

# A Priori Descriptors in QSAR: a Case of Gram-Negative Bacterial Multidrug Resistance to $\beta$ -Lactam Antibiotics

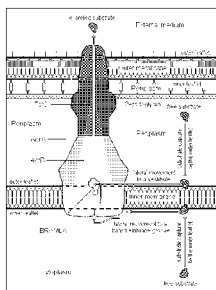
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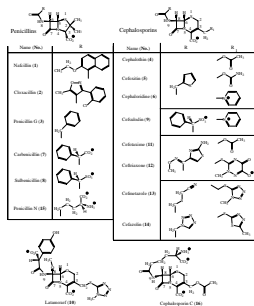
## THE PRIMARY OBJECTIVES OF THIS WORK

- 1) To construct PLS (partial least squares) regression models for 16  $\beta$ -lactam antibiotics as substrates of the pump AcrB (a component of AcrAB-ToIC membrane transporter) that exists in several Gram-negative bacteria), where activities are efflux rates of the compounds excreted from two strains of *S. typhimurium* (HN891 and SH5014);
- 2) To use only *a priori* (not computed) molecular descriptors capable to produce PLS models comparable with those obtained previously from computed molecular descriptors;
- 3) To explain chemical information observed in chemometric and QSAR analyses.

## INTERACTING MOLECULES: AcrAB-ToIC PUMP AND $\beta$ -LACTAMS



AcrAB-ToIC efflux pump. ToIC is docked to AcrB. Only one vestibule is visible in this orientation, while the other two are placed in back side of the AcrB trimer, at the joint lines of the monomers. The arrows show the substrate efflux pathway starting from periplasm and cytoplasm.



Chemical structures of  $\beta$ -lactams at neutral pH, with atomic numbering for penicillins and cephalosporins

## SELECTED A PRIORI MOLECULAR DESCRIPTORS

Molecular descriptors used in exploratory analysis and PLS modeling

No.	Symbol	Definition	Nature*	HN891 <sup>†</sup>	SH5014 <sup>†</sup>
6	N <sub>H</sub>	number of non-H atoms in C-R <sub>1</sub> fragment	CMST/HP	0.647	0.558
35	D <sub>av</sub>	average size of domains counted for D, NaIEd	ST/HP	-0.783	-0.738
39	V <sub>av</sub>	number of valence electrons per atom	EL	0.656	0.676
45	w <sub>DA</sub> *	number fraction of HB donors and acceptors	HB	0.686	0.657
46	Z*	function $\langle R \rangle + \nu(R) - S; \nu(R), \nu(R) - \text{average No. valence electrons in R and R}_1$ , respectively	EL	0.703	0.664
58	L	number of non-H atoms in the shortest path from the R <sub>1</sub> end to the R end	CMST/HP	0.695	0.601
83	W <sub>id</sub>	function $(W_R, W_{R1})^2; W_R = W(N_R)^2; W_{R1} = W(N_{R1})^2$ W, W <sub>1</sub> - first order Wiener index for R, CO-N-C and C-C-R <sub>1</sub> CM <sub>2</sub> fragment	TP	-0.774	-0.713

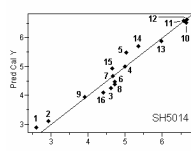
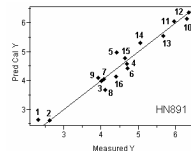
\*Original number as in the complete list with 126 molecular descriptors. †Molecular descriptors that have absolute correlation coefficients greater than 0.600 with one or two pMICs. Molecular descriptors generated previously<sup>2</sup> are marked with \*. Descriptors used in the final PLS models are typed bold. †Simple or composite nature of molecular descriptors: compositional (CM), steric (ST), electronic (EL), topological (TP), hydrogen bonding (HB) and hydrophobic (HP) character. ‡Correlation coefficients with pMICs (HN891) and pMICs (SH5014).

Seven molecular descriptors. Two of them were calculated in previous work (M. M. C. Ferreira, R. Kiralj, J. Chemometr., 18, 2004, 242-252). HN891 and SH5014 are the two strains of *S. typhimurium*.

## A PRIORI QSAR: PLS MODELING

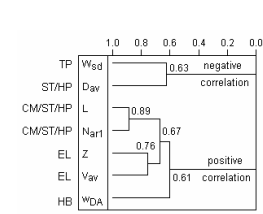
PLS regression models for pMICs

Model	Molecular descriptors <sup>2</sup>	SEV <sup>3</sup>	Q <sup>2</sup>	R <sup>2</sup>	PCs (%)
HN891 this work	N <sub>H</sub> , D <sub>av</sub> , V <sub>av</sub> , w <sub>DA</sub> , Z, L, W <sub>id</sub>	0.461	0.913	0.951	4 (86%)
pMIC =	-0.152 N <sub>H</sub> - 0.687 D <sub>av</sub> + 0.527 V <sub>av</sub> + 0.121 w <sub>DA</sub> - 0.299 Z - 0.237 L - 0.607 W <sub>id</sub>				
previous work	ClogP <sub>OW</sub> , SlogP <sub>OW</sub> , logP <sub>OW</sub> , w <sub>DA</sub> , N <sub>H</sub> , D <sub>av</sub> , D <sub>av</sub>	0.209	0.982	0.993	3 (85%)
pMIC =	0.469 ClogP <sub>OW</sub> - 0.354 SlogP <sub>OW</sub> - 0.460 logP <sub>OW</sub> + 0.001 w <sub>DA</sub> - 0.122 N <sub>H</sub> - 0.275 D <sub>av</sub> - 0.280 N <sub>H</sub>				
SH5014 this work	N <sub>H</sub> , D <sub>av</sub> , V <sub>av</sub> , w <sub>DA</sub> , Z, L, W <sub>id</sub>	0.491	0.906	0.953	4 (87%)
pMIC =	-0.286 N <sub>H</sub> - 0.763 D <sub>av</sub> + 0.809 V <sub>av</sub> + 0.084 w <sub>DA</sub> - 0.347 Z - 0.433 L - 0.621 W <sub>id</sub>				
previous work	ClogP <sub>OW</sub> , SlogP <sub>OW</sub> , logP <sub>OW</sub> , w <sub>DA</sub> , N <sub>H</sub> , D <sub>av</sub> , D <sub>av</sub>	0.316	0.962	0.982	3 (85%)
pMIC =	0.517 ClogP <sub>OW</sub> - 0.393 SlogP <sub>OW</sub> - 0.339 logP <sub>OW</sub> + 0.003 w <sub>DA</sub> - 0.102 N <sub>H</sub> - 0.260 D <sub>av</sub> + 0.195 N <sub>H</sub>				

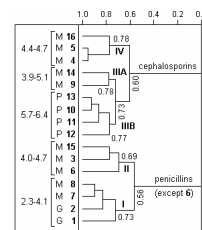


PLS results: predicted against experimental pMICs for strains HN891 and SH5014.

## HIERARCHICAL CLUSTER ANALYSIS

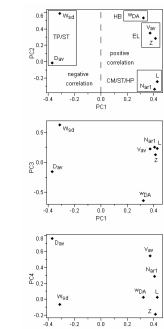


HCA dendrogram with variables for seven selected molecular descriptors that characterize MDR efflux activity of strain HN891. Similarity indices and the sign of descriptor-activity correlation coefficients are marked in the dendrogram. Clustering of the descriptors with respect to their nature can be observed also.

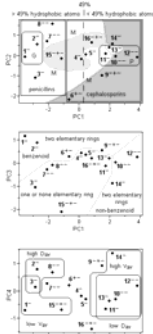


HCA dendrogram with samples for seven selected molecular descriptors that characterize MDR efflux activity of strain HN891. The samples labeled as good (G), moderately good (M) and poor (P) MDR substrates according to the previous chemometric study. The ranges of experimental pMICs for sub-clusters and similarity indices are given also.

## PRINCIPAL COMPONENT ANALYSIS

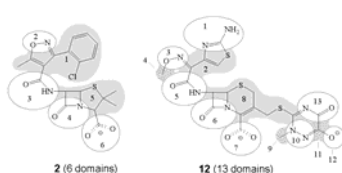


PCA loadings plots with the first four principal component, based on the seven selected molecular descriptors

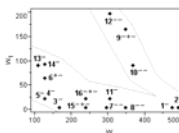


PCA scores plots with the first four principal components. PCA was based on the seven selected molecular descriptors that characterize MDR efflux activity of strain HN891. Samples in PC1-PC2 plot are marked with different ways to distinguish charged species (anion: -, dianion ==, zwitterion +-), anion-zwitterion -+-), samples with different content of hydrophobic atoms (vertical dashed line at 49% content), biological activity classes (G, M, P) and samples with different ring-containing side chains (gray: R and R<sub>1</sub>; gray dots: R<sub>1</sub>; gray vertical lines: no rings; white: R). Various clustering patterns with respect to molecular features may be observed. PCA enables chemical identification of the PCs: 1) PC1 - the general PC -> relationships between molecular hydrophobicity and hydrogen bonding potency, quantitatively related to pMICs; 2) PC2 - hydrogen bonding groups distribution in the side chains; 3) PC3 - hydrophobic groups distribution in the side chains; 4) PC4 - molecular amphiphilicity.

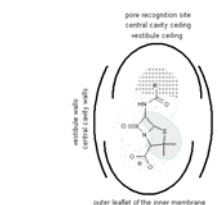
## RESULTING CHEMISTRY



Chemical interpretation of an amphiphilicity descriptor D<sub>av</sub>. Hydrophobic (gray tones) and polar (white ellipses) domains in a good (2) and poor (12) substrates of AcrAB-ToIC bacterial pump.



Chemical interpretation of descriptor W<sub>id</sub> that indicates interaction between side chains R and R<sub>1</sub>. Correlation between the first-order Wiener indices (for R-CO-N-C) and W<sub>id</sub> (for C-C-R<sub>1</sub>CM<sub>2</sub>) included in the definition of W<sub>id</sub> is visible. Two groups of samples can be noticed.



Schematic representation of stereoelectronic penicillin-pump receptor interactions. The drug consists of large hydrophobic domain (gray) and a few polar domains that form almost continuous polar part of the molecule (gray dots). The substituent R in the side chain (starred), depending on its hydrophobic/polar character, may alter molecular properties and interactions with receptors. Bacterial receptors of the inner membrane or AcrB protein prefer to bind to specific parts of the drug molecule.