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THE CONSENSUS ENSEMBLE NEURAL NETWORK MULTITARGET MODEL OF ANXIOLYTIC ACTIVITY

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The aim of the study

To provide evidence concerning the universality of the consensus ensemble neural network multitarget approach taken as exemplified by anxiolytic activity.

Tasks

1. Choice and search for valid 3D models of target proteins that probable have a significant role in the treatment of anxiety disorders.

- 2. Optimization of ligand 3D structures by methods of molecular mechanics and quantum chemistry.
- 3. Ensemble docking into binding sites.
- 4. Training of the neural networks for consensus ensemble multitarget model.
- 5. Estimation of recognition and prediction accuracy of the obtained neural network models.

Databases and software







Training set

- 24	Α	В	С	D	E	F	G	Н	- I	J	K	L
1	Mol_ID	Code	Levels	LevH	LevHM	LevA	ADRA1A	ADRA1B	ADRA2A	ADRA2B	AGTR1	GABA-A-GABA
2	1	CHEMBL99259	high	h	hm	а	-8.8	-8.9	-10.7	-6.6	-9.1	-7.7
3	2	CHEMBL513136	high	h	hm	а	-5.9	-8.8	-9.3	-7.0	-9.8	-8.0
4	3	CHEMBL3410223	high	h	hm	а	-7.6	-7.4	-8.8	-6.6	-9.8	-7.4
5	4	CHEMBL323519	high	h	hm	а	-6.4	-7.7	-7.6	-5.6	-8.8	-6.6
6	5	CHEMBL204240	high	h	hm	а	-7.5	-7.1	-7.6	-5.1	-7.8	-6.4
7	6	CHEMBL314608	high	h	hm	а	-6.4	-7.3	-7.8	-5.6	-7.9	-6.3
8	7	CHEMBL319178	high	h	hm	а	-8.1	-8.7	-10.4	-6.5	-9.7	-7.5
9	8	CHEMBL101045	high	h	hm	а	-6.8	-7.2	-8.1	-5.2	-8.2	-6.7
10	9	CHEMBL543621	high	h	hm	а	-6.5	-7.4	-7.4	-5.3	-8.0	-6.4
11	10	CHEMBL545731	high	h	hm	а	-6.5	-7.2	-6.8	-5.4	-8.0	-6.4
12	11	CHEMBL3409256	high	h	hm	а	-8.1	-8.1	-9.6	-7.6	-9.8	-7.7
13	12	CHEMBL153823	high	h	hm	а	-7.7	-7.0	-8.2	-9.2	-8.1	-6.5
14	13	CHEMBL466847	high	h	hm	а	-6.9	-7.9	-9.2	-7.0	-9.1	-7.8
15	14	CHEMBL3084529	high	h	hm	а	-6.8	-9.6	-9.3	-5.7	-10.3	-7.8
16	15	CHEMBL3410224	high	h	hm	а	-7.3	-8.0	-8.7	-6.3	-8.8	-6.9
17	16	CHEMBL13662	high	h	hm	а	-9.1	-7.8	-9.4	-8.5	-9.4	-7.7
18	17	CHEMBL3246317	high	h	hm	а	-8.3	-8.2	-8.5	-8.1	-8.9	-7.7
19	18	CHEMBL3808873	high	h	hm	а	-6.7	-7.5	-7.5	-5.3	-7.9	-6.3
20	19	CHEMBL67100	high	h	hm	а	-8.1	-7.6	-8.9	-7.0	-8.5	-7.0

Multilayer Perceptron Neural Networks

Data: NetWorks ChEMBL_Anxiolitic-Correct_All v03* (29v by 662c) Data5 1 11 9 10 3 Δ 5 6 LevH LevHM LevA ADRA24 Code Levels ADRA1/ ADRA1E 23 -8.9 -10.7 3 SANN - Data selection: NetWorks ChEMBL_Anxiolitic-Correct_All v03 Active neural networks -8.8 -9.3 Test perf. Net ID | Net name Training perf. Quick Sampling Select variables for analysis MLP 17-10-2 86.286920 88.297872 2 MLP 17-6-2 86,497890 88.297872 R Variables 1 · Code NMDA-Ca · Code 3 MLP 17-8-2 87.341772 88.297872 2 · Levels SLC18A2 2 · Levels 4 MLP 17-11-2 86,708861 88.297872 3 · LevH Selected variables 3 · LevH 23 · Sample1 5 MLP 17-6-2 85 864979 88 297872 4 · LevHM 24 · Sample2 4 · LevHM ٠ Continuous targets: ш none 5 · LevA 25 · Sample3 5 · LevA Categorical target: 6 · ADRA1A 26 · Sample4 6 · ADRA1/ none 盟 開 Select\Deselect active networks 25 - Sample3 A11 27 · Sample5 7 · ADBA1B Continuous inputs: none 8 · ADRA2A 1 28 · Sample6 9 · ADRA2 9 · ADRA2B 29 · Sample7 1 Categorical inputs: none Build more models with CNN 10 · AGTR1 2 10 · AGTR1 Strategy < III | þ. . 4 111 F < III | Automatic network search (ANS) Zoom Spread Zoom Spread Spread Include case names (2 and 3 dimensional graphs only) Custom neural networks (CNN). Categorical in Categorical target Continuous inputs Target variable: LevH $\overline{\mathbf{v}}$ 6-22 X-axis Y-axis Z-axis Show appropriate variables only Target Target . .

x SANN - Results: NetWorks ChEMBL Anxiolitic-Correct All v03 Validation Algorithm Error funct. . 86.170213 BFGS 8 CE = 86.170213 BFGS 11 CE BFGS 15 CE 85,106383 87.234043 BFGS 17 CE $\overline{\mathbf{v}}$ 85106383 BEGS 10 CF Delete networks Build more models with ANS Predictions (MLP\RBF) Graphs (MLP\RBF) Details Liftcharts SUHH Summary Save networks -Cancel Target . $\mathbf{\Sigma}$ Options Output Dutput Output Accuracy Accuracy Accuracy Sample h (conf.) h (conf.) h (conf.) nh (conf.) 🔽 Train nh (conf.) nh (conf.) ADRA1A ADRA1A ADRA1A 🔽 Test ADRA1B ADBA1B ADRA1B Validation X and Y۲ Histograms of X X, Y and \underline{Z} Missing

Results of training and selection of neural networks

	LevH (Classification summary) (NetWorks ChEMBL_Anxiolitic-Correct_All v03-H4)									
	Samples: Train, Test, Validation									
	LevH-h	LevH-nh		_	L out (Clou			avialitia Correct All v02 H4)		
Total	95.0000	567.0000		Level (Classification summary) (Networks ChEIVIBL_Anxioiitic-Correct_A						
Correct	15.0000	564.0000			Samples.	fram, rest,	Validation			
Incorrect	80.0000	3.0000		1	Levn-n	LevH-nn	_			
Correct (%)	15.0000	99.0000		Incorrect (%)	86.0000	1.0000		%		
Incorrect (%)	84.0000	0.0000		Total	95.0000	567.0000	LCVCI	70		
Total	95.0000	567.0000		Correct	76.0000	544.0000				
Correct	17.0000	557.0000		Incorrect	19.0000	23.0000				
Incorrect	78.0000	10.0000		Correct (%)	80.0000	95.0000	E(High)	80 5		
Correct (%)	17.0000	98.0000		Incorrect (%)	20.0000	4.0000	r (riigir)	09.0		
Incorrect (%)	82.0000	1.0000		lotal	95.0000	567.0000				
Total	95.0000	567.0000		Correct	66.0000	546.0000				
Correct	12.0000	559.0000		Incorrect	29.0000	21.0000	E(Modorato)	06 7		
Incorrect	83.0000	8.0000		Correct (%)	69.0000	96.0000	r(moderate)	90.7		
Correct (%)	12.0000	98.0000		Incorrect (%)	30.0000	3.0000				
Incorrect (%)	87.0000	1.0000		Total	95.0000	567.0000				
Total	95.0000	567.0000		Correct	39.0000	552.0000		07.2		
Correct	18.0000	556.0000		Incorrect	56.0000	15.0000	F(LOW)	97.5		
Incorrect	77.0000	11.0000		Correct (%)	41.0000	97.0000				
Correct (%)	18.0000	98.0000		Incorrect (%)	58.0000	2.0000				
Incorrect (%)	81.0000	1.0000		Total	95.0000	567.0000	E(Conorol)	02.6		
Total	95.0000	567.0000		Correct	67.0000	548.0000	r(General)	92.0		
Correct	6.0000	564.0000		Incorrect	28.0000	19.0000				
Incorrect	89.0000	3.0000		Correct (%)	70.0000	96.0000	C onconcus			
Correct (%)	6.0000	99.0000		Incorrect (%)	29.0000	3.0000	Consensus			
Incorrect (%)	93.0000	0.0000		Total	95.0000	567.0000	recognition			
				Correct	64.0000	547.0000	i coogination	4000/		
				Incorrect	31.0000	20.0000	accuracy tor	100%		
				Correct (%)	67.0000	96.0000	references			
				Incorrect (%)	32.0000	3.0000				

Results

- 1. We have found the most significant targets associated with anxiolytic activity, and selected their valid 3D models.
- 2. Molecular mechanical and quantum chemistry approaches were used to optimize 3D models of ligand structures.
- 3. We have performed ensemble docking into binding sites.
- 4. More than 136,000 neural networks have been trained.
- 5. We constructed a consensus ensemble neural network multitarget classification model of anxiolytic activity of chemical compounds.
- 6. There was evaluated the recognition and prediction accuracy of the resulting model.

Thank you for listening