

Research Article

Virtual Screening and its Experimental Validation Reveal Novel Compounds with Promising Anticancer Activity Among 4-Thiazolidinone- Pyrazoline- and Isatin-Based Conjugates

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Abstract

In silico screening of virtual 4-thiazolidinones library has been carried out with several self-developed QSAR and pharmacophore models of anticancer activity. Such approach has allowed us to choose 14 the most probable anticancer hits - conjugates of 4-thiazolidinone, pyrazoline and isatin, which in turn have been synthesized. Half of these compounds were subjected to anticancer activity evaluation and biological experiments confirmed our predictions, although in a qualitative manner. The most sensitive to tested compounds cancer cell line is Mino (the lowest IC₅₀ reached 0.17 μM), which represents mantle cell lymphoma – a rare but very aggressive tumor. That identifies the further direction of biological studies of the novel anticancer hit compounds.

Keywords: 4-thiazolidinones; Virtual screening; Pharmacophore; Anticancer activity

Introduction

The identification of novel biologically active compounds among 4-thiazolidinone derivatives is a successful trend since molecules with this scaffold demonstrate high affinity for various biotargets. The most popular 4-thiazolidinones activities cover anti-inflammatory [1]; antibacterial, antifungal and antitubercular [2]; antiviral (anti-HIV predominantly [3]); antidiabetic [4] and anticancer [5,6] activity. The last topic has been granted with strong interest over the last few years [7-18]. Antitumor mechanisms of 4-thiazolidinones can be associated with their affinity for tumor necrosis factor TNFα [19], anti-apoptotic biocomplex Bcl-XL-BH3 [20], JNK-stimulating phosphatase-1 (JSP-1) [21], integrin α₃β₃ receptor [22], non membrane protein tyrosine phosphatase (SHP-2) [23], inhibition of necroptosis [24], etc. Several structure-anticancer activity studies of 4-thiazolidinones were carried out and resulted in predictive QSAR models [25]. The purpose of these models is to perform virtual screening and thus to raise hits ratio in the search for new anticancer agents significantly. Continuing our efforts in the search of new 4-thiazolidinones with antitumor properties, we are reporting the application of the mathematical models to the virtual database of new 4-thiazolidinone derivatives and purposeful synthesis based on virtual screening results. In order to confirm the prognosis, the synthesized compounds were evaluated for anticancer activity *in vitro*.

Materials and Methods

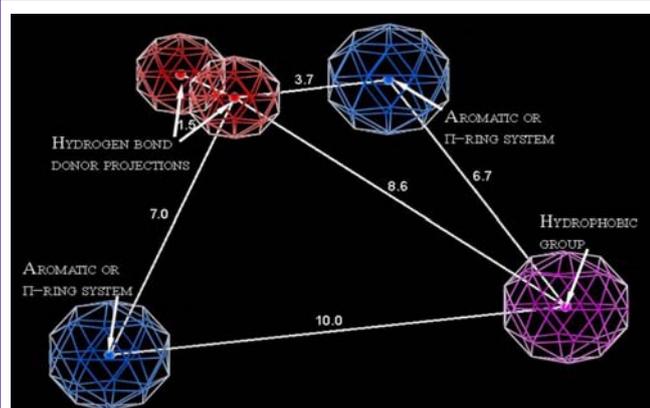
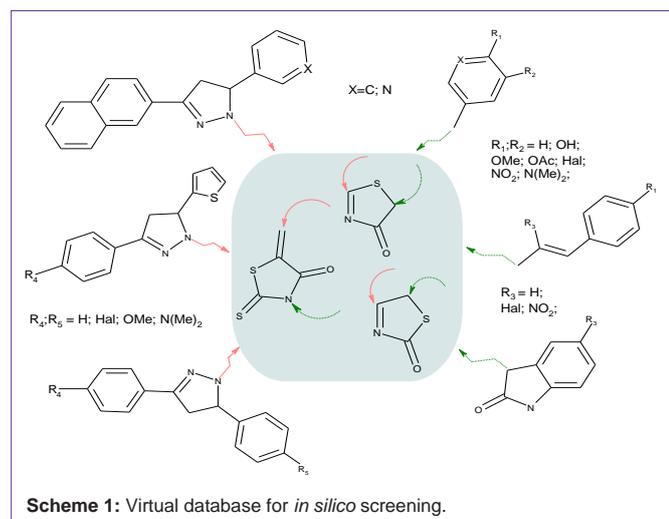
Virtual database

Varying the substituents in 2,4 and 5 positions of 4(2)-thiazolidinone, the library of 690 compounds has been created (Scheme 1). The choice of substituents has been based on previously identified priorities and structure-activity relationships [4,5,7,26-28].

Predictive models

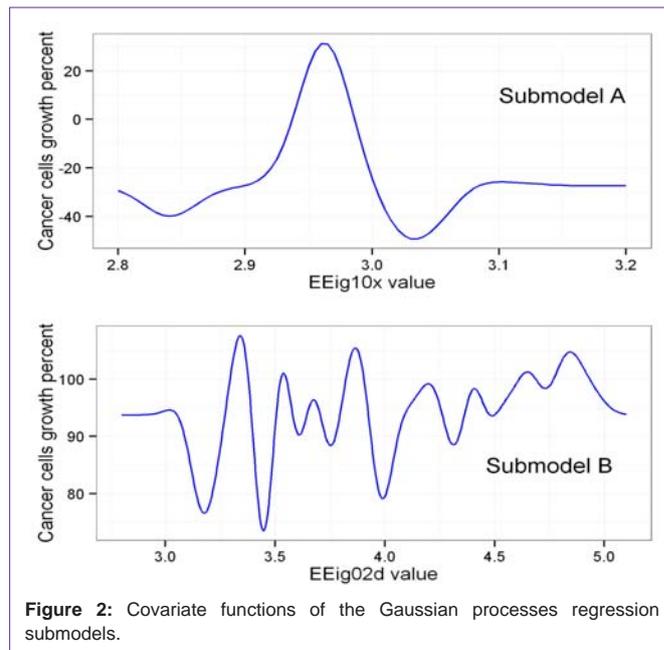
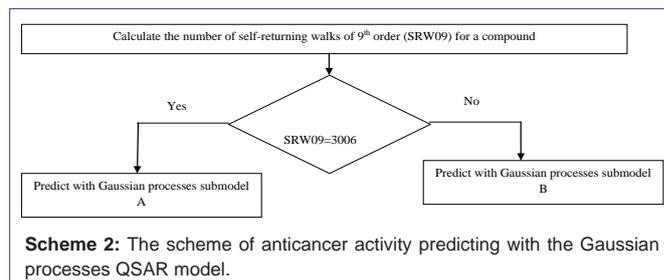
To perform virtual screening three previously developed models have been utilized. The in home library which has been used to derive these models contained about 700 compounds which were synthesized and checked for anticancer activity *in vitro* under the Developmental Therapeutics Program of National Cancer Institute (USA) [29,30]. The dependent variable in all models was presented with the tumor cells growth percent or activity class based on this indicator.

The first model used in screening is pharmacophore model, which has been developed combining clustering of 4-thiazolidinone derivatives into different activity mechanisms and making subsequent pharmacophore search [31]. The pharmacophore (Figure 1) consists of two aromatic or π-ring system centers, the hydrophobic group and the two projections of the hydrogen bond donors (electron pair acceptors). Using presented in the paper confusion matrix, the statistical parameters of model were obtained. The error rate of this model is 0.8% with accuracy = 87.5% and precision = 99.5%. In order to conduct virtual screening, the conformational search of virtual database has been carried out and then each conformer was aligned with the pharmacophore. The conformers were obtained using systematic bonds rotations (with 30° step) and further energy



minimization with the aim to select only energetically favorable geometries. Conformers which have energy more than 7kcal/mol above the minimum for a given compound were treated as energetically unfavorable and were removed from the database.

The second is Random Forest classification model, reported by Zimenkovsky et al. [32]. The model incorporates the ensemble of 100 decision trees and is capable to recognize compounds into “active” or “non-active” classes. The decision is based on a vast number of molecular descriptors, all of which can be obtained through E-DRAGON online service [33] (the model’s input is molecular descriptor matrix). The error rate of Random Forest model has been estimated at 2.08%, with sensitivity = 56% and specificity = 99.64%. These values indicate that the model can miss up to 50% of active compounds (making false negative error), but true positive error is highly unlikely. So a compound which is predicted to be active by this model has strong chances to show anticancer activity *in vitro*. To check whether predicted compounds fall into applicability domain of Random Forest model, the distance to model has been evaluated for each compound [34,35]. The threshold distance value, above which the compound is recognized as outlier, was found using analysis of the distribution of training compounds distances. This empirical distribution was fitted with lognormal distribution model. The threshold distance was presented with the 0.999 quantile of fitted



lognormal distribution.

The third model is the Gaussian processes QSAR model disclosed in Devinyak et al. [25]. The model acts as follows (Scheme 2).

The prespecified SRW09 value of 3006 represents the structurally similar group of compounds, the majority of which have shown high levels of antitumor activity. In such a way submodel A primarily indicates less active compounds among those having SRW09=3006, while submodel B tries to define few remaining active compounds in the dataset. Submodels A and B are based on the eigenvalue molecular descriptors EEig10x (Eigenvalue 10 from edge adjacency matrix weighted by edge degrees) descriptor and EEig02d (Eigenvalue 02 from edge adjacency matrix weighted by dipole moments) respectively and are presented with corresponding covariate functions (Figure 2). Though the statistical parameters of overall model are moderate ($R^2=0.656$, $R^2_{ext}=0.602$), it predicts the anticancer activity in a quantitative manner, returning cancer cells growth percent. The verification of falling into applicability domain has been carried out with quantile-quantile plot, using chi-squared distribution as a theoretical and Mahalanobis distance distribution as an observed component [36].

Biological experiments

C6 cells were kindly provided by Dr. V. Baklaushev (State Research Center of Forensic and Social Psychiatry, Moscow, Russian Federation), Mino cell line by Dr. V. Ribrag (Department of

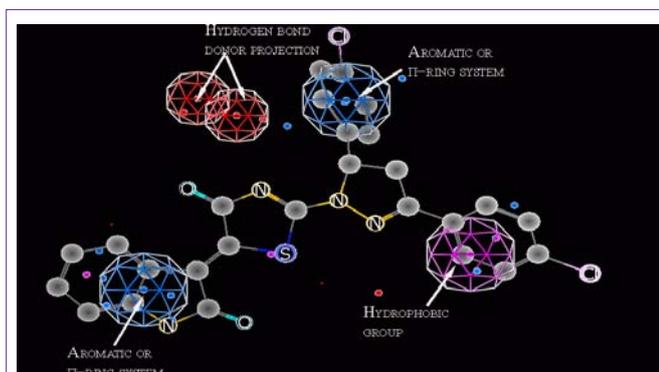
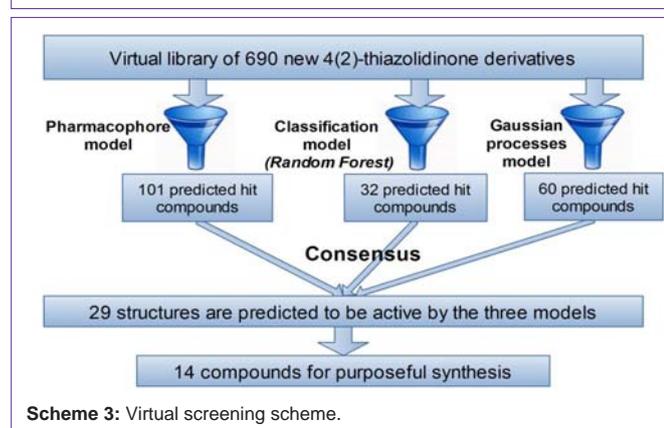


Figure 3: Alignment of compound 1 with pharmacophore model.



Scheme 3: Virtual screening scheme.

Medicine, Institute Gustave Roussy, Villejuif, France). C6 and L1210 cells were grown in DMEM (Hyclone, USA), Mino and Jurkat cells in RPMI (Gibco, USA). All culture mediums were supplemented with FBS at 10%, penicillin at 100 units/ml, and streptomycin at 100 μ g/ml final concentration. Cells were cultivated in the environment of 95% air/5% CO₂. C6 and Mino cells were seeded in triplicates (Jurkat and L1210 – in duplicates) into 96-well plate at density 3×10^3 cells/ well. Compounds were applied at final concentration 0.01, 0.1, 1, 10, and 100 μ M, which were reached by serial dilution. 3-(4,5-Dimethylthiazol-2-yl)-2,5-diphenyl-tetrazolium bromide (MTT) (Sigma), which is converted to dark blue, water insoluble MTT formazan by mitochondrial dehydrogenases, was used to determine viable cells according to manufacturer's protocol (Sigma). Dose-response curves have been fitted with 4-parameter log-logistic function in R [37,38]. IC₅₀ have been determined using fitted models.

Results and Discussion

The conformational search of virtual database results in a 12787 energetically favorable conformers. Each conformer has been aligned with the pharmacophore and these way 101 compounds have passed the screening. It is interesting, that among those structures which have good alignment with pharmacophore model, 92 are conjugates of 4-thiazolidinone, pyrazoline and isatin. In these structures nitrogen and oxygen atoms of 4-thiazolidinone core provide necessary hydrogen bond donor projections, while isatin and diarylpyrazoline fragments act as aromatic and hydrophobic constituents (Figure 3).

Random Forest model predicted as active 32 compounds from virtual library. Analysis of distances to model have showed that all compounds predicted as active fall into applicability domain, while

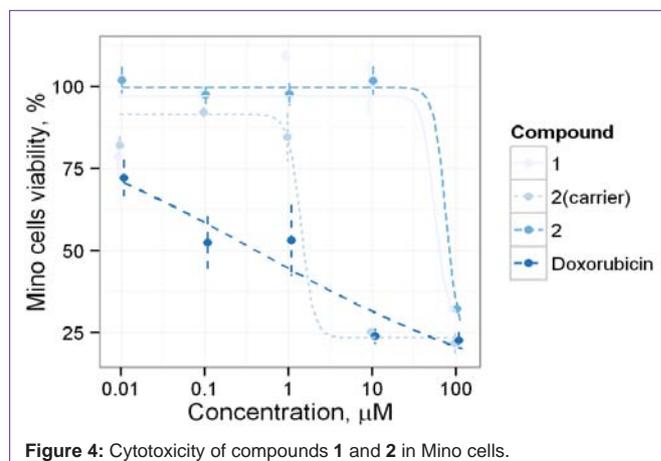
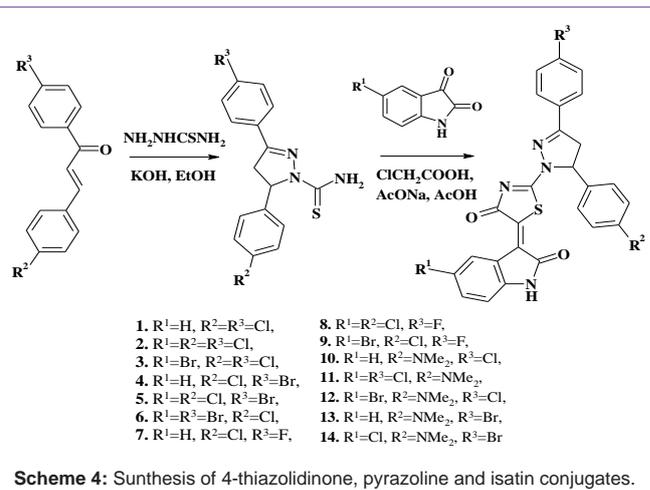


Figure 4: Cytotoxicity of compounds 1 and 2 in Mino cells.



Scheme 4: Synthesis of 4-thiazolidinone, pyrazoline and isatin conjugates.

there are 47 out-of-domain compounds among those predicted as inactive. Gaussian processes model predicted cytotoxic effect on tumor cells (GP<0) for 60 structures. All compounds from virtual library were located inside the applicability domain. The choice of virtual screening hits has been based on the consensus between all predictions (Scheme 3). These way 29 compounds are predicted as active by all three used screening models. Among them, 14 structures have been selected for synthesis (Scheme 4). The preference has been granted to the structures with common starting compounds and known synthetic methods. The idea was to vary halogen substituents in isatin and in *para*-position of phenyl ring in the 3rd position of pyrazoline core.

The synthesis has been conducted in two stages, with the initial obtaining of 3,5-diaryl-1-thiocarbamoyl-2-pyrazolines through the interaction of thiosemicarbazide with corresponding chalcones in ethanol in the presence of potassium hydroxide. Following one-pot methodology resulting compounds were subjected to the condensation with chloroacetic acid and appropriate isatins in the presence of fused sodium acetate in refluxing acetic acid (Scheme 4) [7]. Compounds 1-6 and 12 have been already reported in [18], so only 7-11, 13 and 14 are presented in chemistry section. The characteristic patterns of AMX system (CH₂-CH protons of pyrazoline fragment) have been found in ¹H NMR spectra of 1-14. The chemical shifts of H_A, H_M and H_X are in the ranges δ =3.46-3.52; 4.12-4.20 and 5.82-6.03 respectively

with corresponding coupling constants $J_{AM} = 17.5\text{--}18.6$, $J_{AX} = 10.6\text{--}11.5$, and $J_{MX} = 3.0\text{--}4.4$. Besides that, the displacement of CH proton in the 4th position of 2,3-dihydro-1*H*-indol-2-one fragment into the weak field ($\delta=8.90\text{--}9.14$) indicates *Z*-configuration of double bond between thiazolidine and indoline systems, which is consistent with X-ray crystallographic analysis of similar compounds in [7]. NH group of indoline shows signal at $\delta=10.80\text{--}11.22$ and spectra of compounds 10-14 have intense singlet in strong field ($\delta=2.86\text{--}2.95$) due to dimethylamino group in *para*-position of phenyl ring.

Anticancer effect of synthesized compounds has been studied using C6, Mino, Jurkat and L1210 cell lines. The results of anticancer activity evaluation for compounds 1-6 and 12 on C6 and Mino cells have been already reported by Avdieiev et al. [18]. It has been found that compound 2 has significant cytotoxic activity in C6 cells ($IC_{50}=1.22\ \mu\text{M}$), which can be enhanced through immobilization on the polymeric carrier ($IC_{50}=0.13\ \mu\text{M}$). The advantage of immobilization has been also observed in Mino cells viability inhibition experiment. While soluted in DMSO pure compounds 1 and 2 show $IC_{50}=68.2$ and $80.7\ \mu\text{M}$ respectively, the immobilized version of 2 yields $IC_{50}=1.58\ \mu\text{M}$ (Figure 4). Another series of biological experiments on Mino cells using weaker concentrations of treatment compounds (from 0.001 to 10 μM) has identified significant antitumor potential of compounds 3, 6 and 12 with $IC_{50}=0.73$, 0.27 and 0.16 μM respectively [18]. Compound 5 showed weaker cytotoxicity with $IC_{50}=7.4\ \mu\text{M}$, and IC_{50} of 4 lays out of studied concentration range ($IC_{50} > 10\ \mu\text{M}$). Since ranges of concentration in Jurkat cells inhibition study were limited, exact IC_{50} values could not be determined. The obtained data allows saying, that IC_{50} of 2, 3, 5 and 6 do not exceed 10 μM , which is argument for their significant anticancer activity (Figure 5). IC_{50} of compound 1 exceeds 10 μM , while compound 4 did not show even weak effect. These results are in good correlation with Mino cells inhibition assay. Studying the anticancer effect of 1 and 2 on the L1210 cells growth it has been observed that this cell line is resistant to treatment with 1, but sensitive to compound 2 ($IC_{50} \approx 7\ \mu\text{M}$, Figure 6).

Conclusion

Using previously obtained QSAR and pharmacophore models, the virtual screening of 4(2)-thiazolidinone derivatives library has been carried out, and 14 novel 3-[2-(3,5-diaryl-4,5-dihydropyrazol-1-yl)-4-oxo-4,5-dihydro-1,3-thiazol-5-ylidene]-2,3-dihydro-1*H*-indol-2-ones were selected and synthesized. The success of the purposeful synthesis strategy has been confirmed by biological assays, according to which the synthesized compounds can inhibit cancer cells growth even being applied in micromolar concentrations. Since QSAR and pharmacophore models have been trained using NCI-60 cell panel results, but other cell lines have been used for activity evaluation of synthesized compounds, we may claim just qualitative confirmation of the prediction. The four most potent synthesized compounds 3, 5, 6 and 12 show IC_{50} values between 0.16-10 μM under MTT assays of rat glioma cells C6, Mino cells, Jurkat and L1210 cells viability inhibition. Additionally, it has been discovered that the immobilization of compounds on the oligo electrolyte polymeric carrier significantly increases the activity. The most sensitive cancer cell line is Mino, which represents mantle cell lymphoma – a rare but very aggressive tumor. That identifies the further direction of biological studies of the novel anticancer hit compounds.

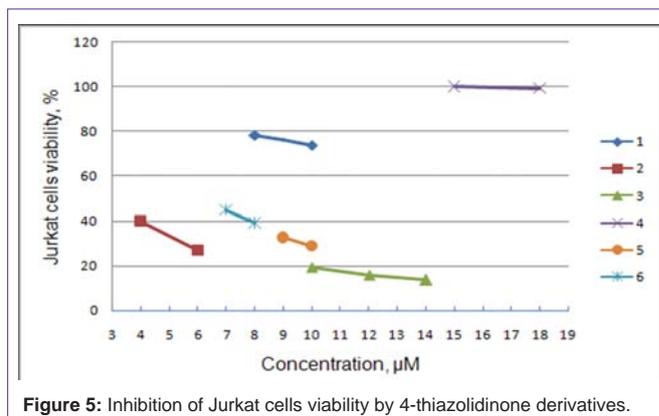


Figure 5: Inhibition of Jurkat cells viability by 4-thiazolidinone derivatives.

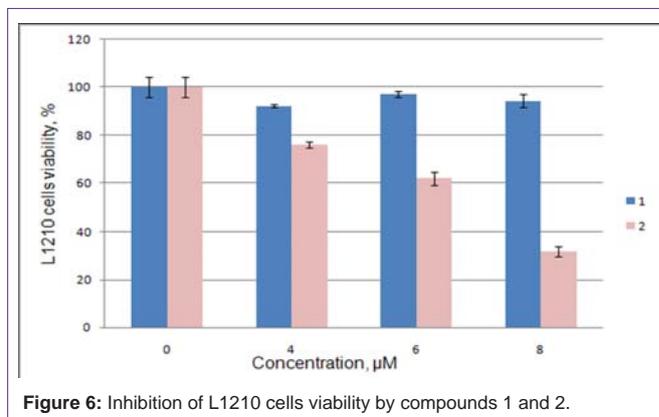


Figure 6: Inhibition of L1210 cells viability by compounds 1 and 2.

Chemistry

The starting 3,5-diaryl-1-thiocarbamoyl-2-pyrazolines were obtained according to the method described previously [27,39]. Melting points were measured in open capillary tubes on a BÜCHI B-545 melting point apparatus and are uncorrected. The elemental analyses (C, H, N) were performed using the Perkin–Elmer 2400 CHN analyzer. Analyses indicated by the symbols of the elements or functions were within $\pm 0.4\%$ of the theoretical values. The ¹H NMR spectra were recorded on Varian Gemini 400 MHz in DMSO-*d*₆ using tetramethylsilane (TMS) as an internal standard. Chemical shifts are reported in ppm units with use of δ scale.

General procedure for synthesis of 3-{2-[3,5-bis-(4-chlorophenyl)-4,5-dihydropyrazol-1-yl]-4-oxo-4*H*-thiazol-5-ylidene}-1,3-dihydroindol-2-ones [7]

A mixture of 3,5-diaryl-1-thiocarbamoyl-2-pyrazoline (10 mmol), chloroacetic acid (10 mmol), appropriate isatin (12 mmol), and anhydrous sodium acetate (20 mmol) was refluxed for 5 h in glacial acetic acid (10 mL). Precipitate obtained upon cooling was filtered off, washed with water and methanol and recrystallized with DMF/ethanol mixtures (1:2 vol). Compounds 1-6 and 12 have been reported in [18].

3-{2-[3-(4-Fluorophenyl)-5-(4-chlorophenyl)-4,5-dihydropyrazol-1-yl]-4-oxo-4*H*-thiazol-5-ylidene}-1,3-dihydroindol-2-one (7). Yield 77%, mp 292–293 °C. ¹H NMR (400 MHz, DMSO-*d*₆+CCl₄): 11.14 (s, 1H), 8.90 (d, *J* = 7.7 Hz, 1H), 7.87–7.89 (m, 2H), 7.45 (d, *J* = 8.1 Hz, 2H), 7.29–7.34 (m, 4H), 7.28 (t, *J* = 7.6 Hz, 1H), 6.95 (t, *J* = 7.5 Hz, 1H), 6.87 (d, *J* = 7.5 Hz, 1H), 5.95 (dd, *J*

= 11.0, 3.6 Hz, 1H), 4.09 (dd, $J = 18.0, 11.0$ Hz, 1H), 3.51 (dd, $J = 18.0, 3.6$ Hz, 1H). Calcd for $C_{26}H_{16}ClFN_4O_2S$: C, 62.09; H, 3.21; N, 11.14; Found: C, 61.38; H, 3.25; N, 11.29.

5-Chloro-3-{2-[3-(4-fluorophenyl)-5-(4-chlorophenyl)-4,5-dihydropyrazol-1-yl]-4-oxo-4H-thiazol-5-ylidene}-1,3-dihydroindol-2-one (8). Yield 73%, mp 294–295 °C. 1H NMR (400 MHz, $DMSO-d_6+CCl_4$): 11.22 (s, 1H), 8.92 (br s, 1H), 7.87–7.89 (m, 2H), 7.45 (d, $J = 8.2$ Hz, 2H), 7.31–7.38 (m, 4H), 7.01 (d, $J = 8.3$ Hz, 1H), 6.91 (d, $J = 8.2$ Hz, 1H), 5.95 (dd, $J = 11.1, 3.6$ Hz, 1H), 4.12 (dd, $J = 18.0, 11.1$ Hz, 1H), 3.52 (dd, $J = 18.0, 3.6$ Hz, 1H). Calcd for $C_{26}H_{15}Cl_2FN_4O_2S$: C, 58.11; H, 2.81; N, 10.43; Found: C, 57.97; H, 2.84; N, 10.37.

5-Bromo-3-{2-[3-(4-fluorophenyl)-5-(4-chlorophenyl)-4,5-dihydropyrazol-1-yl]-4-oxo-4H-thiazol-5-ylidene}-1,3-dihydroindol-2-one (9). Yield 68%, mp >300 °C. 1H NMR (400 MHz, $DMSO-d_6+CCl_4$): 11.18 (s, 1H), 9.04 (br s, 1H), 7.81–7.84 (m, 2H), 7.28–7.51 (m, 6H), 6.96 (d, $J = 7.7$ Hz, 1H), 6.85 (d, $J = 8.2$ Hz, 1H), 5.92–5.95 (m, 1H), 4.08–4.12 (m, 1H), 3.51 (dd, $J = 17.9, 3.5$ Hz, 1H). Calcd for $C_{26}H_{15}BrClFN_4O_2S$: C, 53.67; H, 2.60; N, 9.63; Found: C, 53.91; H, 2.66; N, 9.44.

3-{2-[3-(4-Chlorophenyl)-5-(4-dimethylaminophenyl)-4,5-dihydropyrazol-1-yl]-4-oxo-4H-thiazol-5-ylidene}-1,3-dihydroindol-2-one (10). Yield 77%, mp 290–291 °C. 1H NMR (400 MHz, $DMSO-d_6+CCl_4$): 11.17 (s, 1H), 8.90 (d, $J = 7.9$ Hz, 1H), 7.76–7.78 (m, 2H), 7.61 (d, $J = 8.5$ Hz, 2H), 7.34 (d, $J = 7.6$ Hz, 2H), 7.25 (d, $J = 8.2$ Hz, 2H), 7.00–7.04 (m, 2H), 6.92 (d, $J = 7.8$ Hz, 1H), 5.90 (dd, $J = 10.9, 3.5$ Hz, 1H), 4.13 (dd, $J = 18.3, 10.9$ Hz, 1H), 3.50 (dd, $J = 18.3, 3.5$ Hz, 1H), 2.95 (s, 6H). Calcd for $C_{28}H_{22}ClN_5O_2S$: C, 63.69; H, 4.20; N, 13.26; Found: C, 63.80; H, 4.25; N, 13.34.

5-Chloro-3-{2-[3-(4-chlorophenyl)-5-(4-dimethylaminophenyl)-4,5-dihydropyrazol-1-yl]-4-oxo-4H-thiazol-5-ylidene}-1,3-dihydroindol-2-one (11). Yield 74%, mp >300 °C. 1H NMR (400 MHz, $DMSO-d_6+CCl_4$): 11.17 (s, 1H), 8.94 (br s, 1H), 7.91 (d, $J = 7.9$ Hz, 2H), 7.58 (d, $J = 8.5$ Hz, 2H), 7.35 (d, $J = 8.4$ Hz, 1H), 7.12 (d, $J = 8.7$ Hz, 2H), 6.90 (d, $J = 8.3$ Hz, 1H), 6.68 (d, $J = 8.7$ Hz, 2H), 5.83 (dd, $J = 10.8, 3.3$ Hz, 1H), 4.10 (dd, $J = 18.5, 10.8$ Hz, 1H), 3.50 (dd, $J = 18.5, 3.3$ Hz, 1H), 2.86 (s, 6H). Calcd for $C_{28}H_{21}Cl_2N_5O_2S$: C, 59.79; H, 3.76; N, 12.45; Found: C, 60.05; H, 3.78; N, 12.13.

3-{2-[3-(4-Bromophenyl)-5-(4-dimethylaminophenyl)-4,5-dihydropyrazol-1-yl]-4-oxo-4H-thiazol-5-ylidene}-1,3-dihydroindol-2-one (13). Yield 71%, mp 298–299 °C. 1H NMR (400 MHz, $DMSO-d_6+CCl_4$): 11.15 (s, 1H), 8.90 (d, $J = 8.0$ Hz, 1H), 7.86 (d, $J = 8.6$ Hz, 2H), 7.75 (d, $J = 8.6$ Hz, 2H), 7.34 (t, $J = 7.7$ Hz, 1H), 7.11 (d, $J = 8.7$ Hz, 2H), 7.04 (t, $J = 8.4$ Hz, 1H), 6.91 (d, $J = 7.9$ Hz, 1H), 6.69 (d, $J = 8.8$ Hz, 2H), 5.83 (dd, $J = 10.7, 3.6$ Hz, 1H), 4.10 (dd, $J = 18.5, 10.7$ Hz, 1H), 3.48 (dd, $J = 18.5, 3.6$ Hz, 1H), 2.86 (s, 6H). Calcd for $C_{28}H_{22}BrN_5O_2S$: C, 58.75; H, 3.87; N, 12.23; Found: C, 60.01; H, 3.91; N, 12.12.

5-Chloro-3-{2-[3-(4-Bromophenyl)-5-(4-dimethylaminophenyl)-4,5-dihydropyrazol-1-yl]-4-oxo-4H-thiazol-5-ylidene}-1,3-dihydroindol-2-one (14). Yield 69%, mp 299–300 °C. 1H NMR (400 MHz, $DMSO-d_6+CCl_4$): 11.20 (s, 1H), 8.93 (d, $J = 8.0$ Hz, 1H), 7.82 (d, $J = 8.2$ Hz, 2H), 7.70 (d, $J = 8.4$ Hz, 2H), 7.35

(d, $J = 8.1$ Hz, 1H), 7.12 (d, $J = 8.5$ Hz, 2H), 6.90 (d, $J = 8.4$ Hz, 1H), 6.69 (d, $J = 8.6$ Hz, 2H), 5.82 (dd, $J = 11.0, 3.5$ Hz, 1H), 4.10 (dd, $J = 18.2, 11.0$ Hz, 1H), 3.50 (dd, $J = 18.2, 3.5$ Hz, 1H), 2.87 (s, 6H). Calcd for $C_{28}H_{21}BrClN_5O_2S$: C, 55.41; H, 3.49; N, 11.54; Found: C, 55.80; H, 3.52; N, 11.38.

Acknowledgement

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