

Title: Modeling Drug Solubility in Water-Cosolvent Mixtures Using an Artificial Neural Network (ANN).

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Abstract: A new computational method based on an artificial neural network has been proposed to calculate solute solubility in binary mixed solvents. The accuracy of the proposed method has been compared with that of the best multiple linear regression method taken from the literature employing seven numerical analyses and the results showed that the proposed method was superior in six numerical analyses and there was no significant difference between two methods in a numerical analysis.

Key words: Artificial Neural Network, Solubility prediction, Mixed Solvent.

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2- ANN: Artificial neural networks.
3- Multivariate calibration
4- Classification
5- Pattern recognition
6- Modeling

1- Chemometrics.

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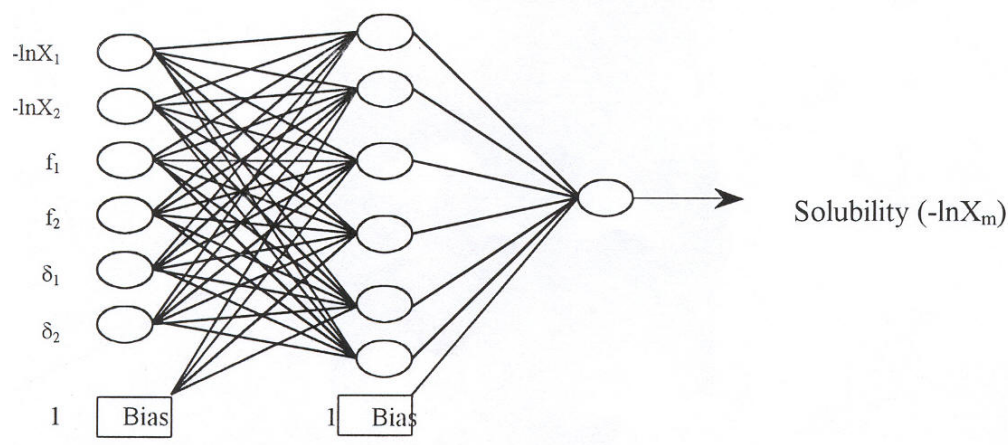
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- 7- Training
- 8- Validation
- 9- Prediction

- 1- Extrapolation
- 2- Feed forward back propagation error
- 3- Adaptive
- 4- Learning rate
- 5- Learning rate increase
- 6- Learning rate decrease



$$IPD = 100 \left| \frac{X_m^{Calculated} - X_m^{observed}}{X_m^{observed}} \right|$$

(MPD: Mean percentage deviation)

MLR) :

(Multiple linear regression

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$$MPD = \frac{100}{N} \sum_1^N \left| \frac{X_m^{Calculated} - X_m^{Observed}}{X_m^{Observed}} \right|$$

:

$$X_m^{Observed} \quad X_m^{Calculated}$$

N

$$\ln X_m = f_1 \ln X_1 + f_2 \ln X_2 + f_1 f_2 \sum_{i=0}^2 M_i (f_1 - f_2)^i$$

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MPD

OMPD: Overall mean percentage deviation

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(IPD: Individual percentage deviation)

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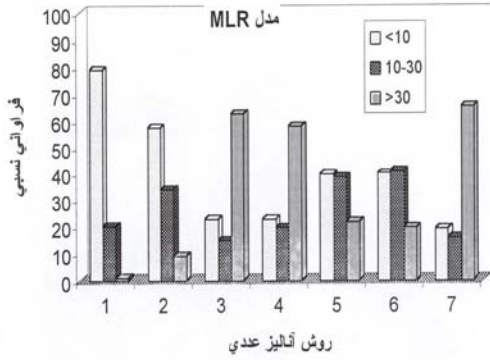
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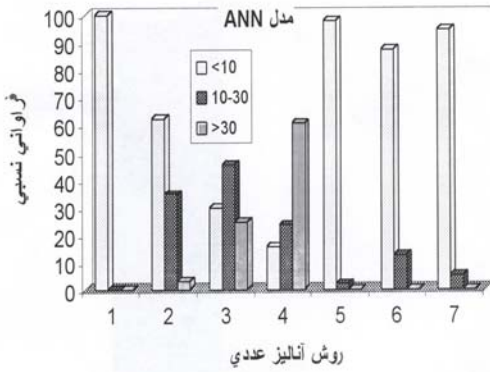


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MLR ANN

Method/ Cosolvent	Set numbers in Table 1	N	Max-IPD ^a	MPD ^a	S.D. % of MPD ^a
MLR:					
Dimethylformamide	2-3	25	26.05	10.28	9.95
Dioxane	4-17	233	174.86	25.79	27.91
Ethanol	18-22	60	147.71	22.73	33.80
Ethylene glycol	23-24	35	78.14	16.35	17.18
Propylene glycol	27-35	101	52.04	13.18	12.49
			OMPD	20.36	
ANN:					
Dimethylformamide	2-3	25	4.67	0.96	1.08
Dioxane	4-17	233	23.97	3.43	3.44
Ethanol	18-22	60	12.95	2.71	2.38
Ethylene glycol	23-24	35	7.12	2.61	2.16
Propylene glycol	27-35	101	5.76	1.88	1.35
			OMPD	2.02	

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MLR ANN

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ANN MLR

Method/Solute	Set numbers in Table 1	N	Maximum IPD ^a	IPD ^a	S.D. % of MPD ^a
MLR:					
Sulpha drugs in water-dioxane	8-15	142	138.19	25.38	28.24
Xanthines in water-dioxane	4, 16, 17	48	76.60	17.59	17.98
Benzoates in water-propylene glycol	27-30,32-35	88	51.12	12.14	11.87
			OMPD	18.37	
ANN:					
Sulpha drugs in water-dioxane	8-15	142	25.16	6.76	5.37
Xanthines in water-dioxane	4, 16, 17	48	7.04	2.71	1.89
Benzoates in water-propylene glycol	27-30,32-35	88	14.24	4.64	3.20
			OMPD	4.70	

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ANN MLR

Method/Cosolvent	Set numbers in Table 1	N	Maximum IPD ^a	MPD ^a	S.D. % of MPD ^a
MLR:					
Theophylline	1,17, 25-26	63	809.81	105.59	192.99
Paracetamol	6, 20	30	112.09	37.56	26.85
Caffeine	2, 4	27	219.44	58.41	58.71
			OMPD	67.19	
ANN:					
Theophylline	1,17, 25-26	63	13.19	5.14	3.23
Paracetamol	6, 20	30	10.74	3.06	2.52
Caffeine	2, 4	27	4.99	1.87	1.54
			OMPD	3.36	

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MLR ANN

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