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IN SILICO MOLECULAR MODELING AND PREDICTION OF ACTIVITY OF OPTIMIZED PROTEIN KINASE INHIBITORS FOR THE TREATMENT OF RHEUMATOID ARTHRITIS

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ABSTRACT

Quantitative structure activity relationship has been performed on a series of thirty compounds of optimized protein kinase inhibitors, using different physicochemical parameters along with appropriate indicator variables. The physicochemical parameters selected for the present series of compounds were used for multiple linear regression analysis (MLRA). Various regression models have been tested and the statitistical data indicate that some of the descriptors provide valuable information to predict activity of these derivatives. The predictive ability of the model was cross-validated by appreciable cross-validated R^2 values (R^2_{cv}) were obtained and was also tested by leave one out (LOO) technique.

KEYWORDS: QSAR, optimized protein kinase, Regression Analysis, MLRA.

INTRODUCTION

Rheumatoid arthritis is a disease that has direct involvement with the immune system. This disease is considered to be degenerative and currently the only thing that can be done is manage the painful symptoms and suppress the self targeting actions by using immune suppressing drugs. The cause of rheumatoid arthritis is mostly unknown but there is a high amount of evidence that there are genetic predispositions for the disease. This being said however there are also environmental factors to asses these include, bacteria, viruses, fungi and other environmental factors. Doctors primarily use a physical examination to first suspect R.A. then send for blood work to confirm. There are many aspects to this disease and many questions left unanswered, the treatments available now are only temporarily and can in some

cases cause more problems than benefits. Lab experiments and clinical trials are currently showing some great results and could within our lifetimes cure many autoimmune diseases including Rheumatoid arthritis.^[1]

Although much is unknown on the causes of R.A. there are many things we see in correlation with the onset of disease. These include Bacterial, viral, and fungal infections. The mycoplasma bacteria, Epstein-Barr virus, cytomegalovirus, parvovirus and rubella (German measles) virus have all been considered as possible causative factors but conclusive evidence is still lacking. Many times there have only been considerations for infectious bacteria causing this disease but now that idea is being questioned. A study involving mice in bacteria free cages showed that the friendly gut dwelling segmented filamentous bacteria (SFB) can cause onset of R.A. Inhibition of protein kinase $C\theta$ (PKC θ) blocks the activation of cells^[2] and thus is hypothesized to ameliorate cell mediated disease states such as rheumatoid arthritis (RA), inflammatory bowel disease (IBD), and psoriasis. Multiple companies have worked to identify suitable chemical matter to inhibit this intriguing target that is predominately expressed in cells.^[3]

Experimental Section

METHODOLOGY

Inhibitory activity as reported by George et al. as IC₅₀ were converted into their log units (log IC₅₀) and used in the present investigation. An attempt has been made to correlate the activity of these compounds with various physicochemical parameters⁵ such as surface tension (St), wiener index (W), mean wiener index (WA), molecular weight (MW) and molecular connectivity and have been used to study the relationship between parameters and properties. St and MW were calculated by ACD Lab Chem. Sketch Software version⁵ 12 whereas W, WA, were evaluated by E-Dragon Software⁵ as given in Table 1.

Table 1: Structural detail and Biological activity for series of Optimized Protein Kinase $C\theta$ (PKC θ) Inhibitors with indicator parameter.

Comp. No.	R1	R2	I_6	I_7	I_8	I ₁₁	I ₁₄	I ₁₇	IC ₅₀
1	rau Z	Н	0	0	0	0	0	0	7.64
2	CF3	Н	0	0	0	0	0	0	7.64
3	CF3	Me	0	0	0	0	0	0	7.23
4	CF3	Н	0	0	0	0	0	0	7.24
5	CF3	Me	0	0	0	0	0	0	6.15
6	Ph	Н	0	0	0	0	0	0	7.28
7	Ph	Me	0	0	0	0	0	0	8.39
8	2-F-Ph	Me	0	0	0	0	0	0	8.39
9	Н	H ₃ C Name CH ₃	0	0	0	0	0	0	8.39
10	F	H ₃ C N N N N N N N N N N N N N N N N N N N	0	0	0	0	0	0	8.39
11	F	H ₃ C N _{thouston} CH ₃	0	0	0	0	0	0	8.52
12	F	H ₃ C N Tri _{tri} CH ₃	0	0	0	0	0	0	7.37
13	F	N CH ₃	0	0	0	0	0	0	7.39
14	F	H ₃ C CH ₃	0	0	0	0	0	0	7.37
15	H ₃ C N CH ₃	H ₃ C CH ₃	1	0	0	0	0	0	7.37
16	H ₃ C N CH ₃	H ₃ C N CH ₃	0	1	0	0	0	0	8.52
17	HN NH₂	H ₃ C N CH ₃	0	0	1	0	0	0	8.39
18	H ₃ C NH ₂ CH ₃	H ₃ C N CH ₃	0	0	0	0	0	0	7.80
19	H ₃ C N CH ₃	H ₃ C N CH ₃	0	0	0	0	0	0	8.52
20	H ₃ C CH ₃	H ₃ C N CH ₃	0	0	0	1	0	0	8.30

21	2-F	H ₃ C N CH ₃	0	0	0	0	0	0	8.52
22	3-F	H ₃ C N CH ₃	0	0	0	0	0	0	7.85
23	4-F	H ₃ C N, CH ₃	0	0	0	0	1	0	7.72
24	2-СН3	H ₃ C N, CH ₃	0	0	0	0	0	0	8.09
25	4-CH3	H ₃ C N CH ₃	0	0	0	0	0	0	7.60
26	3-OCH ₃	H ₃ C N, CH ₃	0	0	0	0	0	1	8.15
27	ОСН3	H ₃ C N CH ₃	0	0	0	0	0	0	8.00
28	3,4-OCH2CH2O-	H ₃ C N CH ₃	0	0	0	0	0	0	8.70
29	2-F-4-CH3	H ₃ C N CH ₃	0	0	0	0	0	0	8.30
30	2-F-4-OCH3	H ₃ C N CH ₃	0	0	0	0	0	0	8.70

Table 2: Physicochemical topological and quantum chemical descriptors for series of derivatives.

Comp. no.	Activity	X ⁰	\mathbf{X}^{1}	\mathbf{X}^2	\mathbf{X}^3	Dipole	JX	MV	PC	Polar	T.E	Lumo
1	7.64	18.68990	12.17830	13.58599	3.58599	.44047	1.73	279.90	747.50	42.39	-1334.40	-0.08090
2	7.23	19.56010	12.61580	13.15650	3.59789	.59220	1.77	248.40	651.60	35.73	-1372.36	-0.16314
3	7.24	19.56010	12.57210	13.48470	3.87467	.47111	1.70	248.40	651.60	35.73	-1372.38	-0.80498
4	6.15	20.43040	13.00970	13.81640	3.88656	.46109	1.75	269.70	697.10	37.84	-1411.30	-0.07900
5	7.28	19.56010	13.48470	13.48470	3.87467	.47111	1.70	328.30	903.10	50.37	-1372.38	09474
6	8.39	24.90500	16.67540	16.08380	3.17104	.47615	1.51	349.50	948.60	52.48	-1550.54	09809
7	8.39	25.77530	17.06920	16.71760	3.45972	1.22001	1.50	352.40	948.70	52.43	-1649.20	06898
8	8.39	21.04320	14.37080	13.90580	2.70543	.86166	1.61	307.40	819.90	45.91	-1305.32	07145
9	8.39	21.91350	14.78150	14.78150	2.91055	.93941	1.63	310.30	820.10	45.85	-1403.97	07044
10	8.52	21.91350	14.78150	14.43330	2.91055	1.53433	1.64	315.60	824.60	46.11	-1387.98	07199
11	7.37	20.12060	14.02490	13.15550	2.10797	1.35530	1.64	279.90	747.50	42.39	-1310.14	69942
12	7.39	20.82770	14.52490	13.49710	2.10797	1.69970	1.62	295.90	786.10	44.22	-1349.12	69927
13	7.37	21.69790	14.93550	14.03650	2.31309	1.66202	1.64	311.10	817.20	45.98	-1388.06	06912
14	7.37	21.69790	14.93550	14.03650	2.31309	1.66942	1.64	311.10	817.20	45.98	-1388.07	06963
15	8.52	21.69790	14.93550	14.03650	2.31309	1.45526	1.64	311.10	817.20	45.98	-1388.06	07121
16	8.39	20.82770	14.52490	13.49710	2.10797	1.74719	1.62	295.90	786.10	44.22	-1360.81	07118
17	7.80	22.40500	15.47360	14.20560	2.22853	1.73172	1.61	327.10	855.80	47.80	-1439.43	07337
18	8.52	21.69790	14.91870	14.14280	3.58599	1.19819	1.63	311.10	817.20	45.98	-1388.07	07216
19	8.30	21.69790	14.91870	14.13090	2.39644	.50177	1.62	311.10	817.20	45.98	-11388.1	07387
20	8.52	21.69790	14.91870	14.14280	2.39664	.74854	1.63	311.10	817.20	45.98	-1388.07	66824
21	7.85	21.69790	14.91870	14.14280	2.39664	1.33326	1.63	323.40	848.10	47.78	-1328.35	06757
22	7.72	21.69790	14.91870	14.14280	2.39664	1.31418	1.63	323.40	848.10	47.78	-1329.35	06676
23	8.09	22.40500	15.45670	14.30000	2.31209	1.29149	1.60	329.90	867.30	48.33	-1403.04	68287
24	7.60	22.40500	15.45670	14.31100	2.31209	1.69521	1.63	329.90	867.30	48.33	-1403.04	68287
25	8.15	22.40500	15.47360	14.22760	2.24405	2.10056	1.64	329.90	867.30	48.33	-1403.02	06447
26	8.00	22.56820	15.32940	14.67030	2.60176	1.03481	1.64	314.00	817.40	45.92	-1486.71	07467
27	8.70	23.98240	16.42220	14.94610	2.38013	2.11305	1.66	351.50	917.50	50.64	-1516.66	07450
28	8.30	26.81080	18.42220	16.41410	2.38013	2.20480	1.63	379.80	1021.10	55.11	-1743.89	06146

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29	8.70	22.56820	15.32840	14.67030	2.60176	.72386	1.64	326.30	848.30	47.73	-1427.02	06873
30	8.70	23.27530	15.86740	14.86130	2.53272	.74377	1.65	324.40	861.50	48.14	-1501.69	06907

RESULTS AND DISCUSSION

QSAR studies were performed on set of 30 compounds of optimized protein kinase inhibitors. The biological activity data of these compounds were correlated with different physio chemical parameter given in Table 2 such as molar volume (Mv), parachor (Pc), polarizibility (polar), and quantum chemical descriptors such as total energy (TE), highest occupied molecular orbital energy (HOMO) and lowest unoccupied molecular orbital energy (LUMO). The monoparametric models cannot be used for modeling the pIC₅₀ because the quality of statistical data is not very good. Biparametric models were also discarded because of poor quality of statistical data. Hence, an attempt has been made to obtain multiparametric models. In order to study the role of different substituents at different positions, indicator parameters I_6 which represent at R_1 position, I_8 which represent at R_1 position and I_7 which represent at R_1 position were introduced. Multiple regression analysis resulted in several significant tri parametric QSAR models. Descriptors were selected for the final equation having inter-correlation coefficient below 0.5 were considered. The stepwise development of equation along with changes in statistical qualities on gradual addition of descriptors was done.

Modeling of pIC₅₀ using empirical parameters

 $PIC_{50} = 3.14(\pm 0.69)Mv - 2.40(\pm 0.046)Pc + 2.94(\pm 0.589)pz - 0.684(\pm 1.369)I_6 + 0.631(\pm 1.262)I_8 - 3.420 \quad n = 30 \quad R = 0.876 \quad , \quad R^2 = 0.601 \quad , \quad R^2A = 0.493 \quad , \quad S.E = 0.47 \quad F = 4.62 \quad Q = 1.864 \quad \quad (1)$

Equation 1 explains only 96.7% variance in the drug activity. It shows that group presented by I_8 contributes positively while indicated by I_6 and parameter parachor (Pc) contributes negatively. It is the best equation, obtained using physiochemical parameter.

Lowest unoccupied molecular orbital energy (LUMO) has also been found to be an effective parameter in modeling of pIC₅₀. For this muti-parametric equation, R^2 comes out to be 0.719. The equation is given below:

$$\begin{split} PIC_{50} &= 1.532(\pm 1.492) \ LUMO + 0.435(\pm 0.714) \ dipole - 474 \ (\pm 0.043) \ Te - 0.981(\pm 1.962) \ I_6 - 0.396(\pm 0.792) \ I_7 - 7.665 \ n = 30, \ R = 0.896, \ R^2 = 0.719 \ , \ R^2A = 0.515 \ , \ S.E = 0.458 \ , \ F = 3.96, \ Q = 1.957...... \ (2) \end{split}$$

Equation 2 explains only 86.7% variance in the drug activity. It shows that lowest unoccupied molecular orbital energy (LUMO) contribute positively. Introducing lowest unoccupied molecular orbital energy (LUMO) parameter in place of molar volume has also been found effective in modeling of pIC₅₀. For this equation, R^2 comes out to be 0.719. The equation is given below:

$$\begin{aligned} \textbf{PIC}_{50} = & 1.046 \ (\pm 1.304) \ X^1 - 0.918 \ (\pm 1.495) \ X^0 + 0.768 \ (\pm 1.486) \ X^2 - 0.370 (\pm 0.0.8) \ I_{11} + \ 0.721 (\pm 1.442) \ I_{14} + 0.730 \ n = & 30, \ R = 0.875, \ R^2 = 0.701 \ , \ R^2 A = & 0.615 \ , \ S.E = 0.398, \ F = 5.93 \ , \ Q = 2.198......(3) \end{aligned}$$

Equation 3 explains only 73.5% variance in the drug activity. It shows that Information unoccupied molecular orbital energy (LUMO) contribute positively.

Equations obtained using parameter in the present analysis (eq.1to3), show that the coefficient of parachor is negative (equations 1) i.e. decrease in the value of this parameter enhances the activity of the drug. The above equations show that the coefficient of LUMO and Mv are positive (equation 1 & 2) and this indicates that bulkier substituent with more branching should be preferred for future modeling. In equation 1 to 3 indicator parameter, I_8 , which represent at I_8 position, has a positive coefficient suggesting that the presence of at I_8 position is favorable for the activity while coefficient of indicator parameter, I_8 , I_8 , I_9 which represent at I_8 position, is negative suggesting that the presence of I_8 at I_8 position is not favorable for the activity.

Out of several QSAR model, model (1) show best result. In order to confirm that the model with excellent statistics has also excellent prediction power too, we have evaluated quality factor Q. The predictive power as determined by the Pogliani Q^7 parameter for the model expressed by eq. (1) [Q = 1.864] confirms that this model has excellent statistics as well as

excellent predictive power. Predicted and residual activity values for model (1) are given in Table 4. Predicted values are the calculated activities obtained from model (1) and the residual values are the difference between the observed biological activities and calculated activities. The cross validation analysis was performed using leave one out (LOO) method^[8] in which one compound is removed from the data set and the activity is correlated using the rest of the data set. The cross-validated R² in each case was found to be very close to the value of R² for the entire data set and hence these models can be termed as statistically significant. Cross validation^[9] provides the values of PRESS, SSY, PSE, R²_{CV} and R²_A from which we can test the predictive power of the proposed model. These statistical parameters can be calculated form following equations:

$$\begin{split} & \text{PRESS} = \sum (X_{\text{obs}} - X_{\text{cal}})^2 \qquad \qquad \text{(i)} \\ & \text{SSY} = \sum (X_{\text{obs}} - X_{\text{mean}})^2 \qquad \qquad \text{(ii)} \\ & \text{PSE} = \sqrt{\text{PRESS/n}} \qquad \qquad \text{(iii)} \\ & \text{R}^2_{\text{cv}} = 1 - \frac{\text{PRESS}}{\text{SSY}} \qquad \qquad \text{(iv)} \\ & \text{R}^2_{\text{A}} = 1 - (r^2) \left(\frac{n-1}{n-p-1} \right) \qquad \qquad \text{(v)} \end{split}$$

It is argued that PRESS, is a good estimate of the real predictive error of the model and if it is smaller than SSY the model predicts better than chance and can be considered statistically significant. Furthermore, the ratio of PRESS/SSY can be used to calculate approximate confidence intervals of prediction of a new compound. To be a reasonable QSAR model PRESS/SSY should be smaller than 0.4. Also, if PRESS value is transformed in a dimension less term by relating it to the initial sum of squares, we obtain R²_{CV} i.e. the complement to the traces on of unexplained variance over the total variance. The PRESS and R²_{CV} have good properties. However, for practical purposes of end users the use of square root of PRESS/n, which is called predictive square error (PSE)¹⁰, is more directly related to the uncertainty of the predictions. The PSE values also support our results. The calculated cross-validated parameters confirm the validity of the models. All the requirements for an ideal model have been fulfilled by model no. 1, that's why, we have considered these models as the best model. R²_A takes into account the adjustment of R². R²_A is a measure of the percentage explained variation in the dependent variable that takes into account the relationship between the number of cases and the number of independent variables in the regression model, whereas R² will always increase when an independent variable is added. R² A will decrease if the added variable does not reduce the unexplained variable enough to offset the loss of decrease of freedom.

Predictive error of coefficient of correlation (PE)

The predictive error of coefficient of correlation (PE) ^{11 - 17} is yet another parameter used to decide the predictive power of the proposed models. We have calculated PE value of all the proposed models and they are reported in Table 4. The plot of observed and predicted activity for the model no. has been shown in the figure 1.

Table 3: Comparison between observed and predicted activities and their residual values for the model 1.

Sr. No.	Observed Activity	Predicted Activity	Residual Activity
1	7.64	7.5952	4.47
2	7.23	6.8526	.3774
3	7.24	6.8526	.3874
4	6.15	7.1158	9658
5	7.28	7.8750	5950
6	8.39	8.1347	.2553
7	8.39	8.2178	.1722
8	8.39	7.8408	.5492
9	8.39	7.9186	.4714
10	8.52	8.0701	.4499
11	7.37	7.5952	2252
12	7.39	7.7587	3687
13	7.37	8.0542	6842
14	7.37	7.5952	6.21
15	8.52	7.5952	.4658
16	8.39	8.3900	-3.5
17	7.80	8.2147	4147
18	8.52	8.0542	.4658
19	7.64	8.0542	.2458
20	8.30	8.0542	.4658
21	8.52	8.2661	4161
22	7.85	8.2661	5461
23	7.72	8.1909	1009
24	8.09	8.1909	5909
25	7.60	8.1909	-4.09
26	8.15	8.1320	1320
27	8.00	8.4103	.2897
28	8.70	8.2128	8.72
29	8.30	8.3468	.3532
30	8.70	8.346	.2458

Table 4: Cross validated parameters and predictive error of coefficient of correlation (PE) for the model 1.

N	R	$1-R^2$	P.E	6PE	PRESS	SSY	PRESS/SSY	R^2_{CV}	PSE
30	0.876	0.399	0.0886	0.5316	.965	5.8	0.166	0.834	0.179

It is argued that if the values R < PE, then such correlation is not significant; however if values are R > PE in several times (at least three times), then values are correlated. However, if values are R > 6PE, then mathematically the correlation is unquestionably good. For all the models developed the condition R > 6PE is satisfied and hence they can be said to have a good predictive power.

CONCLUSIONS

The current study was performed to examine the applicability of the empirical and DFT-based descriptors in QSAR analysis for studying the biological activity of a series of optimized protein kinase derivatives which are known as potent non-steroidal anti-inflammatory and analgesic agents. The obtained QSAR results based on empirical parameter such as molar volume, parachor, polarizibility with highest statistical quality R^2 (0.601) demonstrate that molecule with more branching, bulkier substituent and having low value of parachor(Pc) should be preferred for future modeling. With reference of indicator parameter the presence of at R_1 position is favorable for the activity and the presence of R_1 at R_2 position is not favorable for the activity of optimized protein kinase derivatives towards drug activity.

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