



Islamic University of Gaza

Artificial Intelligence course (Spring 2016-2017)

Assignment # 2 Solution

Supervised Neural Network and Genetic Algorithm

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**Q1) Design perceptron neural network to classify the following**

$$\left\{ \mathbf{p}_1 = \begin{bmatrix} 2 \\ 2 \end{bmatrix}, t_1 = 0 \right\} \left\{ \mathbf{p}_2 = \begin{bmatrix} 1 \\ -2 \end{bmatrix}, t_2 = 1 \right\} \left\{ \mathbf{p}_3 = \begin{bmatrix} -2 \\ 2 \end{bmatrix}, t_3 = 0 \right\} \left\{ \mathbf{p}_4 = \begin{bmatrix} -1 \\ 1 \end{bmatrix}, t_4 = 1 \right\}$$

**Use the initial weights and bias:**

$$\mathbf{W}(0) = \begin{bmatrix} 0 & 0 \end{bmatrix} \quad \theta(0) = 0.$$

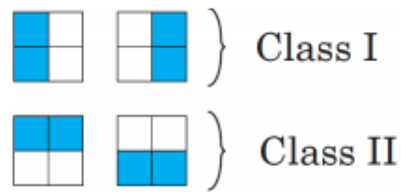
**Solution.**

Ephoc	P1	P2	q	dt	w1	w2	$\sum(p*w)$	ta	e	w1(new)	w2(new)	q(new)
E1	2	2	0	0	0	0	0	1	-1	-0.2	-0.2	0.1
	1	-2	0.1	1	-0.2	-0.2	0.1	1	0	-0.2	-0.2	0.1
	-2	2	0.1	0	-0.2	-0.2	-0.1	0	0	-0.2	-0.2	0.1
	-1	1	0.1	1	-0.2	-0.2	-0.1	0	1	-0.3	-0.1	0
E2	2	2	0	0	-0.3	-0.1	-0.8	0	0	-0.3	-0.1	0
	1	-2	0	1	-0.3	-0.1	-0.1	0	1	-0.2	-0.3	-0.1
	-2	2	-0.1	0	-0.2	-0.3	-0.1	0	0	-0.2	-0.3	-0.1
	-1	1	-0.1	1	-0.2	-0.3	0	1	0	-0.2	-0.3	-0.1
E3	2	2	-0.1	0	-0.2	-0.3	-0.9	0	0	-0.2	-0.3	-0.1
	1	-2	-0.1	1	-0.2	-0.3	0.5	1	0	-0.2	-0.3	-0.1
	-2	2	-0.1	0	-0.2	-0.3	-0.1	0	0	-0.2	-0.3	-0.1
	-1	1	-0.1	1	-0.2	-0.3	0	1	0	-0.2	-0.3	-0.1

$$w(\text{new}) = w(\text{old}) + (\alpha * e * \text{input})$$

$$\alpha = .1, w1=0, w2=0, q=0$$

Q2) Consider the two classes of patterns that are shown in Figure. Class I represents vertical lines and Class II represents horizontal lines.



i. Are these categories linearly separable?

No, they are not linearly separable. We need 2 hyperplan to distinguish these categories.

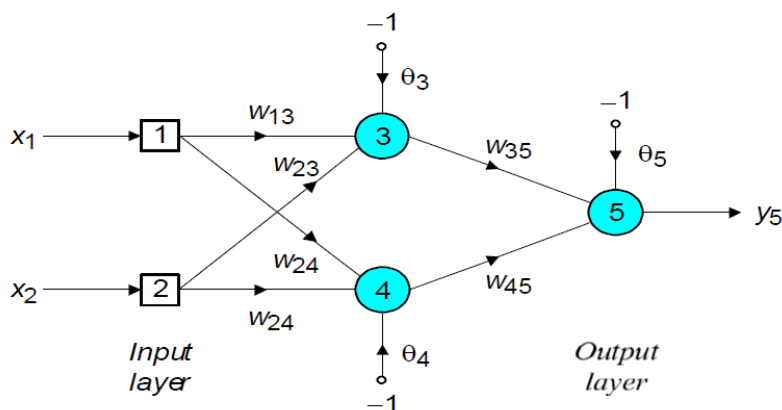
ii. Design a multilayer network to distinguish these categories.

To design such network, let see how can represent input data.

Assume each square represents an input for the network, 1 represents blue square and 0 represents white square.(Class I =>1 , Class II =>0)

p1	p2	p3	p4	output
1	0	1	0	1
0	1	0	1	1
1	1	0	0	0
0	0	1	1	0

In the table, (p1 and p2) or (p3 and p4) can be used to determine the class type and it is represent XOR logic function.



Q3) write a code to find the best solution to maximize  $f(x)$  by GA. Use 8 bits for each variable within interval  $[-2, 2]$ .

$$f(x) = 100(x_2 - x_1^2)^2 + (1 - x_1)^2$$

### Solution:

We have two variables for this problem each of them with 8 binary bits. So, each chromosome contains 16 genes, 6 of them for  $x_1$  and the other 6 genes for  $x_2$ .

Firstly, I used binary encoding to create initial population with random binary bit using MATLAB 2013a. population size is determined to be 20 chromosomes for each generation.

Then I mapped each chromosome decimal value to be inside close interval  $[-2, 2]$  as follow

$$[(2-(-2))/255]=0.01568627$$

$$X1 = 0.0156827 * (\text{decimal\_x1}) - 2$$

$$X2 = 0.0156827 * (\text{decimal\_x2}) - 2$$

The values will be used to determine fitness function

Generation is putted to 600 generation

Crossover probability=0.7

Mutation probability=0.01

Mutation process is obtained by complement one bit in chromosome

## Code:

```
nn=16; % number of genes
ps=20; % population size
ng=600; % number of generation

pc=0.7; % probability of crossover
pm=0.01; % probability of mutation

r=randi([0 1],ps,nn); %initialize chromosoms with binary encoding
variable_value=4/255; %calculate variables between -2 and 2

for gc=1:ng % generations loop
    decimal_value_x1=zeros(ps,2); % matrix of x1
    decimal_value_x2=zeros(ps,2); % matrix of 2
    fitness_array=zeros(ps,1); % matrix of fitness function values
    sum=0;
    for n1=1:ps
        %for x1
        d_num1=bi2de(r(n1,1:8)); %decimal value for x1 , first section
        decimal_value_x1(n1,1)=d_num1;
        % mapping decimal value of x1 to value between -2 and 2
        decimal_value_x1(n1,2)=(d_num1.*variable_value)-2;
        %for x2
        d_num2=bi2de(r(n1,9:16)); %decimal value for x2 , second section
        decimal_value_x2(n1,1)=d_num2;
        % mapping decimal value of x2 to value between -2 and 2
        decimal_value_x2(n1,2)=(d_num2.*variable_value)-2;
        %fitness function x1,x2
        fitness_value=(100*((decimal_value_x2(n1,2)-
        (decimal_value_x1(n1,2).^2)).^2)+(1-decimal_value_x1(n1,2)).^2;
        fitness_array(n1,1)=fitness_value;
        sum=sum+fitness_array(n1,1); % calculate summation of fitness values
    end
    for probability
    end

    %fprintf(1,'sum dcl=%',sum);
    %probabilities
    % probabilities(n1,1)=decimal_value(n1,1);
    probabilities=fitness_array./sum; %probability for each index and
    fitness

    %fprintf('probability for value % =
    %',probabilities(n1:1),probabilities(n1:2))
    %find the index of maximum value to get the binary chromosome from r
    bv= find(fitness_array==max(fitness_array(:,1)))
    Cb=r(bv,:) % best chromosome
```

```

% crossover:
    % genes with cities numbers in ii will be put to crossover
    ii=roulette_wheel_indexes(ps,probabilities(:,1));
    % length(ii)=ps, then more probability p(i) of i-gene then more
    % frequently it repeated in ii list
    Gc=r(ii,:); % genes to crossover
    Gch=zeros(ps,nn); % childrens

    for prc=1:(ps/2) % pairs counting
        i1=1+2*(prc-1);
        i2=2+2*(prc-1);
        g1=Gc(i1,:); %one gene
        g2=Gc(i2,:); %another gene
        cp=ceil((nn-1)*rand); % crossover point, random number form
range [1; nn-1]

        if rand<pc
            % two childrens:
            g1ch=insert_begining(g1,g2,cp);
            g2ch=insert_begining(g2,g1,cp);
            Gch(i1,:)=g1ch;
            Gch(i2,:)=g2ch;
        else
            Gch(i1,:)=g1;
            Gch(i2,:)=g2;
        end
    end
    G=Gch; % now children

    % mutation of exchange 2 random cities:
    for psc=1:ps
        if rand==pm
            rnp=ceil(nn*rand); % random number of cities to permutation
            G(psc,rnp)=not(G(psc,rnp));
        end
    end

    end
    r=G;
    r(1,:)=Cb(1,:); % elitism

    (bi2de(r(1,1:8)).*variable_value)-2
    (bi2de(r(1,9:16)).*variable_value)-2

end

```

## Roulette wheel code

```
function ii=roulette_wheel_indexes(m,prn)
% return indexess ii
% length(ii)=m
% ii(t) some from 1...n
% prn - probabilities normalized

cpr=cumsum(prn);

n=length(prn);

% il=interp1([0 cpr'],1:psz,rand(1,npcr),'linear');
% ii=floor(il); % random numbers from 1:psz-1 according
probabilities

% make cpr - row-vector if neccessary:
sz=size(cpr);
if sz(1)>sz(2)
    cpr1=cpr';
else
    cpr1=cpr;
end

il=interp1([0 cpr1],1:(n+1),rand(1,m),'linear');
ii=floor(il); % random numbers from 1:n according probabilities
```

## Crossover code

```
function gch=insert_begining_slow(g1,g2,cp)
% insert begining from g2 (g2(1:cp)) to geging of g1 (g1(1:cp))
% return modified g1 in such way

for cpc=1:cp
    % swap:
    g1(1,cpc)=g2(1,cpc); % send to that place

end
gch=g1;
```