

An intelligent tool for the characterization of anaemic blood and to find the therapeutic effect of erythropoietin using spectral data

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Abstract: Anaemia is a common problem in Chronic Kidney Disease (CKD) leading to substantial morbidity and mortality if untreated. The particular cells of the failing kidney are unable to secrete sufficient erythropoietin, the hormone that stimulates erythropoiesis. Treatment of anaemia with erythropoiesis-stimulating agents (ESA) has led to increased quality of life and a reduced cardiovascular risk. Therefore anaemic blood has to be identified and proper treatment has to be given. Though investigations on characterisation of anaemic blood and therapeutic effect of erythropoietin in CKD have been done by many, not much work is done on automation of this investigations. The goal of this study is to train the System (Neural Network [NN]) to identify whether the given blood sample is anaemic blood or not and also to examine prospectively the effect of erythropoietin in anaemic patients using the System which is already trained to identify the anaemic blood.

Keywords: Anaemia, erythropoietin, chronic kidney disease, neural network.

Introduction

Anaemia (a reduced haemoglobin [Hb] concentration) is a common problem in chronic kidney disease (CKD) leading to substantial morbidity and mortality if untreated. Over the past decade, effective management has become possible using safer intravenous iron preparations and genetically engineered erythropoiesis-stimulating agents (ESA). The particular cells of the failing kidney are unable to secrete sufficient erythropoietin, the hormone that initiates erythropoiesis. Anaemia is considered to be present when blood Hb concentration is reduced to a level below that is necessary for adequate tissue oxygenation. Reference range for a healthy adult female is between 12g/dl and 15g/dl and for an adult male is between 13g/dl and 17g/dl. Anaemia of CKD may present with mild breathlessness and exertion, lethargy and tiredness. However, due to its insidious onset, anaemia associated with CKD is often asymptomatic and only picked up upon routine blood analysis. If anaemia is left untreated, it might lead to complications including increased cardiac output leading to cardiac enlargement and heart failure, cognitive impairment, altered menstrual cycles, erectile dysfunction and impaired immune response. Therefore anaemic blood has to be identified and

proper treatment has to be given (Renal Association, 2004)

The European Best Practice Guidelines say that anaemia should be investigated in patients with CKD when Hb level falls below 11.5g/dl in adult females and 13.5g/dl in adult males (Locatelli *et al.*, 2004). Treatment of anaemia with ESA has led to increase the quality of life and reduce the risk of cardio vascular disease. By ESA therapy the need for blood transfusions to correct anaemia is reduced, decreasing the risk of transmission of blood borne viruses, iron overload and sensitization of patients to future transplants. ESAs also have positive impact on exercise capacity, sleep patterns, cognitive function, immune response and sexual function (Dreicher & Horl, 2004).

Neural network (NN) processes information in a similar way the human brain does. To capture the essence of biological neural systems, an artificial neuron is defined as follows:

- 1) It receives a number of inputs. Each input comes via a connection that has strength (weight), which corresponds to synaptic efficacy in a biological neuron. Each neuron also has a single threshold value. The weighted sum of inputs is formed, and the threshold subtracted, to compose the activation of the neuron.
- 2) The activation signal is passed through an activation function to produce the output of the neuron. So, NN can be trained to behave like a doctor in the characterization of diseases (Christos Stergiou & Dimitrios Siganos, Neural Networks, http://www.doc.ic.ac.uk/~nd/surprise_96/journal/vol4/cs11/report.html).

Though investigations on characterization of anaemic blood and therapeutic effect of erythropoietin in CKD have been done by many, not much work is done on automation of these investigations. The goal of this study is to train the NN (intelligent system) to identify whether the given blood sample is anaemic or not, across the dose range on R1, R2, R3, R4, R5 where R1, R2, R3, R4, R5 are intensity ratio parameters (IRP) and also to examine prospectively the effect of erythropoietin in chronic renal failure (CRF) patients using the trained NN. R1 is given by A_{702}/A_{1035} , the ratio of N-H out of plane deformation of protein and C-O stretch of β anomer. R2 is given

Table 1

Weight	Value
Weight _{ti1-1}	-2.573772
Weight _{ti1-2}	1.527504
Weight _{ti1-3}	2.687236
Weight _{ti2-1}	-0.616765
Weight _{ti2-2}	0.676592
Weight _{ti2-3}	0.798253
Weight _{ti3-1}	-1.513120
Weight _{ti3-2}	1.591244
Weight _{ti3-3}	1.168176
Weight _{ti4-1}	-1.265713
Weight _{ti4-2}	0.852691
Weight _{ti4-3}	1.125657
Weight _{ti5-1}	-1.782553
Weight _{ti5-2}	1.254370
Weight _{ti5-3}	2.085100
Weight _{to1-1}	-7.752414
Weight _{to2-1}	4.094495
Weight _{to3-1}	6.809275

"Anaemia"

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by A_{1170}/A_{1230} , the ratio of C-O stretch of COH tyrosine protein and lipid phosphate band arising from the asymmetric PO_2 stretching vibration. R3 is given by A_{1400}/A_{1456} , the ratio of symmetric and asymmetric bending vibration of the methyl group of protein. R4 is given by A_{1542}/A_{1655} , the ratio of the intensities of amide-II and amide-I bands of the amino acids and lipids. R5 is given by A_{2929}/A_{3300} , the ratio of intensities of CH_2 asymmetric stretching and N-H stretching vibration of the secondary amides of the protein (Shaw *et al.*, 1998).

Table 2

No. of neurons in hidden layer	No. of iterations
2	87,293
3	43,931
4	62,686
5	64,521

collected from 10 healthy people and 10 anaemic patients between the age group 55 and 70 years from A.K.N. Nursing Homes, Kilpauk, Chennai. The FTIR spectra of blood sera of the collected samples (20 samples) were recorded and fed as input to train our system. The learning parameters ' η ' component that is the gradient descent and ' α ' component that is the 'momentum'

which effectively keeps a moving average of the gradient descent weight change contributions were carefully chosen to speed up the training. Twenty training samples

were repeatedly fed to the system in a random order to minimize the weight oscillations for each of the iteration.

To study the therapeutic effect of erythropoietin, 10 anaemic patients from A.K.N. Nursing Homes, Kilpauk, Chennai between the age group 55 and 75 year who were suffering from CKD were chosen for the present investigation. Before the drug therapy, their blood samples were collected and FTIR

Table 3. Testing- training samples

Sample No.	R1	R2	R3	R4	R5	Target output	System output
1	0.613200	0.851500	1.062900	0.653900	0.515200	0.000000	0.000118
2	0.612600	0.853000	1.077500	0.683500	0.512700	0.000000	0.000172
3	0.613100	0.850700	1.080100	0.651300	0.520700	0.000000	0.000164
4	0.610100	0.899100	1.073300	0.684200	0.567200	0.000000	0.000460
5	0.643400	0.891300	1.062000	0.693600	0.547600	0.000000	0.000289
6	0.779600	0.954800	1.113700	0.725300	0.621500	1.000000	0.999782
7	0.769900	0.922800	1.092500	0.722400	0.658500	1.000000	0.999563
8	0.797200	0.910300	1.137700	0.711000	0.626200	1.000000	0.999715
9	0.780100	0.914400	1.121800	0.729000	0.617600	1.000000	0.999746
10	0.775800	0.952500	1.101600	0.740700	0.612200	1.000000	0.999719
11	0.652300	0.892900	1.064400	0.677100	0.539000	0.000000	0.000198
12	0.654300	0.897400	1.085400	0.672900	0.518400	0.000000	0.000417
13	0.630800	0.898200	1.053300	0.694600	0.565000	0.000000	0.000404
14	0.633000	0.896700	1.057100	0.689300	0.565400	0.000000	0.000358
15	0.658300	0.892000	1.078100	0.692200	0.512500	0.000000	0.000470
16	0.801400	0.916000	1.104400	0.732400	0.613900	1.000000	0.999707
17	0.791600	0.949300	1.101500	0.729500	0.628800	1.000000	0.999770
18	0.778300	0.921900	1.095300	0.714700	0.623800	1.000000	0.999548
19	0.772700	0.914900	1.128000	0.756400	0.626200	1.000000	0.999770
20	0.782100	0.959100	1.104700	0.753900	0.623000	1.000000	0.999779

Experimental description

For characterization of anaemic blood we have used a simple three-layer feed forward back propagation network. During the training iteration of a back propagation NN, we modified the weights at the output layer and then we proceeded backwards on the hidden layer to reach the input layer (Djodilatchoumy *et al.*, 2008). Our system consists of 3 layers namely (i) input layer with 5 neurons, (ii) hidden layer with 3 neurons and (iii) output layer with 1 neuron. The value of the output neuron varies from 0 to 1 (value 0 indicates the most healthy blood and value 1 indicates the most diseased blood). The Weight $_{IH}$ x - y which is the strength/weight of the connection between unit x in the input layer and unit y in the hidden layer and Weight $_{HO}$ x - y which is the weight of the connection between unit x in the hidden layer and unit y in the output layer are given in Table1.

Two ml of blood samples were

spectra of blood sera of the collected samples are were recorded. Then the recorded spectral data were fed as input to our system and the output was noted (pre-treatmental). The selected 10 patients were prescribed with erythropoietin injection 2000 units (drug Erypro) once in a week for a period of six months. An interim and final check up was performed over a period of 3rd and 6th months respectively, after the treatment was initiated. To find the efficacy of the above said drug, the FTIR spectra were recorded at regular interval of 3 months and the spectral data were fed as input to our system and the output were noted down (post- treatmental).

Results and discussion

The maximum number of iterations that the input samples can be repeated for training is 1,000,000. The value of ' η ' and ' α ' is fixed as 0.9. Our System will stop learning when the error term that is the difference between network's actual output and the desired output is less than 0.000001 or when it reaches the

Table 4. Testing- random samples

Sample: 1	
Give the input(R1)	- 0.5132
Give the input(R2)	- 0.6884
Give the input(R3)	- 1.0565
Give the input(R4)	- 0.5534
Give the input (R5)	- 0.4132
Result- .796272	
Sample: 2	
Give the input(R1)	- 0.8796
Give the input(R2)	- 0.9647
Give the input(R3)	- 1.2232
Give the input(R4)	- 0.8253
Give the input(R5)	- 0.6543
Result - .999987	

maximum number of iterations, 1,000,000. Fixing the value of ' η ' and ' α ' value to 0.9, the network is trained by varying the number of neurons in the hidden layer. We found that our NN is trained effectively with 3 neurons in the hidden layer and the result of which is summarized in Table 2.

Our NN is able to identify the training samples (20) correctly, the result of which is summarized in Table 3. It is also able to identify any random sample correctly which is evidenced by Table 4.

In order to find the therapeutic effect of erythropoietin, the output of pre-treatment (Pre), post-treatment1 (Post 1), post-treatment 2 (Post 2) are given in Table 5. The % of therapeutic effect of erythropoietin is calculated using the formula $(\text{Pre-Post2}) / \text{Pre} * 100$ and the results are given in Table 6. It is concluded from the result that erythropoietin therapy reduces the disease by 8.5%.

Conclusion

Neural Networks are being used in the detection of various diseases such as hyperlipidemia, chronic renal failure, head and neck squamous cell carcinoma and a variety of health-related indices can also be monitored (Ronald *et al.*, 2008) The onset of a particular medical condition could be associated with a very complex

combination of changes on a subset of the variables being monitored in medicines. Neural Networks have been used to recognize this predictive pattern, so that the appropriate treatment can be prescribed. FTIR spectroscopy allows accurate lipids concentration determination. Since our Neural Network is trained to distinguish the anaemic blood with the fine details of FTIR spectra, it can improve the diagnostic accuracy and rate of anaemic treatment at a faster rate with more accuracy. It can also be used to analyze the therapeutic effect of the drug erythropoietin.

Acknowledgement

We are indebted to Dr.K.N.Thirunavukkarasu, A.K.N. Nursing Homes, Kilpauk, Chennai for providing the blood samples of anaemic patients. We are grateful to SAIF, IIT, Chennai for spectral readings.

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Table 5. Therapeutic effect of erythropoietin

Sample	R1	R2	R3	R4	R5	Output
Pre						
1	0.779600	0.954800	1.113700	0.725300	0.621500	0.999981
2	0.769900	0.922800	1.092500	0.722400	0.658500	0.999981
3	0.797200	0.910300	1.137700	0.711000	0.626200	0.999981
4	0.780100	0.914400	1.121800	0.729000	0.617600	0.999981
5	0.775800	0.952500	1.101600	0.740700	0.612200	0.999981
6	0.801400	0.916000	1.104400	0.732400	0.613900	0.999981
7	0.791600	0.949300	1.101500	0.729500	0.628800	0.999981
8	0.778300	0.921900	1.095300	0.714700	0.623800	0.999980
9	0.772700	0.914900	1.128000	0.756400	0.626200	0.999981
10	0.782100	0.959100	1.104700	0.753900	0.623000	0.999981
Post1						
1	0.751200	0.903900	1.037100	0.738000	0.603600	0.999976
2	0.681600	0.913400	1.082200	0.656400	0.607000	0.999956
3	0.747600	0.918500	1.036200	0.701300	0.604000	0.999973
4	0.728900	0.909200	1.051400	0.664600	0.502100	0.999775
5	0.708000	0.891100	1.099400	0.736700	0.570800	0.999975
6	0.730800	0.899900	1.050900	0.684600	0.526400	0.999809
7	0.747100	0.870200	1.099600	0.722400	0.604300	0.999979
8	0.721700	0.918700	1.090400	0.663000	0.514900	0.999932
9	0.745500	0.886400	1.050900	0.725200	0.606600	0.999974
10	0.717000	0.912700	1.097700	0.650700	0.580700	0.999968
Post2						
1	0.710700	0.843900	1.032900	0.688800	0.204500	0.969380
2	0.656300	0.866300	1.012200	0.621700	0.245800	0.967819
3	0.641900	0.867600	1.030100	0.620200	0.287700	0.915656
4	0.646700	0.853200	1.041400	0.668700	0.280200	0.938668
5	0.655200	0.858700	1.069300	0.667700	0.294300	0.947266
6	0.635500	0.844200	1.004100	0.624500	0.217500	0.872495
7	0.643500	0.843000	1.037400	0.650500	0.143900	0.924109
8	0.635500	0.848400	1.079500	0.650900	0.173700	0.916795
9	0.631500	0.851500	1.061300	0.628600	0.185900	0.836666
10	0.655200	0.851000	1.062000	0.634000	0.145300	0.865350