QSAR de alguns inibidores peptídicos da enzima HIV-1 protease utilizando "a priori" descritores moleculares e molecular graphics

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$1 \times \mathrm{m}$




x


Figure 1a)



34


35


38


Figure 1 b)


43


44


45


46



49




53



Figure 1 c)

Figure 1. The HIV-1 inhibitors under the study. The substituents P1, P1', P2, P2' coloured differently, in the way treated in this work.

## INTRODUCTION

QSAR is an attempt to find a mathematical bridge between a measurable (macroscopic) property of the compounds in biological experiment (biological activity) and their microscopic properties (molecular descriptors).
Questions that arise in this area:
-What molecular descriptors to estimate/calculate, which QSAR methodology to use? -What softwares to use, sophisticated or simple, free, cheap of expensive?
-How to interpret the result: just showing the quality of the best models, or go into chemistry of the subject, trying to understand the meaning of the results including the meaning of our molecular descriptors?

The main battle is about the black box principle: to accept or not. The second main one is about the quality or quantity to choose: making many QSARs under the black box principle, or performing less QSARs but to understand their full chemistry.

In this work we use a priori approach [1], a QSAR methodology where only a priori variables ("known before" any sophisticated, computer-assisted calculation) are employed (by hand- or pocket-calculator count/calculation using only 1D and 2D chemical formula). A work on COMBINE (COMparative BINding Energy)-QSAR study on HIV-1 protease inhibitors [2-4] was chosen as a sophisticated QSAR methodology, to demonstrate the reliability and usefulness of our approach on 49 peptide-based hydroxyethylene isostere inhibitors with maximum of four ( $\mathbf{P}_{\mathbf{1}}, \mathbf{P}_{\mathbf{1}}, \mathbf{\mathbf { P } _ { 2 }}$, $\mathbf{P}_{2}{ }^{\boldsymbol{}}$ ) substituents (Figure 1) Our results of PCA and HCA (Hierarchical Cluster Analysis) analysis [5,6] and the PLS (Partial Least Squares) prediction [5,6], with the aid of molecular graphics, are discussed in terms both of the a priori approach and of the HIV-1 protease inhibitor modeling and are compared to the literature results. The a priori approach presented here can be considered as a helpful tool for interpretation of QSARs in terms of basic chemical concepts (molecular size and shape, chemical bonds, atomic properties, electron distribution, hydrogen bonds, effective surface of substituents expressing substituent size, shape, flexibility and polarity responsible for enzyme-substrate interaction, etc.) and as an initial model which can be enriched with various computer-generated descriptors.

## METHODOLOGY

STEP 1.
The estimation/calculation\&variable selection of the a priori molecular descriptors (Tables 1, 2).

STEP 2.
HCA and PCA study of the data.
STEP 3.
PLS prediction of biological activity, $Z_{1}$ (total interaction energy) and $Z_{2}$ (electrostatic contribution to the free energy of solvation).

STEP 4.
Molecular graphics on the active site of the protease-inhibitor 34 complex.

STEP 1 was based on 2D chemical formula, hand-made chemical schemes and graphs, chemical knowledge and some literature data (cited in Table 1), with a pocket calculator assistance.

STEPs 2 and 3 were performed employing chemometrics softwares Pirouette 3.01 [7] and Matlab 5.4 [8].

STEP 4 utilized molecular graphics softwares Insight II [9] and WebLab Viewer [10] and quantum-chemical MOPAC 6.0 [11] on coordinates of inhibitor 34 [12] and its complex with the HIV-1 protease [13].

## RESULTS\&DISCUSSION I

## The biological activity distribution (Table2):

- the molecules are grouped into three groups: a) 5.158-6.246 (molecules 10, 21, 33, 35, 38, 43, 44, 47, 48), 6.640-8.268 (molecules 2, 12, 14, 18-20, 22-25, 28-30, 32, 40, 42, 45) a 8.886-10.267 (molecules 1, 3-9, 11, 13, 15-17, 26, 27, 31, 34, 36, 37, 39, 41)
- these group can be characterized as slightly active, moderately active, and highly active inhibitors (groups I, II and III, respectively)


## Hierarchical Cluster Analysis:

The dendogram on variables (Figure 2a):

- consists of a big cluster(sub-clusters H1-H3) and a small one (H4)
- the two clusters are distinctive due to the internal structure of the data (behavior around $Y$ vs. $X_{i}$ regression line) and the nature of molecular descriptors (H4: molecular size, shape, interactions with no specific direction in space - like hydrophobic; H3: electronic properties like charge distribution and polarity; H2: concepts like molecular size, topology, steric properties, conformational properties; H1: fine details of electronic distribution, especially the role of non- $\sigma$ electrons involed in aromaticity and heteroaromaticity)

The dendogram on samples (Figure 2b):
-the samples are gropped into two clusters with respect to increase of activity and molecular size: a small cluster is G1 (16 samples: 10, 12, 18-20, 22, 25, 29, 30, 33, 35, 43-45, 47, 48), and a big cluster consisting of three sub-clusters G2 ( 15 molecules: 1 , 2, 5, 7, 14, 17, 21, 23, 24, 26, 28, 32, 36, 38, 46), G3 (9 molecules: 3, 8, 9, 11, 15, 16, 27, 31, 37) and G4 (8 molecules: 4, 6, 13, 34-39, 40, 41, 42)
-the clusters are characterized by distinguished biological activities and structural properties: G1 - small and the smallest and other small molecules with low and moderately high activity; G2 - moderately active molecules; G3 - highly active molecules; G4 - the biggest and other big molecules, mainly highly active

## RESULTS\&DISCUSSION II

Principal Component Analysis (Fig. 3):

| PC's | PC1 | PC2 | PC3 |
| :---: | :---: | :---: | :---: |
| \% Variance | 56.49 | 21.86 | 7.58 |
| Cum. variance | 56.49 | 78.21 | $\underline{85.79}$ |
| $X_{1}$ or $M_{r}$ | 0.269 | 0.325 | 0.234 |
| $\mathrm{X}_{2}$ | 0.331 | -0.141 | -0.086 |
| $\boldsymbol{X}_{3}$ | 0.316 | -0.163 | -0.260 |
| $\boldsymbol{X}_{4}$ | 0.216 | 0.405 | 0.141 |
| $\boldsymbol{X}_{5}$ | 0.224 | -0.295 | 0.244 |
| $\boldsymbol{X}_{6}$ | 0.215 | -0.427 | -0.163 |
| $\boldsymbol{X}_{7}$ | 0.247 | 0.352 | -0.131 |
| $\boldsymbol{X}_{8}$ | 0.263 | 0.346 | -0.192 |
| $\boldsymbol{X}_{9}$ | 0.292 | -0.112 | -0.102 |
| $X_{10}$ | 0.212 | -0.255 | 0.397 |
| $X_{11}$ | 0.285 | 0.208 | -0.130 |
| $X_{12}$ or $V_{\text {pol }}$ | 0.233 | 0.016 | 0.687 |
| $X_{13}$ | 0.294 | -0.014 | -0.188 |
| $X_{14}$ | 0.306 | -0.224 | -0.136 |

- 3 Principal Components (PC's) enough to describe the inhibitors ( $86 \%$ variance)
- the discriminating role of the PC's: PC1 roughly separates highly active (group III) inhibitors from slightly active ones (group I), while the moderately active are in the middle (group II) as can be observed (Figure 3). The first two PC's confirm the trend found in HCA.
-the chemical background of the PC's: PC1 - meaning biological activity (expressed in terms of molecular size and contents of various types of valence electrons); PC2meaning the stereochemical goodness of fit with respect to enzyme (a stereochemical description of the inhibitors); PC3 - meaning the fine (valence electron) distribution of electron density (polar/apolar or hydrophobic/hydrophilic description of the inhibitors)


## RESULTS\&DISCUSSION III

## PLS regression models:

A - Predicting the biological activity:

- PLS results for models I and II (Table 3) use 32 and 48 inhibitors in the training set -the both models are comparable with those of Pérez et al. [14]; the model we propose is a priori model I
- a priori model I is comparable with other literature models:
-the OPTIMOL-MM2X model $[2]\left(r^{2}=0.78, q^{2}=0.76\right.$, SDEP $_{\text {cv }}=0.68$, SDEP $_{\mathrm{ex}}=1.18$; our equivalent a priori model I including 49 molecule is $r^{2}=0.90, q^{2}=0.81, \operatorname{SDEP}_{\mathrm{cv}}=0.63$, SDEP $_{\mathrm{ex}}=1.68$ )
- two commercial QSAR softwares of SciVision company: SCIQSAR3.0 [14] (30/8 samples in the training/external validation set, and 5 descriptors in the best model, $r^{2}=0.87$, SDEP $_{\mathrm{cv}}=0.50$, no other data available) and QSARIS [15] (the best model: $33 / 15$ molecules in the training/validation set, two descriptors $\left(r^{2}=0.65, q^{2}=0.57\right.$, $\operatorname{SDEP}_{\mathrm{cv}}=0.86$, SDEP $_{\mathrm{ex}}=1.49$ ), both softwares based on Multiple Linear Regression (MLR)
- a MLR model by Hansch et al. [16] (three molecular descriptors, 30 molecules in the training set, $r^{2}=0.82, q^{2}=0.76, \operatorname{SDEP}_{\mathrm{cv}}=0.69$, ratios of regression coefficients and their errors range in 1.3-1.7, other data not available; our equivalent a priori model I is $r^{2}=0.90, q^{2}=0.80$, SDEP $_{\mathrm{cv}}=0.67$ )
- the prediction of the five clinically approved HIV-1 protease inhibitors $\mathbf{3 9}$, 50-53 (Table 4): there are no observed activity data for inhibitors $\mathbf{5 0 - 5 3}$ measured at the same conditions as for $1-49$, and so (the experimental values in Table 3 refer to averaged and normalized data). The predicted values of their activities refer to the group III of highly active inhibitors (with the exception of 52). Underprediction of amprenavir 52 (relatively small inhibitor) by more than one, overprediction of indinavir 50 and ritonavir 51 by 1-2 orders of magnitude in $\mathrm{IC}_{50}$ units, can be considered fairly good


## RESULTS\&DISCUSSION IV

PLS regression models (Tabs. 3, 4):
$B-$ Predicting the energies $Z_{1}$ and $Z_{2}$ :
$-Z_{1}$ is well correlated with $X_{4}, X_{7}-X_{9}$ and $X_{11}$ ( 48 molecules, 14 variables)

- 3 PC's are enough to describe $Z_{1}$, the same as is on biological activity
- PLS model for $Z_{1}, 3$ PC's, is quite satisfactory ( $\mathbf{3 2} / 16$ molecules in the training/external validation set, 14 variables, $q^{2}=0.76, r^{2}=0.88, \operatorname{SDEP}_{\mathrm{cv}}=2.21 \mathrm{kcal} \mathrm{mol}^{-1}$ across the range of $29.90 \mathrm{kcal} \mathrm{mol}^{-1}$ )
- $Z_{2}$ is correlated with extensive variables $X_{2}, X_{3}, X_{10}$ and $X_{13}$ which describe polarity and valence electron distribution,
- PCA with 6 PC's describe $Z_{2}$ (over $\mathbf{9 0 \%}$ of the variance; 48 molecules, 14 variables)
- PLS model for $Z_{2}$ ( $\mathbf{3 2}$ molecules, 14 variables; $\boldsymbol{q}^{2}=0.48, r^{2}=0.72, S^{2} P_{c r}=0.70 \mathrm{kcal}$ $\mathbf{m o l}^{-1}$ across a range of $8.84 \mathrm{kcal} \mathrm{mol}^{-1}$ ) is less quantitative than that for $Z_{1}$, but reveals obvious connection between $Z_{2}$ and our a priori molecular descriptors


## Molecular Graphics (Figs. 5, 6):

Figure 5: Crystal structure of HIV-1 protease complexed with inhibitor 34 in various views. The inhibitor Conolly surface is placed inside the electron density isosurface (yellow chicken cage, $0.01 \AA^{-3}$, from PM3-MOPAC 6.0 [11]). The inhibitor indanyl residues lie in the protease pockets $\mathbf{S}_{\mathbf{2}}, \mathbf{S}_{\mathbf{2}}{ }^{\prime}$, the phenyl groups are in $\mathbf{S}_{\mathbf{1}}, \mathbf{S}_{\mathbf{1}}$ '. Many protease residues penetrate the inhibitor isosurface. The molecular space between the Conolly surface and the specified isodensity surface can be considered as the soft (penetrable) molecular volume. The molecular complementarity in the terms of molecular size, shape and functional groups is obvious.

Figure 6: The 29 active site amino-acids (chains A white, B blue) and 10 water molecules around the inhibitor 34 (yellow) at the cut-off distance $5.5 \AA$ ( $0.1 \AA$ tolerance) with the hydrogen bond (HB) network (green) [1]. The HBs between water, inhibitor and aminoacids contribute to the complex stability: $\mathbf{2}$ HBs between the catalytic water (left top) and carbonyls of the inhibitor, 2 HBs between this water molecule and two Ile50A, Ile50B, 8 HBs between the inhibitor and the enzyme: 2 between the central OH of the inhibitor and Asp25A, Asp25B; 4 between the OH of indanyl rings of the inhibitor and Asp29A, Asp29B, Gly27A, Gly27B; 2 between the amides of the inhibitor and Gly27A, Gly27B.


Figure 2a. The HCA dendogram for the a priori variables $X_{1}-X_{14}$.


Figure 2b. The HCA dendogram for the samples 1-48.


Figure 3. The PCA plots for the samples 1-48, showing the classes I-III.


Figure 4. The PLS plot for the a priori model I.

## CONCLUSION

The biological activity of the peptidic HIV-1 inhibitors under the study:
I - is a three-dimensional phenomena: PC1 - represents biological activity (in terms of molecular size and contents of various types of valence electrons), PC2 stereochemical fit to enzyme (expressed as molecular branching/compactness and conformation phenomena), PC3 - means fine (valence electron) distribution of electron density (polar/apolar, hydrophobic/hydrophilic relationships inside the inhibitor).

II - is clearly distinguished in three groups of the compounds, as low, moderate and high inhibition activity

III - requires the inhibitors to have all the four substituents aromatic and/or rings
IV - can increase: a)-if both little polar and hydrophobic groups are introduced into the basic structure of the set $\mathbf{1 - 3 2}$, or as alternative, b)-if one or more hooks (flexible hydrophobic chains) are attached on substituents so they enter the active site from the same side of the inhibitor, c)-if more than four (up to 10) substituents are used

## The a priori molecular descriptors used in this study:

I - are of various chemical nature, like electronic, steric-geometrical, electronicgeometrical, compositional, hydrophobic and topological descriptors

II - well characterized the studied inhibitors and two regression models to predict the activity are comparable with those from literature

III - described also the energetic variables $Z 1$ and $Z 2$, showing that some intrinsic molecular properties are responsible for the behavior of inhibitors in solution IV - demonstrated how much a priori approach can help in chemistry, research and education at low cost

## Molecular graphics on inhibitor 34 in this work:

I - illustrated the enzyme-inhibitor molecular complementarity
II - showed that important protease\&water-inhibitor interactions occur beyond the classical van der Waals radii

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Table 1. Definition and description of the variables.

| Symbol | Definition and description |
| :---: | :---: |
| Y | in vitro inhibition activity, $\mathrm{pIC}_{50}=-\operatorname{logIC} 50$ |
| $X_{1}$ or $M_{r}$ | relative molecular mass |
| $\mathrm{X}_{2}$ | No. of non- $\sigma$ valence electrons (the count of $\pi$-bonds \& the free electrons) |
| $X_{3}$ | No. of non-hydrogen atoms in planar fragments (in aromatic rings, double bonds) |
| $X_{4}$ | No. of chemical bonds (excluding hydrogens) |
| $X_{5}$ | No. of valence electrons per atom |
| $X_{6}$ | non- $\sigma$ valence electron surface density $X_{2} / S, S$ - van der Waals molecular surface area as a sum of literature surface area increments for atoms and groups |
| $\mathrm{X}_{7}$ | No. of non-hydrogen atoms in ring systems (aromatic and aliphatic) |
| $X_{8}$ | No. of groups $\mathbf{C X}, \mathbf{n}=\mathbf{0 , 1 , 2 , 3}, \mathrm{X}=\mathrm{H}$ or halogen, C from $\mathbf{C}=\mathbf{O}$ excluded |
| $X_{9}$ | effective No. of substituents: a) 4 for molecule where the substituents are in position with respect to the central chain line as in 1 (standard molecule); b) if one or two substituents are missing, it is $3(33,35,44-48)$ or $2(43)$, respectively; c) 3.5 if one of the substituents is smaller ( $\mathbf{1 2}, 18,19,22,25,30,32$ ) or in opposite orientation ( $28,29,36$ ) than in the standard; 3.25 ( 21 and 42) if the substitent is even smaller; $d$ ) 3.5 if one of the substituents is sterically hindered by some little group or atom (by $\mathbf{C H}_{3}$ in 2, 23, 24; by $\mathbf{H}$ in 40), or via bigger group linked to the main chain (with $\mathrm{C}=\mathrm{O}$ in 14 ; with aliphatic ring in 38). |
| $X_{10}$ | No. of potential H-bonds (No. of donors $\mathrm{OH}, \mathrm{NH}, \mathrm{NH}_{2}+$ No. of acceptors $\mathrm{OH}, \mathrm{C}=\mathbf{O},-\mathrm{O}-$ ) |
| $X_{11}$ | effective No. of ring substituents (aromatic and aliphatic) based on the same rules as for $X_{9}$ : a) 3 for molecule 1 , the standard; b) $X_{14}-1$ for most of the molecules (1-11, 13-20, 23-$33,35,36,38,39,44,46-48$ ) as one substituent is a non-ring system; c) 4 when all the substituents are rings ( 34,41 ); c) 3.5 also for some molecules ( $37-\mathrm{a}$ small ring substituent, 40-sterically hindered ring); d) 3 also for some molecules (42-a small non-ring substituent, 45-one substituent missing); e) $\mathbf{2 . 5}$ also for one molecule (21-a non-ring and a small ring substituent present in the structure); f) $\mathbf{2}$ also for some molecules ( $\mathbf{1 2}$ and 22 -two non-ring substituents present in the structure, 43-only two substituents present and they are rings). |
| $\begin{aligned} & X_{12} \text { or } \\ & V_{\text {pol }} \end{aligned}$ | van der Waals volume of polar groups ( $\mathrm{C}=\mathrm{O},-\mathrm{NH}_{2},-\mathrm{NH},-\mathrm{N}-,-\mathrm{CF}_{3},-\mathrm{S}-,-\mathrm{OH},-\mathrm{O}-,-\mathrm{NO}_{2},-$ I) estimated as van der Waals molecular volume as sum of literature volume increments for atoms and groups |
| $X_{13}$ | the length of the total "aromatic vector": No. of atoms in localized, delocalized and aromatic $\pi$-systems, and No. of atoms with free electron pairs ( $\mathrm{N}, \mathrm{O}, \mathrm{S}$ ), and No. of C atoms in $\mathrm{CH}_{\mathrm{m}}$ groups ( $\mathrm{m}=1,2$ or 3 ) which can participate in hyperconjugation all this is summed as $L_{i}$ for some well defined molecular fragment ( $L_{i}=1$ if atom is alone); since such fragments are separated with aliphatic groups and are supposed to be independent (orthogonal), they can be understood as aromatic vectors whose summation gives ( $\Sigma_{i}$ $\left.L_{i}{ }^{2}\right)^{1 / 2}$ and represents the measure of total (hetero) aromaticity |
| $X_{14}$ | similar to $X_{13}$, the total No. of non- $\sigma$ electrons that can be involved in "aromatic vectors", including: a) $\pi$-electrons of aromatic systems; b) 2 electrons for $\mathrm{C}=\mathrm{C}$ and $\mathrm{C}=\mathrm{O}$ bonds; c) 2 electrons for -N - in aliphatic chains; d) 4 electrons for $-\mathrm{S}-,-\mathrm{O}-,-\mathrm{OH}$; e) eight electrons for $\left.-\mathrm{NO}_{2} ; \mathrm{f}\right) 2$ electrons for $\mathrm{CH}_{\mathrm{m}}(\mathrm{m}=1,2$, or 3 ) |
| $\mathrm{Z}_{1}$ | refined AMBER total interaction energy for HIV-1 protease - inhibitor complexes |
| $\mathrm{Z}_{2}$ | electrostatic contribution to the free energy of solvation of inhibitor |

Table 2. QSAR data for HIV-1 protease inhibitors.

| No. |  | $\boldsymbol{X}_{1}$ | $\boldsymbol{X}_{2}$ | $\boldsymbol{X}_{3}$ | $\boldsymbol{X}_{4}$ | $\boldsymbol{X}_{5}$ | $X_{6} / \AA^{2}$ | $X_{7} / \AA^{\text {3 }}$ | $X_{8} / \AA^{2}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 9.602 | 544.694 | 32 | 30 | 43 | 2.650 | 0.05395 | 21 | 31 |
| 2 | 8.113 | 558.721 | 32 | 30 | 44 | 2.627 | 0.05202 | 21 | 32 |
| 3 | 9.721 | 588.748 | 34 | 30 | 46 | 2.644 | 0.05287 | 21 | 33 |
| 4 | 9.585 | 612.693 | 32 | 31 | 47 | 2.843 | 0.05099 | 21 | 32 |
| 5 | 9.638 | 570.732 | 33 | 32 | 45 | 2.643 | 0.05260 | 21 | 33 |
| 6 | 9.222 | 634.647 | 32 | 30 | 48 | 3.025 | 0.05174 | 21 | 31 |
| 7 | 9.538 | 558.721 | 32 | 31 | 44 | 2.627 | 0.05225 | 21 | 32 |
| 8 | 9.509 | 559.709 | 33 | 31 | 44 | 2.659 | 0.05526 | 21 | 31 |
| 9 | 9.569 | 589.692 | 38 | 33 | 46 | 2.780 | 0.06140 | 21 | 31 |
| 10 | 5.532 | 454.569 | 26 | 23 | 37 | 2.657 | 0.05283 | 15 | 24 |
| 11 | 9.796 | 560.694 | 34 | 31 | 44 | 2.691 | 0.05658 | 21 | 31 |
| 12 | 7.561 | 494.634 | 33 | 26 | 38 | 2.622 | 0.06074 | 15 | 27 |
| 13 | 9.143 | 670.591 | 32 | 30 | 44 | 2.725 | 0.05104 | 21 | 31 |
| 14 | 8.266 | 572.705 | 35 | 32 | 45 | 2.707 | 0.05701 | 21 | 31 |
| 15 | 9.276 | 545.682 | 33 | 30 | 43 | 2.684 | 0.05640 | 21 | 30 |
| 16 | 9.602 | 576.760 | 34 | 30 | 44 | 2.691 | 0.05525 | 21 | 31 |
| 17 | 9.770 | 600.802 | 32 | 31 | 47 | 2.565 | 0.04735 | 21 | 35 |
| 18 | 6.943 | 502.657 | 30 | 29 | 39 | 2.613 | 0.05309 | 18 | 29 |
| 19 | 8.021 | 494.634 | 27 | 26 | 38 | 2.622 | 0.04923 | 17 | 27 |
| 20 | 7.465 | 528.695 | 30 | 30 | 42 | 2.608 | 0.05143 | 21 | 31 |
| 21 | 6.161 | 546.710 | 32 | 29 | 42 | 2.610 | 0.05203 | 18 | 31 |
| 22 | 6.793 | 512.649 | 29 | 26 | 38 | 2.623 | 0.05023 | 12 | 26 |
| 23 | 7.179 | 574.721 | 35 | 34 | 46 | 2.667 | 0.05503 | 21 | 32 |
| 24 | 6.673 | 558.721 | 32 | 30 | 44 | 2.627 | 0.05202 | 21 | 32 |
| 25 | 6.914 | 510.677 | 26 | 22 | 39 | 2.557 | 0.04526 | 18 | 28 |
| 26 | 9.155 | 558.721 | 32 | 30 | 44 | 2.627 | 0.05219 | 22 | 32 |
| 27 | 9.745 | 560.694 | 34 | 30 | 44 | 2.691 | 0.05663 | 22 | 31 |
| 28 | 7.392 | 560.694 | 34 | 30 | 44 | 2.691 | 0.05663 | 22 | 31 |
| 29 | 6.886 | 544.694 | 30 | 30 | 42 | 2.608 | 0.05143 | 21 | 31 |
| 30 | 6.836 | 516.684 | 30 | 29 | 40 | 2.590 | 0.05116 | 18 | 30 |
| 31 | 10.000 | 560.694 | 34 | 30 | 44 | 2.691 | 0.05639 | 21 | 31 |
| 32 | 7.413 | 532.683 | 32 | 29 | 41 | 2.633 | 0.05379 | 18 | 30 |
| 33 | 6.230 | 468.596 | 26 | 23 | 36 | 2.629 | 0.05076 | 17 | 25 |
| 34 | 9.161 | 618.777 | 38 | 38 | 51 | 2.705 | 0.05843 | 30 | 37 |
| 35 | 6.246 | 440.542 | 26 | 23 | 34 | 2.688 | 0.05507 | 15 | 23 |
| 36 | 8.886 | 542.679 | 33 | 32 | 43 | 2.692 | 0.05638 | 21 | 31 |
| 37 | 10.222 | 558.678 | 34 | 30 | 45 | 2.734 | 0.05902 | 26 | 31 |
| 38 | 5.897 | 584.759 | 32 | 30 | 47 | 2.621 | 0.05018 | 27 | 34 |
| 39 | 9.638 | 670.856 | 37 | 32 | 53 | 2.646 | 0.05037 | 26 | 34 |
| 40 | 8.268 | 683.896 | 35 | 28 | 55 | 2.602 | 0.04634 | 31 | 37 |
| 41 | 10.267 | 683.896 | 35 | 28 | 55 | 2.602 | 0.04634 | 31 | 37 |
| 42 | 7.277 | 669.912 | 33 | 29 | 53 | 2.538 | 0.04398 | 26 | 37 |
| 43 | 5.168 | 532.814 | 12 | 8 | 52 | 2.319 | 0.01914 | 20 | 29 |
| 44 | 5.523 | 501.713 | 19 | 15 | 41 | 2.434 | 0.03268 | 16 | 27 |
| 45 | 8.116 | 575.795 | 25 | 23 | 38 | 2.505 | 0.03915 | 25 | 33 |
| 46 | 6.640 | 559.709 | 33 | 30 | 44 | 2.659 | 0.05477 | 21 | 31 |
| 47 | 5.328 | 484.639 | 26 | 22 | 36 | 2.560 | 0.04821 | 12 | 26 |
| 48 | 5.862 | 500.638 | 28 | 22 | 37 | 2.605 | 0.04949 | 12 | 26 |
| 49 | 4.523 | 508.705 | 24 | 22 | 40 | 2.494 | 0.04105 | 18 | 30 |
| 50 | <8.0 | 613.804 | 35 | 30 | 49 | 2.609 | 0.05521 | 27 | 34 |
| 51 | $\approx 8.9$ | 706.943 | 39 | 39 | 53 | 2.711 | 0.05273 | 22 | 28 |
| 52 | $\approx 9.2$ | 491.605 | 30 | 22 | 36 | 2.776 | 0.05626 | 17 | 23 |
| 53 | $\approx 8.7$ | 538.749 | 27 | 22 | 41 | 2.476 | 0.04192 | 22 | 29 |

Table 2. QSAR data for HIV-1 protease inhibitors (continued).

| No. | $X_{9} / \AA^{-2}$ | $X_{10}$ | $X_{11}$ | $X_{12}$ | $X_{13}$ | $X_{14}$ | $\text { Z } \mathrm{Z}_{1} / \mathrm{kcal}$ $\mathrm{mol}^{-1}$ | $Z_{2} /$ kcal $\mathrm{mol}^{-1}$ | $Y_{\text {pred }}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 4.00 | 9 | 3.0 | 73.4 | 16.126 | 48 | -80.56 | -10.13 | 9.280 |
| 2 | 3.50 | 9 | 2.5 | 73.4 | 15.395 | 46 | -76.15 | -9.26 | 7.372 |
| 3 | 4.00 | 11 | 3.0 | 83.8 | 16.155 | 52 | -84.12 | -11.52 | 9.932 |
| 4 | 4.00 | 9 | 3.0 | 89.0 | 16.126 | 48 | -82.76 | -10.56 | 9.128 |
| 5 | 4.00 | 9 | 3.0 | 73.4 | 17.464 | 50 | -82.74 | -11.90 | 9.405 |
| 6 | 4.00 | 9 | 3.0 | 99.4 | 16.126 | 48 | -79.56 | -10.46 | 9.152 |
| 7 | 4.00 | 9 | 3.0 | 73.4 | 16.971 | 50 | -81.92 | -9.98 | 9.417 |
| 8 | 4.00 | 10 | 3.0 | 80.9 | 16.523 | 50 | -81.36 | -12.57 | 9.633 |
| 9 | 4.00 | 11 | 3.0 | 96.9 | 16.703 | 56 | -84.51 | -11.97 | 9.954 |
| 10 | 3.00 | 9 | 2.0 | 73.4 | 14.526 | 40 | -67.78 | -9.37 | 5.971 |
| 11 | 4.00 | 11 | 3.0 | 83.8 | 16.523 | 52 | -81.53 | -11.77 | 9.969 |
| 12 | 3.50 | 9 | 2.0 | 73.4 | 14.832 | 44 | -74.17 | -9.25 | 6.935 |
| 13 | 4.00 | 9 | 3.0 | 109.1 | 16.523 | 48 | -83.14 | -10.37 | 9.387 |
| 14 | 3.50 | 10 | 2.5 | 90.9 | 17.088 | 50 | -81.17 | -10.20 | 7.957 |
| 15 | 4.00 | 9 | 3.0 | 79.6 | 16.126 | 48 | -81.85 | -11.26 | 9.288 |
| 16 | 4.00 | 9 | 3.0 | 90.9 | 16.583 | 52 | -80.40 | -10.34 | 9.430 |
| 17 | 4.00 | 9 | 3.0 | 73.4 | 16.971 | 50 | -85.76 | -10.02 | 9.297 |
| 18 | 3.50 | 7 | 2.5 | 63.0 | 15.395 | 44 | -73.56 | -9.90 | 6.822 |
| 19 | 3.50 | 9 | 2.5 | 73.4 | 13.416 | 44 | -75.20 | -10.03 | 7.373 |
| 20 | 4.00 | 7 | 3.0 | 63.0 | 16.093 | 44 | -77.68 | -9.79 | 8.595 |
| 21 | 3.25 | 9 | 2.5 | 73.4 | 13.454 | 46 | -70.79 | -10.08 | 6.595 |
| 22 | 3.50 | 10 | 2.0 | 90.9 | 13.416 | 42 | -69.82 | -9.39 | 6.984 |
| 23 | 3.50 | 9 | 2.5 | 84.2 | 16.583 | 54 | -75.61 | -10.30 | 7.500 |
| 24 | 3.50 | 9 | 2.5 | 73.4 | 13.454 | 46 | -78.84 | -10.86 | 7.031 |
| 25 | 3.50 | 9 | 2.5 | 73.4 | 11.489 | 40 | -74.83 | -9.14 | 7.085 |
| 26 | 4.00 | 9 | 3.0 | 73.4 | 16.126 | 48 | -81.09 | -11.51 | 9.264 |
| 27 | 4.00 | 10 | 3.0 | 77.1 | 16.126 | 52 | -82.53 | -12.36 | 9.591 |
| 28 | 3.50 | 10 | 2.5 | 77.1 | 16.126 | 52 | -76.09 | -11.32 | 7.895 |
| 29 | 3.50 | 7 | 2.5 | 63.0 | 14.000 | 42 | -76.80 | -9.78 | 6.532 |
| 30 | 3.50 | 7 | 2.5 | 63.0 | 15.362 | 42 | -75.58 | -9.62 | 6.798 |
| 31 | 4.00 | 11 | 3.0 | 83.8 | 16.155 | 52 | -82.20 | -10.95 | 9.966 |
| 32 | 3.50 | 9 | 2.5 | 73.4 | 15.395 | 46 | -74.16 | -10.56 | 7.484 |
| 33 | 3.00 | 9 | 2.0 | 73.4 | 14.900 | 38 | -65.12 | -11.31 | 6.977 |
| 34 | 4.00 | 10 | 4.0 | 76.6 | 19.723 | 60 | -88.28 | -11.66 | 11.160 |
| 35 | 3.00 | 9 | 2.0 | 73.4 | 14.526 | 40 | -61.83 | -10.86 | 6.008 |
| 36 | 3.50 | 9 | 2.5 | 73.4 | 23.452 | 48 | -79.81 | -10.65 | 8.794 |
| 37 | 4.00 | 10 | 3.5 | 77.1 | 16.155 | 52 | -83.26 | -11.86 | 9.948 |
| 38 | 3.50 | 8 | 2.5 | 71.1 | 15.395 | 46 | -66.18 | -11.57 | 7.035 |
| 39 | 4.00 | 10 | 3.0 | 112.6 | 19.494 | 52 | -86.00 | -16.79 | 9.863 |
| 40 | 3.50 | 9 | 3.5 | 91.3 | 19.105 | 50 | -81.48 | -13.08 | 9.185 |
| 41 | 4.00 | 9 | 4.0 | 91.3 | 19.105 | 50 | -91.73 | -12.74 | 10.880 |
| 42 | 3.25 | 8 | 3.0 | 87.6 | 19.975 | 42 | -80.34 | -10.59 | 7.816 |
| 43 | 2.00 | 6 | 2.0 | 61.6 | 7.141 | 20 | -73.94 | -5.02 | 1.929 |
| 44 | 3.00 | 7 | 2.0 | 62.4 | 9.539 | 28 | -70.77 | -7.78 | 4.631 |
| 45 | 3.00 | 8 | 3.0 | 72.6 | 14.036 | 38 | -80.71 | -9.40 | 6.811 |
| 46 | 3.00 | 10 | 2.0 | 78.6 | 16.126 | 50 | -72.88 | -13.86 | 6.224 |
| 47 | 3.00 | 7 | 2.0 | 60.9 | 14.491 | 38 | -68.08 | -9.04 | 5.362 |
| 48 | 3.00 | 10 | 2.0 | 73.6 | 11.489 | 40 | -66.90 | -10.99 | 5.733 |
| 49 | 3.50 | 7 | 2.5 | 63.0 | 11.489 | 34 | -72.19 | -8.51 | 6.372 |
| 50 | 4.00 | 9 | 3.0 | 78.2 | 16.852 | 50 | - | - | - |
| 51 | 4.00 | 11 | 3.5 | 127.3 | 20.591 | 62 | - | - | - |
| 52 | 3.50 | 10 | 2.5 | 82.4 | 13.675 | 38 | - | - | - |
| 53 | 3.00 | 13 | 3.0 | 86.6 | 19.672 | 38 | - | - | - |

Table 3. Comparison of a priori with literature models.

| Model* | samples | variables | PCs | $r^{2}$ | $q^{2}$ | SDEP $_{\text {cv }}$ | SDEP $_{\text {ex }}$ |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| C $_{\text {amber }}$ | 32 | 48 | 2 | 0.89 | 0.70 | 0.72 | 0.83 |
| C $_{\text {delphi }}$ | 32 | 47 | 2 | 0.90 | 0.73 | 0.69 | 0.59 |
| C $_{\text {expanded }}$ | 48 | 54 | 2 | 0.91 | 0.81 | 0.66 | - |
| a priori II | 32 | 14 | 3 | 0.91 | 0.85 | 0.51 | 1.12 |
| a priori II | 48 | 14 | 3 | 0.87 | 0.77 | 0.76 | - |

*SDEP $\mathrm{cv}_{\mathrm{cv}}$ - SDEP (standard error of prediction) of cross-validation, SDEP $_{\mathrm{ex}}$ - external SDEP

Table 4. The activities $\left(\mathrm{pIC}_{50}\right)$ for the five clinically approved inhibitors.

| sample | name | $\boldsymbol{Y}_{\text {exp }}$ | $\boldsymbol{Y}_{\text {pred }}$ |
| :---: | :---: | :---: | :---: |
| $\mathbf{3 9}$ | saquinavir | 9.638 | 9.863 |
| 50 | indinavir | 8.0 | 9.370 |
| 51 | ritonavir | 8.9 | 11.159 |
| 52 | amprenavir | 9.2 | 7.741 |
| 53 | nelfinavir | 8.7 | 9.234 |

