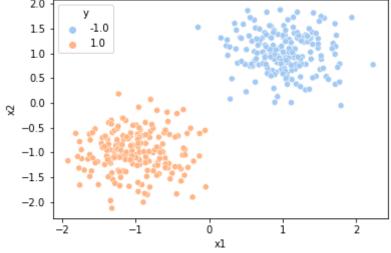
```
from google.colab import drive
import pandas as pd
import matplotlib.pyplot as plt
import numpy as np
import seaborn as sns
from sklearn.model_selection import train_test_split
import random
```

2 - Perceptron

- 2.1



- 2.2

```
perceptron train data, perceptron test data = train test split(perceptron raw data, r
print(perceptron_train_data.shape)
print(perceptron test data.shape)
    (300, 3)
    (100, 3)
class Neuron:
  def __init__(self, train_inputs, train_targets, test_inputs, test_targets, activati
    self.inputs num = train inputs.shape[0]
    self.train_records_num = train_inputs.shape[1]
    self.weights = [random.random() for i in range(train_inputs.shape[0])] if random_
    self.bias = random initial if random.random() else 0
    self.train inputs = train inputs
    self.train targets = train targets
    self.test_inputs = test_inputs
    self.test_targets = test_targets
    self.activation func = activation func
    self.weight_updating_func = weight_updating_func
    self.threshold = threshold
    self.learning rate = learning rate
    self.find_line_func = find_line_func
    self.cost func = cost func
    self.error_threshold = error_threshold
    self.check end_func = check_end_func
  def train(self, max epochs = 10):
    for epoch in range(0, max epochs):
      print('...<<< epoch %d started >>>...'%epoch)
      errors num = 0
      updates num = 0
      for record num in range(0, self.train records num):
        x = self.train inputs.T[record num]
       net = np.dot(x, self.weights) + self.bias
       h = self.activation_func(np.array([net]), self.threshold)[0]
       t = self.train targets[record num]
        e = self.cost func(t, h, net)
        # print('...<<< x1 = f, x2 = f, x2 = d, x2 = d, x3 = d, x4 = d, x4 = d
        self.weights, self.bias, update num = self.weight updating func(w=self.weight
        updates num += update num
        if e > self.error threshold:
          errors num += 1
      print('...<<< epoch %d ended with %d errors >>>...'%(epoch, errors num))
      if self.check_end_func(errors_num, updates_num) :
    print('...<< accuracy is: %d >>>...'%((1 - errors num/self.train records num)*10
    return self.weights, self.bias
  def test(self):
    nets = np.dot(self.test_inputs.T, self.weights) + self.bias
    outputs = self.activation func(nets, self.threshold)
```

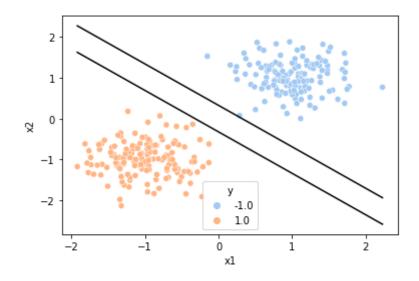
```
accuracy = len(outputs[outputs == self.test_targets]) / len(self.test_targets)
    return accuracy
  def show result(self, df):
    lines y = self.find line func(self.weights, self.train inputs, self.bias, self.th
    for y in lines y:
      sns.lineplot(x=self.train_inputs[0], y=y, color='black')
    sns.scatterplot(data=df, x='x1', y='x2', hue='y', palette='pastel')
  def reset(self, threshold, learning_rate=0.1):
    self.weights = np.zeros(self.train inputs.shape[0])
    self.bias = 0
    self.threshold = threshold
    self.learning rate = learning rate
  def madaline initial weights(self, adaline num, seed):
    np.random.seed(seed)
    self.weights = np.random.normal(size=(adaline num, self.train inputs.shape[0])).T
    self.bias = np.random.normal(size=adaline num)
def perceptron weight updating func(w, x, b, t, net, alpha, e):
  if e != 0:
    w += alpha * x * t
    b += alpha * t
  return w, b, 0
def perceptron activation func(net, threshold):
  h = np.zeros(net.shape[0])
  h[net > threshold] = 1
  h[net < -1*threshold] = -1
  return h
def perceptron_find_line_func(w, x, b, threshold):
  x = x[0]
  y1 = (threshold - b - w[0]*x)/w[1]
  y2 = (-1 *threshold - b - w[0]*x)/w[1]
  return [y1, y2]
def perceptron cost func(t, h, net):
  return abs(h - t)
def perceptron check end func(errors num, updates num):
  return errors num == 0
```

```
perceptron_train_targets = perceptron_train_data.values.T[2]
perceptron_test_inputs = perceptron_test_data.values.T[0:2]
perceptron_test_targets = perceptron_test_data.values.T[2]
perceptron neuron = Neuron(perceptron train inputs,
                           perceptron_train_targets,
                           perceptron_test_inputs,
                           perceptron_test_targets,
                           perceptron_activation_func,
                           perceptron_weight_updating_func,
                           perceptron_find_line_func,
                           perceptron_cost_func,
                           perceptron_check_end_func,
                           0.1,
                           0.1
                           )
```

perceptron weights, perceptron bias = perceptron neuron.train()

```
...<< epoch 0 started >>>...
...<< epoch 0 ended with 6 errors >>>...
...<< epoch 1 started >>>...
...<< epoch 1 ended with 0 errors >>>...
...<< accuracy is: 100 >>>...
```

perceptron_neuron.show_result(perceptron_train_data)

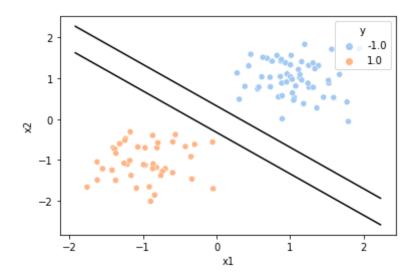


- 2.3

```
print('Test accuracy is: {}%'.format(perceptron_neuron.test() * 100))
```

Test accuracy is: 100.0%

perceptron_neuron.show_result(perceptron_test_data)

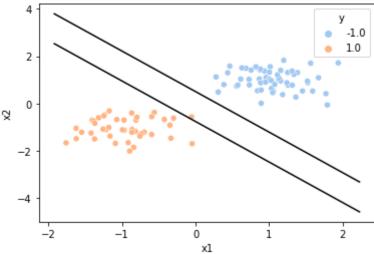


- 2.4

```
perceptron_neuron.reset(0)
perceptron neuron.train()
perceptron neuron.show result(perceptron test data)
print('Test accuracy is: {}%'.format(perceptron_neuron.test() * 100))
     ...<<< epoch 0 started >>>...
     ...<< epoch 0 ended with 2 errors >>>...
     ...<<< epoch 1 started >>>...
     ...<< epoch 1 ended with 0 errors >>>...
     ...<< accuracy is: 100 >>>...
    Test accuracy is: 100.0%
        2.0
        1.5
        1.0
        0.5
        0.0
                -1.0
       -0.5
       -1.0
       -1.5
       -2.0
            -2
                               0
                                        1
```

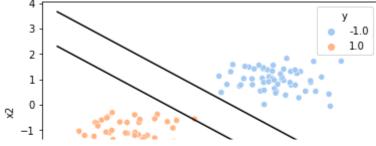
x1

```
perceptron_neuron.reset(0.5)
perceptron_neuron.train()
perceptron neuron.show result(perceptron test_data)
print('Test accuracy is: {}%'.format(perceptron_neuron.test() * 100))
     ...<<< epoch 0 started >>>...
     ...<< epoch 0 ended with 11 errors >>>...
     ...<< epoch 1 started >>>...
     ...<< epoch 1 ended with 3 errors >>>...
     ...<< epoch 2 started >>>...
     ...<< epoch 2 ended with 2 errors >>>...
     ...<< epoch 3 started >>>...
     ...<< epoch 3 ended with 2 errors >>>...
     ...<< epoch 4 started >>>...
     ...<< epoch 4 ended with 2 errors >>>...
     ...<< epoch 5 started >>>...
     ...<< epoch 5 ended with 2 errors >>>...
     ...<<< epoch 6 started >>>...
     ...<< epoch 6 ended with 2 errors >>>...
     ...<< epoch 7 started >>>...
     ...<< epoch 7 ended with 1 errors >>>...
     ...<< epoch 8 started >>>...
     ...<< epoch 8 ended with 2 errors >>>...
     ...<<< epoch 9 started >>>...
     ...<< epoch 9 ended with 2 errors >>>...
     ...<< accuracy is: 99 >>>...
    Test accuracy is: 99.0%
```



```
perceptron_neuron.reset(0.8)
perceptron_neuron.train()
perceptron_neuron.show_result(perceptron_test_data)
print('Test accuracy is: {}%'.format(perceptron neuron.test() * 100))
```

```
...<<< epoch 0 started >>>...
...<< epoch 0 ended with 16 errors >>>...
...<< epoch 1 started >>>...
...<< epoch 1 ended with 3 errors >>>...
...<< epoch 2 started >>>...
...<< epoch 2 ended with 4 errors >>>...
...<< epoch 3 started >>>...
...<< epoch 3 ended with 3 errors >>>...
...<< epoch 4 started >>>...
...<< epoch 4 ended with 2 errors >>>...
...<< epoch 5 started >>>...
...<< epoch 5 ended with 2 errors >>>...
...<< epoch 6 started >>>...
...<< epoch 6 ended with 2 errors >>>...
...<< epoch 7 started >>>...
...<< epoch 7 ended with 2 errors >>>...
...<< epoch 8 started >>>...
...<< epoch 8 ended with 2 errors >>>...
...<<< epoch 9 started >>>...
...<< epoch 9 ended with 2 errors >>>...
...<< accuracy is: 99 >>>...
Test accuracy is: 99.0%
   3
                                          -1.0
                                          1.0
   2
```



```
perceptron neuron.reset(0.8)
perceptron neuron.train(100)
perceptron neuron.show result(perceptron test data)
print('Test accuracy is: {}%'.format(perceptron neuron.test() * 100))
```

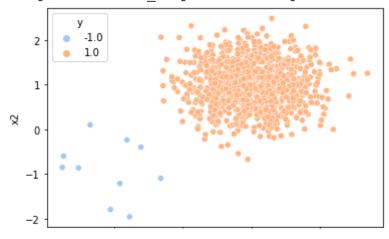
```
...<<< epoch 0 started >>>...
...<< epoch 0 ended with 16 errors >>>...
...<< epoch 1 started >>>...
...<< epoch 1 ended with 3 errors >>>...
...<< epoch 2 started >>>...
...<< epoch 2 ended with 4 errors >>>...
...<< epoch 3 started >>>...
...<< epoch 3 ended with 3 errors >>>...
...<< epoch 4 started >>>...
...<< epoch 4 ended with 2 errors >>>...
...<< epoch 5 started >>>...
...<< epoch 5 ended with 2 errors >>>...
...<< epoch 6 started >>>...
...<< epoch 6 ended with 2 errors >>>...
...<< epoch 7 started >>>...
...<< epoch 7 ended with 2 errors >>>...
...<< epoch 8 started >>>...
...<< epoch 8 ended with 2 errors >>>...
...<< epoch 9 started >>>...
...<< epoch 9 ended with 2 errors >>>...
...<<< epoch 10 started >>>...
...<< epoch 10 ended with 1 errors >>>...
...<<< epoch 11 started >>>...
...<< epoch 11 ended with 2 errors >>>...
...<< epoch 12 started >>>...
...<< epoch 12 ended with 2 errors >>>...
...<<< epoch 13 started >>>...
...<< epoch 13 ended with 2 errors >>>...
...<< epoch 14 started >>>...
...<< epoch 14 ended with 2 errors >>>...
```

3 - Adaline

- 3.2

```
adaline_raw_data1 = pd.DataFrame()
adaline1_class1 = np.array([np.random.normal(1, 0.5, 1000), np.random.normal(1, 0.5,
adaline1_class2 = np.array([np.random.normal(-1, 0.5, 10), np.random.normal(-1, 0.5,
adaline1 = np.concatenate((adaline1_class1, adaline1_class2),axis=1)
adaline1 = adaline1.T
np.random.shuffle(adaline1)
adaline_raw_data1['x1'] = adaline1.T[0]
adaline_raw_data1['x2'] = adaline1.T[1]
adaline_raw_data1['y'] = adaline1.T[2]
sns.scatterplot(data=adaline_raw_data1, x='x1', y='x2', hue='y', palette='pastel')
```

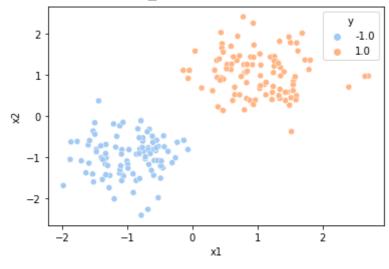
<matplotlib.axes._subplots.AxesSubplot at 0x7f84dc5a8850>



```
adaline_raw_data2 = pd.DataFrame()
adaline2_class1 = np.array([np.random.normal(1, 0.5, 100), np.random.normal(1, 0.5, 1
adaline2_class2 = np.array([np.random.normal(-1, 0.5, 100), np.random.normal(-1, 0.5,
adaline2 = np.concatenate((adaline2_class1, adaline2_class2),axis=1)
adaline2 = adaline2.T
np.random.shuffle(adaline2)
adaline_raw_data2['x1'] = adaline2.T[0]
adaline_raw_data2['x2'] = adaline2.T[1]
adaline_raw_data2['y'] = adaline2.T[2]
```

sns.scatterplot(data=adaline raw data2, x='x1', y='x2', hue='y', palette='pastel')

<matplotlib.axes._subplots.AxesSubplot at 0x7f84dca25150>



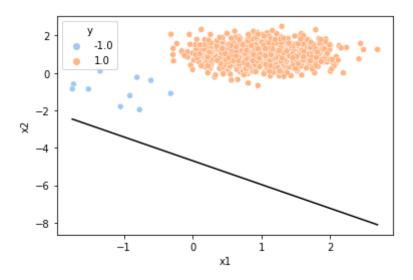
```
adaline1_train_inputs = adaline_raw_data1.values.T[0:2]
adaline1_train_targets = adaline_raw_data1.values.T[2]

def adaline_weight_updating_func(w, x, b, t, net, alpha, e):
    w += alpha * x * (t - net)
    b += alpha * (t - net)
    return w, b, 0
```

```
def adaline activation func(net, threshold=0):
  h = np.zeros(net.shape[0])
  h[net >= threshold] = 1
  h[net < -1*threshold] = -1
  return h
def adaline_cost_func(t, h, net):
  return 0.5 * (t - net)**2
def adaline_find_line_func(w, x, b, threshold=0):
  x = x[0]
  y = (threshold - b - w[0]*x)/w[1]
  return [y]
adaline1 neuron = Neuron(adaline1 train inputs,
                         adaline1_train_targets,
                         np.array([]),
                         np.array([]),
                         adaline activation func,
                         adaline weight updating func,
                         adaline find line func,
                         adaline cost func,
                         perceptron check end func,
                         threshold = 0,
                         learning rate = 0.1,
                         random initial = True,
                         error threshold = 0.2)
adaline1 neuron.train(10)
     ...<< epoch 0 started >>>...
    ...<< epoch 0 ended with 10 errors >>>...
    ...<<< epoch 1 started >>>...
     ...<< epoch 1 ended with 10 errors >>>...
    ...<< epoch 2 started >>>...
     ...<< epoch 2 ended with 10 errors >>>...
    ...<< epoch 3 started >>>...
     ...<< epoch 3 ended with 10 errors >>>...
     ...<< epoch 4 started >>>...
     ...<< epoch 4 ended with 10 errors >>>...
    ...<< epoch 5 started >>>...
    ...<< epoch 5 ended with 10 errors >>>...
     ...<< epoch 6 started >>>...
     ...<< epoch 6 ended with 10 errors >>>...
     ...<< epoch 7 started >>>...
     ...<< epoch 7 ended with 10 errors >>>...
    ...<< epoch 8 started >>>...
     ...<< epoch 8 ended with 10 errors >>>...
     ...<< epoch 9 started >>>...
     ...<< epoch 9 ended with 10 errors >>>...
```

```
...<< accuracy is: 99 >>>...
(array([0.17457022, 0.13751345]), 0.6454209477314058)
```

adaline1_neuron.show_result(adaline_raw_data1)



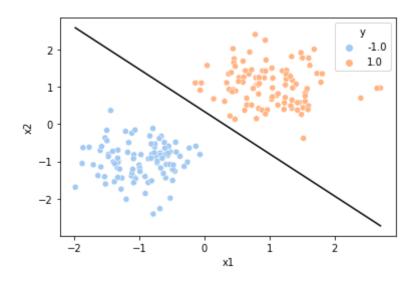
```
adaline2_train_inputs = adaline_raw_data2.values.T[0:2]
adaline2_train_targets = adaline_raw_data2.values.T[2]
```

adaline2_neuron.train(10)

```
...<<< epoch 0 started >>>...
...<< epoch 0 ended with 18 errors >>>...
...<<< epoch 1 started >>>...
...<<< epoch 1 ended with 14 errors >>>...
...<<< epoch 2 started >>>...
...<<< epoch 2 ended with 14 errors >>>...
...<<< epoch 3 started >>>...
...<<< epoch 3 ended with 14 errors >>>...
...<<< epoch 4 started >>>...
...<<< epoch 4 started >>>...
...
```

```
...<< epoch 5 started >>>...
...<< epoch 5 ended with 14 errors >>>...
...<< epoch 6 started >>>...
...<< epoch 6 ended with 14 errors >>>...
...<< epoch 7 started >>>...
...<< epoch 7 ended with 14 errors >>>...
...<< epoch 8 started >>>...
...<< epoch 8 ended with 14 errors >>>...
...<< epoch 8 ended with 14 errors >>>...
...<< epoch 9 started >>>...
...<< epoch 9 started >>>...
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```

adaline2_neuron.show_result(adaline_raw_data2)



4 - Madaline

```
Q4_FILE_PATH = '_/content/drive/MyDrive/University/nn/madaline.csv'
```

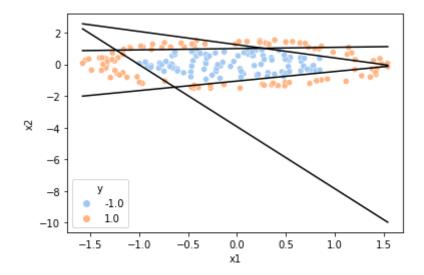
```
madaline_file_data = pd.read_csv(Q4_FILE_PATH, header= None)
madaline_file_data.iloc[:, 2].replace({0.0: -1.0}, inplace=True)
madaline_raw_data = pd.DataFrame()
madaline_raw_data['x1'] = madaline_file_data.values.T[0]
madaline_raw_data['x2'] = madaline_file_data.values.T[1]
madaline_raw_data['y'] = madaline_file_data.values.T[2]
sns.scatterplot(data=madaline_raw_data, x='x1', y='x2', hue='y', palette='pastel')
```

```
<matplotlib.axes. subplots.AxesSubplot at 0x7f84de7e8b50>
        1.5
        1.0
        0.5
       0.0
       -0.5
madaline_inputs = madaline_raw_data.values.T[0:2]
madaline targets = madaline raw data.values.T[2]
def madaline_weight_updating_func(w, x, b, t, net, alpha, e):
  updates num=0
  v = v \cdot T
  if e != 0:
    if t == 1:
      net values = abs(net)
      i = np.argmin(net_values)
      b[i] += alpha * (1 - net[i])
      w[i] += alpha * (1 - net[i]) * x
      updates num += 1
    elif t == -1:
      for i in range(len(net)):
        if 0 < net[i]:
          b[i] += alpha * (-1 - net[i])
          w[i] += alpha * (-1 - net[i]) * x
          updates num += 1
  return w.T, b, updates num
def madaline check end func(errors num, updates num, update threshold=0):
  print(updates num)
  return updates num <= update threshold
def madaline activation func(z in, threshold=0):
  z = np.zeros(z in.shape)
  z[z in >= threshold] = 1
  z[z in < -threshold] = -1
  adaline num = z in.shape[1]
  v = [1/adaline num] * adaline num
  b = (adaline num-1)/adaline num
  y_in = np.dot(z, v) + b
  y = np.zeros(y in.shape)
  y[y in >= threshold] = 1
  y[y_in < -threshold] = -1
  return y
```

```
def madaline_find_line_func(w, x, b, threshold=0):
  x = x[0]
  y = []
  for i in range(len(w.T)):
    y.append((threshold - b[i] - w.T[i][0]*x)/w.T[i][1])
  return y
madaline neuron = Neuron(madaline inputs,
                         madaline_targets,
                         np.array([]),
                         np.array([]),
                         madaline activation func,
                         madaline weight updating func,
                         madaline_find_line_func,
                         perceptron cost func,
                         madaline_check_end_func,
                         threshold = 0,
                         learning rate = 0.01,
                         random_initial = True,
                         error threshold = 0)
madaline neuron.madaline initial weights(4, 750)
madaline neuron.train(200)
    ...<< epoch 36 ended with 2 errors >>>...
    ...<< epoch 37 started >>>...
    ...<< epoch 37 ended with 2 errors >>>...
    ...<< epoch 38 started >>>...
    ...<< epoch 38 ended with 2 errors >>>...
    ...<< epoch 39 started >>>...
    ...<< epoch 39 ended with 2 errors >>>...
    ...<<< epoch 40 started >>>...
    ...<< epoch 40 ended with 2 errors >>>...
    ...<< epoch 41 started >>>...
    ...<< epoch 41 ended with 2 errors >>>...
     ...<<< epoch 42 started >>>...
    ...<< epoch 42 ended with 2 errors >>>...
    ...<< epoch 43 started >>>...
    ...<< epoch 43 ended with 2 errors >>>...
     ...<< epoch 44 started >>>...
    ...<< epoch 44 ended with 2 errors >>>...
     ...<< epoch 45 started >>>...
       /// anoth 15 anded with 2 arrord
```

```
...<< epoch 45 ended with 2 errors >>>...
...<< epoch 46 started >>>...
...<< epoch 46 ended with 2 errors >>>...
...<< epoch 47 started >>>...
...<< epoch 47 ended with 2 errors >>>...
...<< epoch 48 started >>>...
...<< epoch 48 ended with 2 errors >>>...
...<< epoch 49 started >>>...
...<< epoch 49 ended with 2 errors >>>...
...<<< epoch 50 started >>>...
...<< epoch 50 ended with 2 errors >>>...
...<<< epoch 51 started >>>...
...<< epoch 51 ended with 2 errors >>>...
...<<< epoch 52 started >>>...
...<< epoch 52 ended with 2 errors >>>...
...<< epoch 53 started >>>...
...<< epoch 53 ended with 1 errors >>>...
...<<< epoch 54 started >>>...
...<< epoch 54 ended with 0 errors >>>...
...<< accuracy is: 100 >>>...
(array([[-0.03840593, -0.61747228, 0.80415854, 0.06086794],
       [0.47748771, -0.15767558, 0.96178162, -0.10084294]]),
```

madaline neuron.show result(madaline raw data)



```
madaline_activation_func,
                         madaline_weight_updating_func,
                         madaline find line func,
                         perceptron cost func,
                         madaline_check_end_func,
                         threshold = 0,
                         learning rate = 0.01,
                         random initial = True,
                         error threshold = 0)
madaline_neuron2.madaline_initial_weights(6, 300)
madaline_neuron2.train(200)
    ...<<< epoch 0 started >>>...
     ...<< epoch 0 ended with 100 errors >>>...
    268
    ...<<< epoch 1 started >>>...
    ...<< epoch 1 ended with 79 errors >>>...
    ...<<< epoch 2 started >>>...
    ...<< epoch 2 ended with 37 errors >>>...
    ...<<< epoch 3 started >>>...
     ...<< epoch 3 ended with 11 errors >>>...
    ...<< epoch 4 started >>>...
    ...<< epoch 4 ended with 4 errors >>>...
     ...<< epoch 5 started >>>...
    ...<< epoch 5 ended with 3 errors >>>...
    ...<<< epoch 6 started >>>...
    ...<< epoch 6 ended with 2 errors >>>...
    ...<< epoch 7 started >>>...
     ...<< epoch 7 ended with 1 errors >>>...
    ...<< epoch 8 started >>>...
    ...<< epoch 8 ended with 0 errors >>>...
     ...<< accuracy is: 100 >>>...
    (array([[-0.804587 , -0.65769609, 0.49767052, -0.11787963, 0.07451846,
              0.89539627],
             [-0.19478471, -0.51189004, -0.48474087, 0.49603056, -0.32294803,
              0.66627156]]),
     array([-0.79072042, -0.72148779, -0.6081789 , -0.48801872, -0.70535877,
            -1.01856643]))
```

madaline neuron2.show result(madaline raw data)

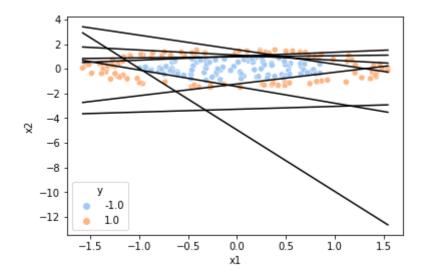
```
4 2 0 -2 -2 -4 -6 -8 -10 1.0 1.0
```

madaline neuron3.madaline initial weights(8, 300)

madaline_neuron3.train(200)

```
...<<< epoch 0 started >>>...
...<< epoch 0 ended with 100 errors >>>...
...<<< epoch 1 started >>>...
...<< epoch 1 ended with 76 errors >>>...
...<< epoch 2 started >>>...
...<< epoch 2 ended with 22 errors >>>...
30
...<< epoch 3 started >>>...
...<< epoch 3 ended with 9 errors >>>...
10
...<< epoch 4 started >>>...
...<< epoch 4 ended with 4 errors >>>...
...<< epoch 5 started >>>...
...<< epoch 5 ended with 2 errors >>>...
...<<< epoch 6 started >>>...
...<< epoch 6 ended with 1 errors >>>...
```

madaline neuron3.show result(madaline raw data)



✓ 0s completed at 12:40 AM