegative atom like F or Cl.

The data obtained from cellular transcription assay (estrogen response element assay) were also modeled. In case of  $ER_{\alpha}$ , the best equation involving E-state values of  $C_1$  and  $C_{14}$  and  $\log P$  explained 62.1% of the variance (LOO predicted variance 56.8%) while the best equation for  $ER_{\beta}$  involving E-state values of  $C_1$  and  $C_{15}$  and MR explained 64.6% of the variance (LOO predicted variance 52.6%) of the response variable.

$$[pIC_{50}]_{\alpha}^{ERE} = -2.281(\pm 0.988)S_1 + 0.209(\pm 0.208)S_{14} - 0.527(\pm 0.238) \times \log P + 4.698$$

$$n = 21, \quad R_a^2 = 0.621, \quad R^2 = 0.678,$$

$$R = 0.824, \quad F = 11.9 \text{ (df 3, 17)},$$

$$s = 0.268, \quad AVRES = 0.184,$$

$$Q^2 = 0.568, \quad SDEP = 0.280,$$

$$S_{PRESS} = 0.311, \quad Pres_{av} = 0.220 \quad (4)$$

$$[pIC_{50}]_{\beta}^{ERE} = -2.058(\pm 1.347)S_1 + 0.254(\pm 0.285)S_{15} - 0.079(\pm 0.027)MR + 10.529$$

$$n = 21, \quad R_a^2 = 0.646, \quad R^2 = 0.699,$$

$$R = 0.836, \quad F = 13.2 \text{ (df 3, 17)},$$

$$s = 0.384, \quad AVRES = 0.286,$$

$$Q^2 = 0.526, \quad SDEP = 0.434,$$

$$S_{PRESS} = 0.482, \quad Pres_{av} = 0.360 \quad (5)$$

In case of  $ER_{\alpha}/ER_{\beta}$  selectivity, the best equation involving E-state values of  $O_8$ ,  $C_{14}$  and  $N_{27}$  showed 48.3% explained variance (equation not shown), which increased to 63.5% (predicted variance 49.4%) on deletion of single compound (19).

$$[pIC_{50}]_{\alpha/\beta}^{ERE} = 8.462(\pm 3.193)S_8 + 0.282(\pm 0.215)S_{14} - 8.424(\pm 7.647)S_{27} - 63.014$$

$$n = 20, \quad R_a^2 = 0.635, \quad R^2 = 0.693,$$

$$R = 0.832, \quad F = 12.0 \text{ (df 3, 16)},$$

$$s = 0.301, \quad AVRES = 0.231,$$

$$Q^2 = 0.494, \quad SDEP = 0.346,$$

$$S_{PRESS} = 0.387, \quad Pres_{av} = 0.291 \quad (6)$$

Eq. 6 shows that  $ER_{\alpha}/ER_{\beta}$  selectivity increases as the E-state values of  $O_8$  and  $C_{14}$  increase and that for  $N_{27}$  decreases. The value of  $S_{14}$  decreases in presence of  $m$ -substituent at  $R_1$  position, especially involving electronegative atoms like F, Cl or O. Though Eq. 6 is statistically not highly interesting, it indicates the importance of 6-hydroxy group on the tetrahydroisoquinoline nucleus, tertiary nitrogen in the side chain and electron density distribution of the 2-phenyl ring of the tetrahydroisoquinoline nucleus (influenced by nature of  $R_1$  substituents) for the  $ER_{\alpha}/ER_{\beta}$  selectivity.

The calculated activity values according to Eqs. 1–6 are given in Table 1. The intercorrelation ( $|r|$ ) matrix among the predictor variables are given in Table 2.

It is to be noted here that disparity is found between the results of radioligand binding assay and estrogen response element assay (e.g., vide sign of the coefficients of  $S_1$  in Eqs. 1 and 4), which may be due to influences of physicochemical parameters on cellular permeability



**Table 2.** Intercorrelation ( $|r|$ ) matrix

	$S_1$	$S_8$	$S_{14}$	$S_{15}$	$S_{27}$	$\log P$	MR
$S_1$	1.000	0.502	0.484	0.374	0.241	0.187	0.286
$S_8$		1.000	0.022	0.137	0.383	0.811	0.953
$S_{14}$			1.000	0.102	0.453	0.266	0.096
$S_{15}$				1.000	0.372	0.070	0.200
$S_{27}$					1.000	0.497	0.514
$\log P$						1.000	0.884
MR							1.000

and intracellular concentration.<sup>16</sup> Furthermore, conformational difference of ligand receptor complexes might influence the nature of interactions with transcriptional machinery.<sup>16</sup> However, the results of the cellular assay are believed to be more relevant in the physiological situation.

From the analysis it appears that the nitrogen atom of the aminoethoxyphenyl substituent and 6-hydroxy substituent of the tetrahydroisoquinoline nucleus play important roles for ER $\alpha$ /ER $\beta$  selectivity in addition to R<sub>1</sub> and R<sub>2</sub> substituents. However, more data points covering wider substitutional features and more detailed analysis would be required to get further insight into the structure–activity relations and reach a final conclusion.

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