# **Redes Completamente Conectadas**

Uma instituição financeira possui uma base de dados com o histórico de crediário oferecido aos seus clientes. Baseado neste histórico, a instituição deseja criar um modelo de classificação para inferir se um novo cliente que submeteu uma requisição de empréstimo pagará ou não a dívida, caso o banco resolva realizar esse empréstimo. O conjunto de dados possui 1500 exemplos de créditos concedidos aos seus clientes. Esses registros estão contidos no arquivo **credtrain.txt**, que é fornecido juntamente com esse documento. Para cada cliente, são definidos 11 atributos (variáveis, características). Além disso, a última coluna de cada exemplo informa se o cliente honrou ou não o pagamento do empréstimo. Na Tabela abaixo, encontramos a descrição dos atributos.

Variável	Descrição	Tipo	Domínio		
ESCT	Estado civil	Categórica	0,1,2,3		
NDEP	Número de dependentes	Categórica	0,1,2,3,4,5,6,7		
RENDA	Renda familiar Numéric		300 - 9765		
TIPOR	Tipo de residência	Categórica	0,1		
VBEM	Valor do bem a ser adquirido	Numérica	300 - 600		
NPARC	Número de parcelas	Numérica	1 - 24		
VPARC	Valor da parcela	Numérica	50 - 719		
TEL	Se o cliente possui telefone	Categórica	0,1		
IDADE	Idade do cliente	Numérica	18 - 70		
RESMS	Tempo de moradia (meses)	Numérica	0 - 420		
ENTRADA	Valor da entrada	Numérica	0 - 1300		
CLASSE	=1 se o cliente pagou	Categórica	0,1		

Nesta parte, você deve criar um modelo de classificação, rede neural de múltiplas camadas com propagação do erro (error backpropagation). O objetivo desse modelo de classificação é predizer se um novo cliente pagaria ou não uma dívida contraída, tendo como base as características desse novo cliente. Esse modelo deve ser criado com o uso de funções e classes fornecidas pelo Keras.

# **Um Exemplo Introdutório**

Para servir de exemplo sobre o procedimento de criação de um  $Modelo\ de\ Classifica$ ção, é relevante que você realize os passos descritos nesta seção. O objetivo é que, ao fim desta seção, tenhamos uma visão geral do processo de criação de um modelo de classificação em um exemplo pequeno e possa aplicá-lo a um exemplo maior (i.e., o conjunto de dados de crédito bancário). A sequência de passos descrita nesta seção representa a **Criação**, **Treinamento** (Aprendizado) e **Teste** de uma  $Rede\ Neural\ Backpropagation$  com um conjunto de dados pequeno armazenado nas matrizes  $P\ e\ T$ . Após realizar esses passos, você deve aplicar o mesmo procedimento sobre o conjunto de dados de crédito (credtrain) fornecido neste trabalho, para finalmente obter o modelo de classificação.

#### In [163]:

```
import time
import keras
import itertools
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt

from keras.models import Sequential
from keras.layers.core import Dense

from sklearn import svm, datasets
from sklearn.metrics import accuracy_score
from sklearn.metrics import confusion_matrix
from sklearn.model_selection import train_test_split
```

### Declaração das Funcões utilizadas

#### In [164]:

```
def normalizaFeatures(X):
    Função que normaliza cada elemento, dado um vetor.
    mu = np.mean(X, axis=0)
    sigma = np.std(X, axis=0)
    X = np.subtract(X, mu)
    X = np.divide(X,sigma)
    return X
```

```
In [165]:

# Função trazida dos exemplos apresentados no sgikit learn
```

```
# Função trazida dos exemplos apresentados no scikit-learn
def plot confusion matrix(matriz, classes, normalize=False, title='Matriz Conf
usão'):
    This function prints and plots the confusion matrix.
    Normalization can be applied by setting `normalize=True`.
    cmap = plt.cm.Blues
    CWH = "white"
    BLK = "black"
    CT = "center"
    if normalize:
        matriz = matriz.astype('float') / matriz.sum(axis=1)[:, np.newaxis]
        print("Matriz Confusão Normalizada")
    else:
        print('Matriz Confusão')
    print(matriz)
    plt.imshow(matriz, interpolation='nearest', cmap=cmap)
    plt.title(title)
    plt.colorbar()
    tick marks = np.arange(len(classes))
    plt.xticks(tick marks, classes, rotation=45)
    plt.yticks(tick marks, classes)
    FORMAT = '.2f' if normalize else 'd'
    TRHSD = matriz.max() / 2.
   A = matriz.shape[0]
    B = matriz.shape[1]
    for i, j in itertools.product(range(A), range(B)):
        plt.text(j,i,format(matriz[i,j],FORMAT), horizontalalignment=CT, color
=CWH if matriz[i,j] > TRHSD else BLK)
    plt.tight layout()
    plt.ylabel('Verdadeiro')
    plt.xlabel('Predito')
```

### Procedimento de criação do Modelo de Classificação:

Defina a matriz de padrões. Note que os padrões são organizados em colunas. Por exemplo, a matriz de padrões abaixo contém cinco padrões de entrada (cada um com quatro características), e o primeiro padrão armazenado na matriz P abaixo é (0.4046, 0.9974, 0.3764, 0.6043).

```
0.3786
        0.7010
                  0.8608
                          0.5947
0.8479
         0.6201
                  0.4031
                           0.9653
0.9214
         0.9331
                  0.7514
                           0.6914
0.3494
         0.1438
                  0.6035
                           0.4111
```

```
In [3]:
```

#### In [4]:

```
print(P)
[[ 0.40459999
                0.99739999
                            0.37639999
                                         0.604300021
 [ 0.3786
                0.84789997
                            0.92140001
                                         0.349400011
 [ 0.70099998
               0.62010002
                            0.93309999
                                         0.14380001]
 [ 0.86080003
                0.40310001
                            0.75139999
                                         0.603500011
 [ 0.59469998
               0.96530002
                            0.69139999
                                         0.4111
                                                    ]]
```

Defina a matriz de alvos. Os valores dessa matriz de alvos são os que a rede deve aprender para cada padrão. Note que a quantidade de colunas na matriz de alvos deve ser sempre igual à quantidade de colunas da matriz de padrões T = [0 1 0 1 1].

 $[0 \ 1 \ 0 \ 1 \ 1]$ 

```
In [5]:
T = np.array([[0], [1], [0], [1]], "float32")
```

```
In [6]:
```

[ 1.]]

Crie uma rede neural artificial completamente conectada de uma única camada oculta, com 3 neurônios nessa camada oculta e 1 neurônio na camada de saída. Em ambas as camadas, a função de ativação deve ser a função sigmóide logística.

```
In [7]:
model = Sequential()
L1 = Dense(3, input_dim=4, activation='sigmoid')
model.add(L1)
L2 = Dense(1, activation='sigmoid')
model.add(L2)
```

#### Realize a configuração da rede recém-criada, conforme instruções a seguir:

- Quantidade de épocas igual a 100000;
- Função de perda;
- Soma dos erros quadrados;
- Método de otimização: Gradiente Descendente Estocástico.

```
In [8]:
model.compile(loss='mean_squared_error', optimizer='sgd', metrics=['binary_acc uracy'])
```

Treine a rede neural. Esse é o passo em que os pesos e os limiares da rede são ajustados. Esse passo deve ser realizado com a função fit da classe Model. Para chamar essa função, devemos passar a rede, a matriz de padrões e a matriz de alvos.

Nessa etapa vamos Treinar a rede após os passos descritos acima (item 3 e item 4), representando as etapas de **Configuração** e **Treinamento** da *Rede Neural* 

```
In [9]:
```

```
t1 = time.process_time()
history = model.fit(P, T, epochs=100000, verbose=1)
t2 = time.process_time()
```

```
In [21]:
print("\n ######## Tempo de Treinamento da Rede Totalmente Conectada #######
###\n")
print ("\n\t ---- Computation time = " + str(t2 - t1) + "s ----")
\n")
######## Tempo de Treinamento da Rede Totalmente Conectada ####
######
       Epoca com Acurácia 60%: 1
                                         Custo: 0.2481
       Epoca com Acurácia 80%: 71337
                                         Custo: 0.1915
       Epoca com Acurácia 100%: 84996
                                         Custo: 0.1495
       Epoca com Acurácia 100%: 99984
                                         Custo: 0.0839
       ---- Computation time = 184.40195599999998s -----
```

6) Gere gráficos para visualizar o histórico de treinamento. Em particular, gere curvas da precisão e da função de custo contra a quantidade de épocas de treinamento.

#### Gráfico agrupado com as Curvas de Treinamento: binary\_accuracy e loss

```
In [11]:
# Obtendo as métricas para exibir o Gráfico
metrics = history.history
metrics.keys()
```

```
Out[11]:
dict_keys(['loss', 'binary_accuracy'])
```

```
In [12]:
```

```
plt.figure(figsize=(14,7))
plt.plot(metrics['binary_accuracy'])
plt.plot(metrics['loss'])
plt.title('Curvas de Treinamento')
plt.ylabel('accuracy')
plt.xlabel('epoch')
plt.legend(['Precisão', 'Função de Custo'], loc='upper left')
plt.show();
```



## Criação de Modelo de Predição de Crédito

Após realizar os passos descritos acima, você deve ter condições de repetí-los para o conjunto de dados de créditos (credtrain). Uma vez treinada, essa rede poderá inferir se um novo cliente irá ou não honrar um eventual empréstimo.

Inicialmente, você deve carregar o arquivo **credtrain.txt**. Uma vez que os dados estão carregados, você deve criar duas matrizes. A primeira matriz deve ter ordem  $1500\,x\,11$  e deve conter os padrões de entrada (valores das variáveis **ESTC, NDEP, RENDA, TIPOR, VBEM, NPARC, VPARC, TEL, IDADE, RESMS e ENTRADA**). A outra matriz deve ter ordem  $1500\,x\,1$  e deve conter os valores do atributo **CLASSE**. Vamos chamar essas duas matrizes de P e T, respectivamente. A matriz P é chamada a matriz de treinamento. Já a matriz P é chamada a matriz de alvo. Diferente do exemplo introdutório, um cuidado adicional que você deve ter é com relação à normalização dos dados de entrada da rede, posto que algumas variáveis possuem ordens de grandeza diferentes.

### Modelo de Classificação TREINAMENTO

```
In [168]:
```

```
dataTrain = pd.read_csv("am-T3-dados/credtrain.txt", sep='\t',header=None)
dataTrain.head()
```

Out[168]:

	0	1	2	3	4	5	6	7	8	9	10	11
0	1	0	360	0	313	9	52	0	25	48	0	1
1	0	0	350	1	468	10	65	0	33	6	0	1
2	0	0	1100	0	829	9	125	0	56	48	0	1
3	0	0	3000	0	552	12	76	1	31	60	0	1
4	1	0	1000	0	809	12	111	0	24	7	0	1

P = dataTrain.iloc[:,:11].as matrix()

Train = dataTrain.iloc[:, 11:].as matrix()

#### Criando as matrizes P e T

```
In [169]:
```

```
P.shape , Train.shape
Out[169]:
((1500, 11), (1500, 1))
In [170]:
PTrain = normalizaFeatures(P)
```

```
Out[170]:
```

PTrain

# Construção da Rede Neural feed-forward with Neurons = 3 and Activation = sigmoid

```
In [171]:

model = Sequential()
L1 = Dense(3, input_dim=11, activation='sigmoid')
model.add(L1)
L2 = Dense(1, activation='sigmoid')
model.add(L2)
```

#### Configuração da Rede Neural feed - forward with Epochs = 2000

Epoch 13/2000

```
In [172]:
t1 = time.process time()
model.compile(loss='mean squared error', optimizer='sgd', metrics=['binary acc
uracy'])
history = model.fit(PTrain, Train, epochs=2000, verbose=1)
t2 = time.process time()
Epoch 1/2000
inary accuracy: 0.4587
Epoch 2/2000
1500/1500 [=============== ] - 0s - loss: 0.2604 - b
inary accuracy: 0.4647
Epoch 3/2000
inary accuracy: 0.4773
Epoch 4/2000
inary accuracy: 0.4893
Epoch 5/2000
inary accuracy: 0.5040
Epoch 6/2000
inary accuracy: 0.5127
Epoch 7/2000
inary accuracy: 0.5207
Epoch 8/2000
1500/1500 [=============== ] - 0s - loss: 0.2501 - b
inary accuracy: 0.5320
Epoch 9/2000
1500/1500 [==============] - 0s - loss: 0.2486 - b
inary accuracy: 0.5393
Epoch 10/2000
inary accuracy: 0.5460
Epoch 11/2000
inary accuracy: 0.5467
Epoch 12/2000
1500/1500 [==============] - 0s - loss: 0.2442 - b
inary accuracy: 0.5533
```

```
inary_accuracy: 0.5587
Epoch 14/2000
1500/1500 [============== ] - 0s - loss: 0.2414 - b
inary accuracy: 0.5687
Epoch 15/2000
inary_accuracy: 0.5780
Epoch 16/2000
1500/1500 [============== ] - 0s - loss: 0.2387 - b
inary_accuracy: 0.5920
Epoch 17/2000
1500/1500 [==============] - 0s - loss: 0.2374 - b
inary accuracy: 0.6027
Epoch 18/2000
inary accuracy: 0.6107
Epoch 19/2000
1500/1500 [============== ] - 0s - loss: 0.2347 - b
inary_accuracy: 0.6200
Epoch 20/2000
inary_accuracy: 0.6280
Epoch 21/2000
inary_accuracy: 0.6340
Epoch 22/2000
1500/1500 [============== ] - 0s - loss: 0.2309 - b
inary_accuracy: 0.6433
Epoch 23/2000
inary_accuracy: 0.6500
Epoch 24/2000
inary_accuracy: 0.6560
Epoch 25/2000
inary_accuracy: 0.6640
Epoch 26/2000
inary accuracy: 0.6727
Epoch 27/2000
inary accuracy: 0.6800
Epoch 28/2000
inary_accuracy: 0.6880
Epoch 29/2000
inary accuracy: 0.6967
Epoch 30/2000
inary accuracy: 0.7053
Epoch 31/2000
inary_accuracy: 0.7147
Epoch 32/2000
```

```
inary_accuracy: 0.7220
Epoch 33/2000
1500/1500 [============== ] - 0s - loss: 0.2169 - b
inary accuracy: 0.7287
Epoch 34/2000
inary_accuracy: 0.7340
Epoch 35/2000
inary_accuracy: 0.7407
Epoch 36/2000
inary accuracy: 0.7467
Epoch 37/2000
inary_accuracy: 0.7573
Epoch 38/2000
1500/1500 [============== ] - 0s - loss: 0.2107 - b
inary_accuracy: 0.7633
Epoch 39/2000
inary accuracy: 0.7707
Epoch 40/2000
inary_accuracy: 0.7747
Epoch 41/2000
1500/1500 [=============== ] - 0s - loss: 0.2069 - b
acy: 0.775
Epoch 42/2000
1500/1500 [==============] - 0s - loss: 0.2057 - b
inary_accuracy: 0.7827
Epoch 43/2000
inary accuracy: 0.7867
Epoch 44/2000
inary accuracy: 0.7880
Epoch 45/2000
inary accuracy: 0.7880
Epoch 46/2000
inary accuracy: 0.7920
Epoch 47/2000
1500/1500 [=============== ] - 0s - loss: 0.1996 - b
inary accuracy: 0.7967
Epoch 48/2000
inary_accuracy: 0.7987
Epoch 49/2000
inary accuracy: 0.8033
Epoch 50/2000
1500/1500 [==============] - 0s - loss: 0.1960 - b
inary_accuracy: 0.8073
```

```
Epoch 51/2000
inary accuracy: 0.8100
Epoch 52/2000
inary accuracy: 0.8127
Epoch 53/2000
1500/1500 [=============== ] - 0s - loss: 0.1924 - b
inary accuracy: 0.8167
Epoch 54/2000
inary accuracy: 0.8180
Epoch 55/2000
inary accuracy: 0.8200
Epoch 56/2000
inary accuracy: 0.8213
Epoch 57/2000
1500/1500 [=============== ] - 0s - loss: 0.1878 - b
inary accuracy: 0.8240 - ETA: 0s - loss: 0.1882 - binary accur
acy: 0.822
Epoch 58/2000
inary accuracy: 0.8253
Epoch 59/2000
1500/1500 [=============== ] - 0s - loss: 0.1855 - b
inary accuracy: 0.8260
Epoch 60/2000
inary accuracy: 0.8280
Epoch 61/2000
inary accuracy: 0.8293
Epoch 62/2000
1500/1500 [=============== ] - 0s - loss: 0.1821 - b
inary accuracy: 0.8320
Epoch 63/2000
inary_accuracy: 0.8327
Epoch 64/2000
inary_accuracy: 0.8340
Epoch 65/2000
inary_accuracy: 0.8373
Epoch 66/2000
inary accuracy: 0.8380
Epoch 67/2000
inary_accuracy: 0.8400
Epoch 68/2000
inary accuracy: 0.8407
Epoch 69/2000
```

```
inary accuracy: 0.8440
Epoch 70/2000
inary accuracy: 0.8440
Epoch 71/2000
1500/1500 [=============== ] - 0s - loss: 0.1725 - b
inary accuracy: 0.8460
Epoch 72/2000
inary accuracy: 0.8460
Epoch 73/2000
inary accuracy: 0.8480
Epoch 74/2000
inary accuracy: 0.8487
Epoch 75/2000
inary accuracy: 0.8493
Epoch 76/2000
1500/1500 [=============== ] - 0s - loss: 0.1675 - b
inary accuracy: 0.8487
Epoch 77/2000
inary accuracy: 0.8513
Epoch 78/2000
1500/1500 [=============== ] - 0s - loss: 0.1656 - b
inary_accuracy: 0.8520
Epoch 79/2000
inary accuracy: 0.8527
Epoch 80/2000
inary accuracy: 0.8547
Epoch 81/2000
inary_accuracy: 0.8553
Epoch 82/2000
inary_accuracy: 0.8567
Epoch 83/2000
inary_accuracy: 0.8573
Epoch 84/2000
1500/1500 [=============== ] - 0s - loss: 0.1601 - b
inary_accuracy: 0.8580
Epoch 85/2000
inary accuracy: 0.8593
Epoch 86/2000
inary_accuracy: 0.8600
Epoch 87/2000
inary accuracy: 0.8607
Epoch 88/2000
```

```
inary accuracy: 0.8607
Epoch 89/2000
inary accuracy: 0.8607
Epoch 90/2000
inary accuracy: 0.8613
Epoch 91/2000
inary accuracy: 0.8613
Epoch 92/2000
1500/1500 [============== ] - 0s - loss: 0.1533 - b
inary accuracy: 0.8620
Epoch 93/2000
1500/1500 [==============] - 0s - loss: 0.1525 - b
inary accuracy: 0.8627
Epoch 94/2000
inary accuracy: 0.8633
Epoch 95/2000
inary_accuracy: 0.8640
Epoch 96/2000
inary accuracy: 0.8647
Epoch 97/2000
inary accuracy: 0.8653
Epoch 98/2000
inary accuracy: 0.8660
Epoch 99/2000
inary accuracy: 0.8673
Epoch 100/2000
inary accuracy: 0.8667
Epoch 101/2000
inary accuracy: 0.8680
Epoch 102/2000
inary_accuracy: 0.8687
Epoch 103/2000
inary_accuracy: 0.8693
Epoch 104/2000
inary accuracy: 0.8713
Epoch 105/2000
inary_accuracy: 0.8720
Epoch 106/2000
1500/1500 [=============== ] - 0s - loss: 0.1430 - b
inary accuracy: 0.8727
Epoch 107/2000
```

```
inary accuracy: 0.8727
Epoch 108/2000
inary accuracy: 0.8733
Epoch 109/2000
inary_accuracy: 0.8740
Epoch 110/2000
inary accuracy: 0.8740
Epoch 111/2000
inary accuracy: 0.8740
Epoch 112/2000
inary accuracy: 0.8740
Epoch 113/2000
inary accuracy: 0.8747
Epoch 114/2000
inary accuracy: 0.8747
Epoch 115/2000
inary accuracy: 0.8747
Epoch 116/2000
1500/1500 [=============== ] - 0s - loss: 0.1367 - b
inary accuracy: 0.8747
Epoch 117/2000
inary accuracy: 0.8747
Epoch 118/2000
inary accuracy: 0.8747
Epoch 119/2000
inary accuracy: 0.8740
Epoch 120/2000
inary accuracy: 0.8753
Epoch 121/2000
inary_accuracy: 0.8753
Epoch 122/2000
inary_accuracy: 0.8760
Epoch 123/2000
inary accuracy: 0.8760
Epoch 124/2000
1500/1500 [=============== ] - 0s - loss: 0.1322 - b
inary_accuracy: 0.8767
Epoch 125/2000
inary accuracy: 0.8760
Epoch 126/2000
```

```
inary accuracy: 0.8767
Epoch 127/2000
inary accuracy: 0.8773
Epoch 128/2000
inary accuracy: 0.8773
Epoch 129/2000
inary_accuracy: 0.8773
Epoch 130/2000
inary accuracy: 0.8773
Epoch 131/2000
inary accuracy: 0.8773
Epoch 132/2000
inary accuracy: 0.8767
Epoch 133/2000
inary_accuracy: 0.8767
Epoch 134/2000
inary accuracy: 0.8773
Epoch 135/2000
inary accuracy: 0.8780
Epoch 136/2000
inary accuracy: 0.8787
Epoch 137/2000
inary_accuracy: 0.8780
Epoch 138/2000
inary accuracy: 0.8780
Epoch 139/2000
inary_accuracy: 0.8787
Epoch 140/2000
1500/1500 [=============== ] - 0s - loss: 0.1246 - b
inary_accuracy: 0.8787
Epoch 141/2000
1500/1500 [=============== ] - 0s - loss: 0.1242 - b
inary_accuracy: 0.8793
Epoch 142/2000
inary accuracy: 0.8793
Epoch 143/2000
inary_accuracy: 0.8793
Epoch 144/2000
1500/1500 [=============== ] - 0s - loss: 0.1230 - b
inary accuracy: 0.8800
Epoch 145/2000
```

```
inary accuracy: 0.8800
Epoch 146/2000
inary accuracy: 0.8807
Epoch 147/2000
inary accuracy: 0.8807
Epoch 148/2000
inary accuracy: 0.8807
Epoch 149/2000
inary accuracy: 0.8807
Epoch 150/2000
inary accuracy: 0.8807
Epoch 151/2000
inary accuracy: 0.8813
Epoch 152/2000
1500/1500 [=============== ] - 0s - loss: 0.1199 - b
inary accuracy: 0.8820
Epoch 153/2000
inary accuracy: 0.8820
Epoch 154/2000
1500/1500 [=============== ] - 0s - loss: 0.1192 - b
inary accuracy: 0.8820
Epoch 155/2000
1500/1500 [=============== ] - 0s - loss: 0.1189 - b
inary accuracy: 0.8820
Epoch 156/2000
inary_accuracy: 0.8820
Epoch 157/2000
inary accuracy: 0.8820
Epoch 158/2000
inary_accuracy: 0.8820
Epoch 159/2000
inary_accuracy: 0.8813
Epoch 160/2000
inary_accuracy: 0.8813
Epoch 161/2000
inary accuracy: 0.8813
Epoch 162/2000
1500/1500 [=============== ] - 0s - loss: 0.1165 - b
inary_accuracy: 0.8813
Epoch 163/2000
inary accuracy: 0.8813
Epoch 164/2000
```

```
inary accuracy: 0.8813
Epoch 165/2000
inary accuracy: 0.8820
Epoch 166/2000
1500/1500 [=============== ] - 0s - loss: 0.1153 - b
inary accuracy: 0.8827
Epoch 167/2000
inary_accuracy: 0.8833
Epoch 168/2000
inary accuracy: 0.8847
Epoch 169/2000
inary accuracy: 0.8847
Epoch 170/2000
inary accuracy: 0.8853
Epoch 171/2000
inary accuracy: 0.8847
Epoch 172/2000
inary accuracy: 0.8867
Epoch 173/2000
inary accuracy: 0.8867
Epoch 174/2000
inary accuracy: 0.8873
Epoch 175/2000
inary_accuracy: 0.8873
Epoch 176/2000
1500/1500 [=============== ] - 0s - loss: 0.1125 - b
inary accuracy: 0.8873
Epoch 177/2000
inary_accuracy: 0.8873
Epoch 178/2000
inary_accuracy: 0.8873
Epoch 179/2000
inary_accuracy: 0.8873
Epoch 180/2000
inary accuracy: 0.8867
Epoch 181/2000
1500/1500 [=============== ] - 0s - loss: 0.1112 - b
inary_accuracy: 0.8867
Epoch 182/2000
inary accuracy: 0.8873
Epoch 183/2000
```

```
inary accuracy: 0.8867
Epoch 184/2000
inary accuracy: 0.8873
Epoch 185/2000
1500/1500 [=============== ] - 0s - loss: 0.1103 - b
inary accuracy: 0.8867
Epoch 186/2000
inary_accuracy: 0.8873
Epoch 187/2000
inary accuracy: 0.8873
Epoch 188/2000
inary accuracy: 0.8873
Epoch 189/2000
1500/1500 [=============== ] - 0s - loss: 0.1094 - b
inary accuracy: 0.8873
Epoch 190/2000
inary accuracy: 0.8873
Epoch 191/2000
inary accuracy: 0.8867
Epoch 192/2000
inary accuracy: 0.8867
Epoch 193/2000
inary accuracy: 0.8873
Epoch 194/2000
inary_accuracy: 0.8873
Epoch 195/2000
inary accuracy: 0.8873
Epoch 196/2000
inary_accuracy: 0.8880
Epoch 197/2000
inary_accuracy: 0.8873
Epoch 198/2000
inary_accuracy: 0.8880
Epoch 199/2000
inary accuracy: 0.8880
Epoch 200/2000
1500/1500 [=============== ] - 0s - loss: 0.1071 - b
inary_accuracy: 0.8880
Epoch 201/2000
inary accuracy: 0.8880
Epoch 202/2000
```

```
inary accuracy: 0.8880
Epoch 203/2000
inary accuracy: 0.8887
Epoch 204/2000
inary accuracy: 0.8887
Epoch 205/2000
inary_accuracy: 0.8887
Epoch 206/2000
inary accuracy: 0.8887
Epoch 207/2000
1500/1500 [==============] - 0s - loss: 0.1058 - b
inary accuracy: 0.8887
Epoch 208/2000
inary accuracy: 0.8887
Epoch 209/2000
inary accuracy: 0.8887
Epoch 210/2000
inary accuracy: 0.8887
Epoch 211/2000
inary accuracy: 0.8887
Epoch 212/2000
inary accuracy: 0.8887
Epoch 213/2000
inary_accuracy: 0.8887
Epoch 214/2000
inary accuracy: 0.8887
Epoch 215/2000
inary_accuracy: 0.8887
Epoch 216/2000
inary_accuracy: 0.8887
Epoch 217/2000
inary_accuracy: 0.8887
Epoch 218/2000
inary accuracy: 0.8887
Epoch 219/2000
inary_accuracy: 0.8887
Epoch 220/2000
inary accuracy: 0.8880
Epoch 221/2000
```

```
inary accuracy: 0.8887
Epoch 222/2000
inary accuracy: 0.8880
Epoch 223/2000
inary accuracy: 0.8880
Epoch 224/2000
inary_accuracy: 0.8873
Epoch 225/2000
inary accuracy: 0.8880
Epoch 226/2000
1500/1500 [==============] - 0s - loss: 0.1027 - b
inary accuracy: 0.8880
Epoch 227/2000
1500/1500 [=============== ] - 0s - loss: 0.1026 - b
inary accuracy: 0.8880
Epoch 228/2000
inary accuracy: 0.8887
Epoch 229/2000
inary accuracy: 0.8887
Epoch 230/2000
1500/1500 [=============== ] - 0s - loss: 0.1021 - b
inary accuracy: 0.8887
Epoch 231/2000
inary accuracy: 0.8887
Epoch 232/2000
inary_accuracy: 0.8887
Epoch 233/2000
inary accuracy: 0.8887
Epoch 234/2000
inary_accuracy: 0.8887
Epoch 235/2000
inary_accuracy: 0.8887
Epoch 236/2000
inary_accuracy: 0.8887
Epoch 237/2000
inary accuracy: 0.8887
Epoch 238/2000
inary_accuracy: 0.8887
Epoch 239/2000
inary accuracy: 0.8887
Epoch 240/2000
```

```
inary accuracy: 0.8887
Epoch 241/2000
inary accuracy: 0.8887
Epoch 242/2000
1500/1500 [=============== ] - 0s - loss: 0.1006 - b
inary accuracy: 0.8887
Epoch 243/2000
inary_accuracy: 0.8887
Epoch 244/2000
inary accuracy: 0.8900
Epoch 245/2000
inary accuracy: 0.8893
Epoch 246/2000
inary accuracy: 0.8900
Epoch 247/2000
inary_accuracy: 0.8900
Epoch 248/2000
inary accuracy: 0.8907
Epoch 249/2000
inary accuracy: 0.8907
Epoch 250/2000
inary accuracy: 0.8907
Epoch 251/2000
inary_accuracy: 0.8900
Epoch 252/2000
1500/1500 [=============== ] - 0s - loss: 0.0995 - b
inary accuracy: 0.8900
Epoch 253/2000
inary_accuracy: 0.8907
Epoch 254/2000
inary_accuracy: 0.8900
Epoch 255/2000
inary_accuracy: 0.8900
Epoch 256/2000
inary accuracy: 0.8900
Epoch 257/2000
1500/1500 [=============== ] - 0s - loss: 0.0989 - b
inary_accuracy: 0.8907
Epoch 258/2000
inary accuracy: 0.8913
Epoch 259/2000
```

```
inary accuracy: 0.8913
Epoch 260/2000
inary accuracy: 0.8920
Epoch 261/2000
inary accuracy: 0.8920
Epoch 262/2000
inary_accuracy: 0.8920
Epoch 263/2000
inary accuracy: 0.8920
Epoch 264/2000
1500/1500 [==============] - 0s - loss: 0.0982 - b
inary accuracy: 0.8920
Epoch 265/2000
inary accuracy: 0.8920
Epoch 266/2000
inary_accuracy: 0.8920
Epoch 267/2000
inary accuracy: 0.8920
Epoch 268/2000
inary accuracy: 0.8920
Epoch 269/2000
inary accuracy: 0.8920
Epoch 270/2000
inary_accuracy: 0.8920
Epoch 271/2000
inary accuracy: 0.8920
Epoch 272/2000
inary_accuracy: 0.8920
Epoch 273/2000
inary_accuracy: 0.8920
Epoch 274/2000
inary_accuracy: 0.8920
Epoch 275/2000
inary accuracy: 0.8920
Epoch 276/2000
1500/1500 [=============== ] - 0s - loss: 0.0971 - b
inary_accuracy: 0.8920
Epoch 277/2000
inary accuracy: 0.8920
Epoch 278/2000
```

```
inary accuracy: 0.8920
Epoch 279/2000
inary accuracy: 0.8920
Epoch 280/2000
1500/1500 [=============== ] - 0s - loss: 0.0968 - b
inary accuracy: 0.8920
Epoch 281/2000
inary_accuracy: 0.8920
Epoch 282/2000
inary accuracy: 0.8920
Epoch 283/2000
inary accuracy: 0.8927
Epoch 284/2000
inary accuracy: 0.8927
Epoch 285/2000
inary_accuracy: 0.8927
Epoch 286/2000
inary accuracy: 0.8927
Epoch 287/2000
inary accuracy: 0.8927
Epoch 288/2000
inary accuracy: 0.8927
Epoch 289/2000
inary_accuracy: 0.8927
Epoch 290/2000
inary_accuracy: 0.8927
Epoch 291/2000
inary_accuracy: 0.8927
Epoch 292/2000
inary_accuracy: 0.8927
Epoch 293/2000
inary_accuracy: 0.8927
Epoch 294/2000
inary accuracy: 0.8927
Epoch 295/2000
inary_accuracy: 0.8927
Epoch 296/2000
inary accuracy: 0.8927
Epoch 297/2000
```

```
inary accuracy: 0.8927
Epoch 298/2000
inary accuracy: 0.8927
Epoch 299/2000
inary accuracy: 0.8927
Epoch 300/2000
inary_accuracy: 0.8927
Epoch 301/2000
inary accuracy: 0.8927
Epoch 302/2000
1500/1500 [==============] - 0s - loss: 0.0951 - b
inary accuracy: 0.8927
Epoch 303/2000
inary accuracy: 0.8933
Epoch 304/2000
inary accuracy: 0.8933
Epoch 305/2000
inary accuracy: 0.8933
Epoch 306/2000
1500/1500 [=============== ] - 0s - loss: 0.0949 - b
inary accuracy: 0.8940
Epoch 307/2000
inary accuracy: 0.8940
Epoch 308/2000
inary accuracy: 0.8940
Epoch 309/2000
inary accuracy: 0.8947
Epoch 310/2000
inary accuracy: 0.8940
Epoch 311/2000
inary_accuracy: 0.8947
Epoch 312/2000
inary_accuracy: 0.8947
Epoch 313/2000
inary_accuracy: 0.8947
Epoch 314/2000
1500/1500 [=============== ] - 0s - loss: 0.0944 - b
inary_accuracy: 0.8947
Epoch 315/2000
inary_accuracy: 0.8947
Epoch 316/2000
```

```
inary accuracy: 0.8947
Epoch 317/2000
inary accuracy: 0.8947
Epoch 318/2000
inary accuracy: 0.8947
Epoch 319/2000
inary_accuracy: 0.8947
Epoch 320/2000
inary accuracy: 0.8947
Epoch 321/2000
1500/1500 [==============] - 0s - loss: 0.0940 - b
inary accuracy: 0.8947
Epoch 322/2000
1500/1500 [=============== ] - 0s - loss: 0.0939 - b
inary accuracy: 0.8947
Epoch 323/2000
inary accuracy: 0.8947
Epoch 324/2000
inary accuracy: 0.8953
Epoch 325/2000
inary accuracy: 0.8953
Epoch 326/2000
inary accuracy: 0.8953
Epoch 327/2000
inary_accuracy: 0.8953
Epoch 328/2000
1500/1500 [=============== ] - 0s - loss: 0.0936 - b
inary accuracy: 0.8953
Epoch 329/2000
inary_accuracy: 0.8953
Epoch 330/2000
inary_accuracy: 0.8953
Epoch 331/2000
inary_accuracy: 0.8953
Epoch 332/2000
inary accuracy: 0.8953
Epoch 333/2000
inary_accuracy: 0.8953
Epoch 334/2000
inary accuracy: 0.8953
Epoch 335/2000
```

```
inary accuracy: 0.8953
Epoch 336/2000
inary accuracy: 0.8953
Epoch 337/2000
inary accuracy: 0.8953
Epoch 338/2000
inary_accuracy: 0.8953
Epoch 339/2000
inary accuracy: 0.8960
Epoch 340/2000
1500/1500 [==============] - 0s - loss: 0.0929 - b
inary accuracy: 0.8960
Epoch 341/2000
inary accuracy: 0.8960
Epoch 342/2000
inary_accuracy: 0.8960
Epoch 343/2000
inary accuracy: 0.8967
Epoch 344/2000
inary accuracy: 0.8967
Epoch 345/2000
inary accuracy: 0.8967
Epoch 346/2000
inary_accuracy: 0.8967
Epoch 347/2000
inary accuracy: 0.8967
Epoch 348/2000
inary_accuracy: 0.8967
Epoch 349/2000
inary_accuracy: 0.8967
Epoch 350/2000
inary_accuracy: 0.8967
Epoch 351/2000
inary accuracy: 0.8967
Epoch 352/2000
inary_accuracy: 0.8967
Epoch 353/2000
inary accuracy: 0.8967
Epoch 354/2000
```

```
inary accuracy: 0.8967
Epoch 355/2000
1500/1500 [============== ] - 0s - loss: 0.0922 - b
inary accuracy: 0.8967
Epoch 356/2000
1500/1500 [============== ] - 0s - loss: 0.0922 - b
inary accuracy: 0.8967
Epoch 357/2000
inary_accuracy: 0.8967
Epoch 358/2000
inary accuracy: 0.8967
Epoch 359/2000
1500/1500 [==============] - 0s - loss: 0.0921 - b
inary accuracy: 0.8967
Epoch 360/2000
1500/1500 [=============== ] - 0s - loss: 0.0920 - b
inary accuracy: 0.8967
Epoch 361/2000
1500/1500 [=============== ] - 0s - loss: 0.0920 - b
inary_accuracy: 0.8967
Epoch 362/2000
inary accuracy: 0.8967
Epoch 363/2000
inary accuracy: 0.8967
Epoch 364/2000
inary accuracy: 0.8967
Epoch 365/2000
inary accuracy: 0.8967
Epoch 366/2000
1500/1500 [=============== ] - 0s - loss: 0.0918 - b
inary_accuracy: 0.8967
Epoch 367/2000
inary_accuracy: 0.8967
Epoch 368/2000
inary_accuracy: 0.8967
Epoch 369/2000
inary_accuracy: 0.8967
Epoch 370/2000
inary accuracy: 0.8967
Epoch 371/2000
inary_accuracy: 0.8960
Epoch 372/2000
inary accuracy: 0.8960
Epoch 373/2000
```

```
inary accuracy: 0.8960
Epoch 374/2000
1500/1500 [=============== ] - 0s - loss: 0.0915 - b
inary accuracy: 0.8967
Epoch 375/2000
inary accuracy: 0.8960
Epoch 376/2000
inary accuracy: 0.8967
Epoch 377/2000
inary accuracy: 0.8960
Epoch 378/2000
inary accuracy: 0.8960
Epoch 379/2000
inary accuracy: 0.8960
Epoch 380/2000
inary_accuracy: 0.8960
Epoch 381/2000
inary accuracy: 0.8960
Epoch 382/2000
inary accuracy: 0.8967
Epoch 383/2000
inary accuracy: 0.8960
Epoch 384/2000
inary_accuracy: 0.8960
Epoch 385/2000
inary accuracy: 0.8960
Epoch 386/2000
inary_accuracy: 0.8960
Epoch 387/2000
inary_accuracy: 0.8960
Epoch 388/2000
inary_accuracy: 0.8967
Epoch 389/2000
inary accuracy: 0.8960
Epoch 390/2000
1500/1500 [=============== ] - 0s - loss: 0.0909 - b
inary_accuracy: 0.8967
Epoch 391/2000
inary accuracy: 0.8960
Epoch 392/2000
```

```
inary accuracy: 0.8960
Epoch 393/2000
inary accuracy: 0.8960
Epoch 394/2000
inary accuracy: 0.8960
Epoch 395/2000
inary_accuracy: 0.8967
Epoch 396/2000
inary accuracy: 0.8960
Epoch 397/2000
inary accuracy: 0.8967
Epoch 398/2000
inary accuracy: 0.8960
Epoch 399/2000
inary_accuracy: 0.8960
Epoch 400/2000
inary accuracy: 0.8960
Epoch 401/2000
1500/1500 [=============== ] - 0s - loss: 0.0906 - b
inary accuracy: 0.8967
Epoch 402/2000
inary accuracy: 0.8960
Epoch 403/2000
inary_accuracy: 0.8960
Epoch 404/2000
1500/1500 [=============== ] - 0s - loss: 0.0905 - b
inary_accuracy: 0.8967
Epoch 405/2000
inary_accuracy: 0.8967
Epoch 406/2000
inary_accuracy: 0.8967
Epoch 407/2000
inary_accuracy: 0.8967
Epoch 408/2000
inary accuracy: 0.8967
Epoch 409/2000
inary_accuracy: 0.8967
Epoch 410/2000
1500/1500 [=============== ] - 0s - loss: 0.0903 - b
inary accuracy: 0.8967
Epoch 411/2000
```

```
inary accuracy: 0.8967
Epoch 412/2000
1500/1500 [=============== ] - 0s - loss: 0.0902 - b
inary accuracy: 0.8967
Epoch 413/2000
1500/1500 [=============== ] - 0s - loss: 0.0902 - b
inary accuracy: 0.8967
Epoch 414/2000
inary accuracy: 0.8967
Epoch 415/2000
inary accuracy: 0.8967
Epoch 416/2000
1500/1500 [==============] - 0s - loss: 0.0901 - b
inary accuracy: 0.8973
Epoch 417/2000
inary accuracy: 0.8973
Epoch 418/2000
acy: 0.896
Epoch 419/2000
inary_accuracy: 0.8973
Epoch 420/2000
inary_accuracy: 0.8973
Epoch 421/2000
inary_accuracy: 0.8973
Epoch 422/2000
inary accuracy: 0.8973
Epoch 423/2000
inary_accuracy: 0.8973
Epoch 424/2000
inary accuracy: 0.8973
Epoch 425/2000
inary accuracy: 0.8973
Epoch 426/2000
inary_accuracy: 0.8973
Epoch 427/2000
1500/1500 [==============] - 0s - loss: 0.0898 - b
inary accuracy: 0.8973
Epoch 428/2000
inary accuracy: 0.8973
Epoch 429/2000
1500/1500 [==============] - 0s - loss: 0.0898 - b
inary accuracy: 0.8967
Epoch 430/2000
```

```
inary_accuracy: 0.8967
Epoch 431/2000
inary_accuracy: 0.8967
Epoch 432/2000
inary_accuracy: 0.8967
Epoch 433/2000
inary_accuracy: 0.8973
Epoch 434/2000
inary accuracy: 0.8967
Epoch 435/2000
inary accuracy: 0.8967
Epoch 436/2000
1500/1500 [============== ] - 0s - loss: 0.0896 - b
inary_accuracy: 0.8967
Epoch 437/2000
inary_accuracy: 0.8967
Epoch 438/2000
inary_accuracy: 0.8967
Epoch 439/2000
inary_accuracy: 0.8967
Epoch 440/2000
inary_accuracy: 0.8973
Epoch 441/2000
inary accuracy: 0.8967
Epoch 442/2000
inary_accuracy: 0.8967
Epoch 443/2000
inary accuracy: 0.8967
Epoch 444/2000
inary_accuracy: 0.8967
Epoch 445/2000
inary_accuracy: 0.8967
Epoch 446/2000
1500/1500 [==============] - 0s - loss: 0.0894 - b
inary accuracy: 0.8967
Epoch 447/2000
inary accuracy: 0.8967
Epoch 448/2000
1500/1500 [==============] - 0s - loss: 0.0893 - b
inary_accuracy: 0.8973
Epoch 449/2000
```

```
inary_accuracy: 0.8973
Epoch 450/2000
inary_accuracy: 0.8973
Epoch 451/2000
inary_accuracy: 0.8980
Epoch 452/2000
1500/1500 [==============] - 0s - loss: 0.0892 - b
inary_accuracy: 0.8980
Epoch 453/2000
1500/1500 [=============== ] - 0s - loss: 0.0892 - b
inary accuracy: 0.8987
Epoch 454/2000
inary accuracy: 0.8980
Epoch 455/2000
1500/1500 [==============] - 0s - loss: 0.0892 - b
inary_accuracy: 0.8980
Epoch 456/2000
inary_accuracy: 0.8987
Epoch 457/2000
inary_accuracy: 0.8987
Epoch 458/2000
inary_accuracy: 0.8987
Epoch 459/2000
inary_accuracy: 0.8987
Epoch 460/2000
inary accuracy: 0.8987
Epoch 461/2000
inary_accuracy: 0.8987
Epoch 462/2000
inary_accuracy: 0.8987
Epoch 463/2000
inary_accuracy: 0.8987
Epoch 464/2000
inary_accuracy: 0.8987
Epoch 465/2000
1500/1500 [==============] - 0s - loss: 0.0889 - b
inary accuracy: 0.8987
Epoch 466/2000
1500/1500 [=============== ] - 0s - loss: 0.0889 - b
inary accuracy: 0.8987
Epoch 467/2000
1500/1500 [=============== ] - 0s - loss: 0.0889 - b
inary_accuracy: 0.8987
Epoch 468/2000
```

```
inary_accuracy: 0.8987
Epoch 469/2000
inary_accuracy: 0.8987
Epoch 470/2000
inary_accuracy: 0.8987
Epoch 471/2000
inary_accuracy: 0.8987
Epoch 472/2000
inary accuracy: 0.8987
Epoch 473/2000
inary accuracy: 0.8993
Epoch 474/2000
1500/1500 [==============] - 0s - loss: 0.0888 - b
inary_accuracy: 0.9000
Epoch 475/2000
inary_accuracy: 0.9000
Epoch 476/2000
inary_accuracy: 0.8993
Epoch 477/2000
inary_accuracy: 0.8993
Epoch 478/2000
inary_accuracy: 0.9000
Epoch 479/2000
inary accuracy: 0.9000
Epoch 480/2000
inary_accuracy: 0.9000
Epoch 481/2000
inary accuracy: 0.8987
Epoch 482/2000
inary_accuracy: 0.9000
Epoch 483/2000
1500/1500 [==============] - 0s - loss: 0.0886 - b
inary_accuracy: 0.9000
Epoch 484/2000
1500/1500 [==============] - 0s - loss: 0.0886 - b
inary accuracy: 0.8993
Epoch 485/2000
inary accuracy: 0.9000
Epoch 486/2000
inary_accuracy: 0.9000
Epoch 487/2000
```

```
inary_accuracy: 0.9000
Epoch 488/2000
inary_accuracy: 0.9007
Epoch 489/2000
inary_accuracy: 0.9007
Epoch 490/2000
inary_accuracy: 0.9007
Epoch 491/2000
inary accuracy: 0.9007
Epoch 492/2000
inary accuracy: 0.9007
Epoch 493/2000
1500/1500 [==============] - 0s - loss: 0.0884 - b
inary_accuracy: 0.9007
Epoch 494/2000
inary_accuracy: 0.9007
Epoch 495/2000
inary_accuracy: 0.9007
Epoch 496/2000
inary_accuracy: 0.9007
Epoch 497/2000
inary_accuracy: 0.9007
Epoch 498/2000
inary accuracy: 0.9007
Epoch 499/2000
inary_accuracy: 0.9007
Epoch 500/2000
inary accuracy: 0.9007
Epoch 501/2000
inary_accuracy: 0.9007
Epoch 502/2000
inary_accuracy: 0.9007
Epoch 503/2000
1500/1500 [==============] - 0s - loss: 0.0882 - b
inary accuracy: 0.9007
Epoch 504/2000
1500/1500 [=============== ] - 0s - loss: 0.0882 - b
inary accuracy: 0.9007
Epoch 505/2000
inary_accuracy: 0.9007
Epoch 506/2000
```

```
inary_accuracy: 0.9007
Epoch 507/2000
inary_accuracy: 0.9007
Epoch 508/2000
inary_accuracy: 0.9007
Epoch 509/2000
inary_accuracy: 0.9013
Epoch 510/2000
inary accuracy: 0.9007
Epoch 511/2000
inary accuracy: 0.9007
Epoch 512/2000
1500/1500 [=============== ] - 0s - loss: 0.0881 - b
inary_accuracy: 0.9007
Epoch 513/2000
inary_accuracy: 0.9007
Epoch 514/2000
inary_accuracy: 0.9007
Epoch 515/2000
inary_accuracy: 0.9007
Epoch 516/2000
inary_accuracy: 0.9007
Epoch 517/2000
inary accuracy: 0.9007
Epoch 518/2000
inary_accuracy: 0.9007
Epoch 519/2000
inary accuracy: 0.9007
Epoch 520/2000
inary_accuracy: 0.9007
Epoch 521/2000
inary_accuracy: 0.9007
Epoch 522/2000
inary accuracy: 0.9007
Epoch 523/2000
inary accuracy: 0.9013
Epoch 524/2000
inary_accuracy: 0.9007
Epoch 525/2000
```

```
inary_accuracy: 0.9013
Epoch 526/2000
inary_accuracy: 0.9007
Epoch 527/2000
inary_accuracy: 0.9007
Epoch 528/2000
inary_accuracy: 0.9013
Epoch 529/2000
inary accuracy: 0.9007
Epoch 530/2000
inary accuracy: 0.9013
Epoch 531/2000
1500/1500 [============== ] - 0s - loss: 0.0878 - b
inary_accuracy: 0.9007
Epoch 532/2000
inary_accuracy: 0.9007
Epoch 533/2000
inary_accuracy: 0.9013
Epoch 534/2000
inary_accuracy: 0.9013
Epoch 535/2000
inary_accuracy: 0.9013
Epoch 536/2000
inary accuracy: 0.9007
Epoch 537/2000
inary_accuracy: 0.9013
Epoch 538/2000
inary accuracy: 0.9007
Epoch 539/2000
inary accuracy: 0.9013
Epoch 540/2000
inary_accuracy: 0.9007
Epoch 541/2000
1500/1500 [==============] - 0s - loss: 0.0877 - b
inary accuracy: 0.9013
Epoch 542/2000
inary accuracy: 0.9007
Epoch 543/2000
inary_accuracy: 0.9013
Epoch 544/2000
```

```
inary_accuracy: 0.9013
Epoch 545/2000
inary_accuracy: 0.9013
Epoch 546/2000
inary_accuracy: 0.9013
Epoch 547/2000
inary_accuracy: 0.9013
Epoch 548/2000
1500/1500 [=============== ] - 0s - loss: 0.0876 - b
inary accuracy: 0.9013
Epoch 549/2000
inary accuracy: 0.9013
Epoch 550/2000
1500/1500 [=============== ] - 0s - loss: 0.0875 - b
inary_accuracy: 0.9013
Epoch 551/2000
inary accuracy: 0.9013
Epoch 552/2000
inary_accuracy: 0.9013
Epoch 553/2000
inary_accuracy: 0.9013
Epoch 554/2000
inary_accuracy: 0.9013
Epoch 555/2000
inary accuracy: 0.9013
Epoch 556/2000
inary_accuracy: 0.9013
Epoch 557/2000
inary accuracy: 0.9013
Epoch 558/2000
inary accuracy: 0.9013
Epoch 559/2000
inary_accuracy: 0.9013
Epoch 560/2000
1500/1500 [==============] - 0s - loss: 0.0874 - b
inary accuracy: 0.9013
Epoch 561/2000
inary accuracy: 0.9013
Epoch 562/2000
1500/1500 [==============] - 0s - loss: 0.0874 - b
inary_accuracy: 0.9013
Epoch 563/2000
```

```
inary_accuracy: 0.9013
Epoch 564/2000
inary_accuracy: 0.9013
Epoch 565/2000
inary_accuracy: 0.9013
Epoch 566/2000
inary_accuracy: 0.9013
Epoch 567/2000
inary accuracy: 0.9013
Epoch 568/2000
inary accuracy: 0.9013
Epoch 569/2000
1500/1500 [============== ] - 0s - loss: 0.0873 - b
inary_accuracy: 0.9013
Epoch 570/2000
inary accuracy: 0.9013
Epoch 571/2000
inary_accuracy: 0.9013
Epoch 572/2000
inary_accuracy: 0.9013
Epoch 573/2000
inary_accuracy: 0.9013
Epoch 574/2000
inary accuracy: 0.9013
Epoch 575/2000
inary_accuracy: 0.9013
Epoch 576/2000
inary_accuracy: 0.9013
Epoch 577/2000
inary accuracy: 0.9013
Epoch 578/2000
1500/1500 [==============] - 0s - loss: 0.0872 - b
inary_accuracy: 0.9013
Epoch 579/2000
1500/1500 [==============] - 0s - loss: 0.0872 - b
inary accuracy: 0.9013
Epoch 580/2000
inary accuracy: 0.9013
Epoch 581/2000
inary_accuracy: 0.9013
Epoch 582/2000
```

```
inary_accuracy: 0.9013
Epoch 583/2000
inary_accuracy: 0.9013
Epoch 584/2000
inary_accuracy: 0.9013
Epoch 585/2000
inary_accuracy: 0.9013
Epoch 586/2000
inary accuracy: 0.9013
Epoch 587/2000
inary accuracy: 0.9013
Epoch 588/2000
1500/1500 [==============] - 0s - loss: 0.0871 - b
inary_accuracy: 0.9013
Epoch 589/2000
inary accuracy: 0.9013
Epoch 590/2000
inary_accuracy: 0.9013
Epoch 591/2000
inary_accuracy: 0.9013
Epoch 592/2000
inary_accuracy: 0.9013
Epoch 593/2000
inary accuracy: 0.9013
Epoch 594/2000
inary_accuracy: 0.9013
Epoch 595/2000
inary accuracy: 0.9013
Epoch 596/2000
inary accuracy: 0.9013
Epoch 597/2000
inary_accuracy: 0.9013
Epoch 598/2000
inary accuracy: 0.9013
Epoch 599/2000
inary accuracy: 0.9013
Epoch 600/2000
1500/1500 [==============] - 0s - loss: 0.0869 - b
inary accuracy: 0.9013
Epoch 601/2000
```

```
inary_accuracy: 0.9007
Epoch 602/2000
inary_accuracy: 0.9013
Epoch 603/2000
inary_accuracy: 0.9013
Epoch 604/2000
inary_accuracy: 0.9013
Epoch 605/2000
inary accuracy: 0.9007
Epoch 606/2000
inary accuracy: 0.9013
Epoch 607/2000
1500/1500 [=============== ] - 0s - loss: 0.0869 - b
inary_accuracy: 0.9007
Epoch 608/2000
inary accuracy: 0.9007
Epoch 609/2000
inary_accuracy: 0.9013
Epoch 610/2000
inary_accuracy: 0.9007
Epoch 611/2000
inary_accuracy: 0.9007
Epoch 612/2000
inary accuracy: 0.9013
Epoch 613/2000
inary_accuracy: 0.9013
Epoch 614/2000
inary accuracy: 0.9013
Epoch 615/2000
inary_accuracy: 0.9013
Epoch 616/2000
inary_accuracy: 0.9020
Epoch 617/2000
1500/1500 [==============] - 0s - loss: 0.0868 - b
inary accuracy: 0.9013
Epoch 618/2000
inary accuracy: 0.9013
Epoch 619/2000
1500/1500 [==============] - 0s - loss: 0.0868 - b
inary_accuracy: 0.9013
Epoch 620/2000
```

```
inary_accuracy: 0.9013
Epoch 621/2000
inary_accuracy: 0.9020
Epoch 622/2000
inary_accuracy: 0.9020
Epoch 623/2000
1500/1500 [============== ] - 0s - loss: 0.0867 - b
inary_accuracy: 0.9020
Epoch 624/2000
inary accuracy: 0.9020
Epoch 625/2000
inary accuracy: 0.9020
Epoch 626/2000
1500/1500 [============== ] - 0s - loss: 0.0867 - b
inary_accuracy: 0.9020
Epoch 627/2000
inary accuracy: 0.9020
Epoch 628/2000
inary_accuracy: 0.9020
Epoch 629/2000
inary_accuracy: 0.9020
Epoch 630/2000
inary_accuracy: 0.9020
Epoch 631/2000
inary accuracy: 0.9020
Epoch 632/2000
inary_accuracy: 0.9020
Epoch 633/2000
inary accuracy: 0.9020
Epoch 634/2000
inary_accuracy: 0.9020
Epoch 635/2000
inary_accuracy: 0.9020
Epoch 636/2000
1500/1500 [==============] - 0s - loss: 0.0866 - b
inary accuracy: 0.9020
Epoch 637/2000
inary accuracy: 0.9020
Epoch 638/2000
1500/1500 [==============] - 0s - loss: 0.0866 - b
inary_accuracy: 0.9020
Epoch 639/2000
```

```
inary_accuracy: 0.9020
Epoch 640/2000
inary_accuracy: 0.9020
Epoch 641/2000
inary_accuracy: 0.9020
Epoch 642/2000
1500/1500 [==============] - 0s - loss: 0.0865 - b
inary_accuracy: 0.9020
Epoch 643/2000
inary accuracy: 0.9020
Epoch 644/2000
inary accuracy: 0.9020
Epoch 645/2000
1500/1500 [==============] - 0s - loss: 0.0865 - b
inary_accuracy: 0.9020
Epoch 646/2000
inary_accuracy: 0.9020
Epoch 647/2000
inary_accuracy: 0.9020
Epoch 648/2000
inary_accuracy: 0.9020
Epoch 649/2000
inary_accuracy: 0.9020
Epoch 650/2000
inary accuracy: 0.9020
Epoch 651/2000
inary_accuracy: 0.9013
Epoch 652/2000
inary_accuracy: 0.9020
Epoch 653/2000
inary_accuracy: 0.9013
Epoch 654/2000
1500/1500 [=============== ] - 0s - loss: 0.0864 - b
inary_accuracy: 0.9020
Epoch 655/2000
1500/1500 [==============] - 0s - loss: 0.0864 - b
inary accuracy: 0.9013
Epoch 656/2000
1500/1500 [=============== ] - 0s - loss: 0.0864 - b
inary accuracy: 0.9013
Epoch 657/2000
1500/1500 [===============] - 0s - loss: 0.0864 - b
inary_accuracy: 0.9013
Epoch 658/2000
```

```
inary_accuracy: 0.9013
Epoch 659/2000
1500/1500 [=============== ] - 0s - loss: 0.0864 - b
inary_accuracy: 0.9013
Epoch 660/2000
inary_accuracy: 0.9013
Epoch 661/2000
1500/1500 [==============] - 0s - loss: 0.0864 - b
inary_accuracy: 0.9013
Epoch 662/2000
inary accuracy: 0.9013
Epoch 663/2000
inary accuracy: 0.9013
Epoch 664/2000
1500/1500 [============== ] - 0s - loss: 0.0863 - b
inary_accuracy: 0.9013
Epoch 665/2000
inary accuracy: 0.9013
Epoch 666/2000
inary_accuracy: 0.9013
Epoch 667/2000
inary_accuracy: 0.9013
Epoch 668/2000
inary_accuracy: 0.9013
Epoch 669/2000
inary accuracy: 0.9013
Epoch 670/2000
inary_accuracy: 0.9013
Epoch 671/2000
inary_accuracy: 0.9013
Epoch 672/2000
inary_accuracy: 0.9013
Epoch 673/2000
inary_accuracy: 0.9013
Epoch 674/2000
1500/1500 [==============] - 0s - loss: 0.0863 - b
inary accuracy: 0.9013
Epoch 675/2000
inary accuracy: 0.9013
Epoch 676/2000
1500/1500 [==============] - 0s - loss: 0.0862 - b
inary accuracy: 0.9020
Epoch 677/2000
```

```
inary_accuracy: 0.9013
Epoch 678/2000
1500/1500 [=============== ] - 0s - loss: 0.0862 - b
inary_accuracy: 0.9013
Epoch 679/2000
inary_accuracy: 0.9020
Epoch 680/2000
1500/1500 [==============] - 0s - loss: 0.0862 - b
inary_accuracy: 0.9020
Epoch 681/2000
1500/1500 [=============== ] - 0s - loss: 0.0862 - b
inary accuracy: 0.9020
Epoch 682/2000
inary accuracy: 0.9013
Epoch 683/2000
1500/1500 [==============] - 0s - loss: 0.0862 - b
inary_accuracy: 0.9020
Epoch 684/2000
inary_accuracy: 0.9013
Epoch 685/2000
inary_accuracy: 0.9013
Epoch 686/2000
1500/1500 [==============] - 0s - loss: 0.0862 - b
inary_accuracy: 0.9013
Epoch 687/2000
inary_accuracy: 0.9020
Epoch 688/2000
inary accuracy: 0.9013
Epoch 689/2000
inary_accuracy: 0.9013
Epoch 690/2000
inary accuracy: 0.9013
Epoch 691/2000
inary_accuracy: 0.9013
Epoch 692/2000
inary_accuracy: 0.9013
Epoch 693/2000
1500/1500 [==============] - 0s - loss: 0.0861 - b
inary accuracy: 0.9013
Epoch 694/2000
inary accuracy: 0.9013
Epoch 695/2000
1500/1500 [==============] - 0s - loss: 0.0861 - b
inary_accuracy: 0.9013
Epoch 696/2000
```

```
inary_accuracy: 0.9013
Epoch 697/2000
inary_accuracy: 0.9013
Epoch 698/2000
inary_accuracy: 0.9013
Epoch 699/2000
1500/1500 [==============] - 0s - loss: 0.0861 - b
inary_accuracy: 0.9013
Epoch 700/2000
1500/1500 [=============== ] - 0s - loss: 0.0861 - b
inary accuracy: 0.9013
Epoch 701/2000
inary accuracy: 0.9013
Epoch 702/2000
1500/1500 [==============] - 0s - loss: 0.0860 - b
inary_accuracy: 0.9013
Epoch 703/2000
inary accuracy: 0.9013
Epoch 704/2000
inary_accuracy: 0.9013
Epoch 705/2000
inary_accuracy: 0.9013
Epoch 706/2000
inary_accuracy: 0.9013
Epoch 707/2000
inary_accuracy: 0.9013
Epoch 708/2000
inary_accuracy: 0.9013
Epoch 709/2000
inary accuracy: 0.9013
Epoch 710/2000
inary_accuracy: 0.9013
Epoch 711/2000
inary_accuracy: 0.9013
Epoch 712/2000
1500/1500 [==============] - 0s - loss: 0.0860 - b
inary accuracy: 0.9013
Epoch 713/2000
inary accuracy: 0.9013
Epoch 714/2000
inary accuracy: 0.9013
Epoch 715/2000
```

```
inary_accuracy: 0.9013
Epoch 716/2000
inary accuracy: 0.9013
Epoch 717/2000
inary_accuracy: 0.9013
Epoch 718/2000
inary_accuracy: 0.9013
Epoch 719/2000
inary accuracy: 0.9013
Epoch 720/2000
inary accuracy: 0.9013
Epoch 721/2000
1500/1500 [=============== ] - 0s - loss: 0.0859 - b
inary_accuracy: 0.9013
Epoch 722/2000
inary accuracy: 0.9013
Epoch 723/2000
inary_accuracy: 0.9013
Epoch 724/2000
inary_accuracy: 0.9013
Epoch 725/2000
inary_accuracy: 0.9013
Epoch 726/2000
inary_accuracy: 0.9013
Epoch 727/2000
inary_accuracy: 0.9013
Epoch 728/2000
inary accuracy: 0.9013
Epoch 729/2000
inary accuracy: 0.9013
Epoch 730/2000
inary_accuracy: 0.9013
Epoch 731/2000
1500/1500 [==============] - 0s - loss: 0.0858 - b
inary accuracy: 0.9013
Epoch 732/2000
inary accuracy: 0.9013
Epoch 733/2000
inary accuracy: 0.9013
Epoch 734/2000
```

```
inary_accuracy: 0.9013
Epoch 735/2000
inary accuracy: 0.9013
Epoch 736/2000
inary_accuracy: 0.9013
Epoch 737/2000
inary_accuracy: 0.9013
Epoch 738/2000
inary accuracy: 0.9013
Epoch 739/2000
inary accuracy: 0.9013
Epoch 740/2000
1500/1500 [=============== ] - 0s - loss: 0.0858 - b
inary_accuracy: 0.9013
Epoch 741/2000
inary accuracy: 0.9013
Epoch 742/2000
inary_accuracy: 0.9013
Epoch 743/2000
inary_accuracy: 0.9013
Epoch 744/2000
inary_accuracy: 0.9013
Epoch 745/2000
inary_accuracy: 0.9013
Epoch 746/2000
inary_accuracy: 0.9013
Epoch 747/2000
inary accuracy: 0.9013
Epoch 748/2000
inary accuracy: 0.9013
Epoch 749/2000
inary_accuracy: 0.9020
Epoch 750/2000
1500/1500 [==============] - 0s - loss: 0.0857 - b
inary accuracy: 0.9013
Epoch 751/2000
inary accuracy: 0.9020
Epoch 752/2000
inary_accuracy: 0.9013
Epoch 753/2000
```

```
inary_accuracy: 0.9020
Epoch 754/2000
inary_accuracy: 0.9013
Epoch 755/2000
inary_accuracy: 0.9013
Epoch 756/2000
1500/1500 [==============] - 0s - loss: 0.0857 - b
inary_accuracy: 0.9013
Epoch 757/2000
1500/1500 [==============] - 0s - loss: 0.0857 - b
inary_accuracy: 0.9020 - ETA: 0s - loss: 0.0856 - binary_accur
acy: 0.902
Epoch 758/2000
1500/1500 [==============] - 0s - loss: 0.0857 - b
inary accuracy: 0.9020
Epoch 759/2000
inary accuracy: 0.9020
Epoch 760/2000
1500/1500 [==============] - 0s - loss: 0.0857 - b
inary accuracy: 0.9020
Epoch 761/2000
inary accuracy: 0.9020
Epoch 762/2000
inary accuracy: 0.9020
Epoch 763/2000
1500/1500 [=============== ] - 0s - loss: 0.0856 - b
inary_accuracy: 0.9020
Epoch 764/2000
inary accuracy: 0.9020
Epoch 765/2000
inary accuracy: 0.9020
Epoch 766/2000
inary accuracy: 0.9020
Epoch 767/2000
inary accuracy: 0.9020
Epoch 768/2000
inary accuracy: 0.9020
Epoch 769/2000
inary_accuracy: 0.9020
Epoch 770/2000
inary accuracy: 0.9020
Epoch 771/2000
inary_accuracy: 0.9020
```

```
Epoch 772/2000
inary accuracy: 0.9020
Epoch 773/2000
inary accuracy: 0.9020
Epoch 774/2000
inary accuracy: 0.9020
Epoch 775/2000
inary accuracy: 0.9020
Epoch 776/2000
inary accuracy: 0.9020
Epoch 777/2000
1500/1500 [==============] - 0s - loss: 0.0856 - b
inary accuracy: 0.9020
Epoch 778/2000
inary accuracy: 0.9020
Epoch 779/2000
1500/1500 [==============] - 0s - loss: 0.0855 - b
inary accuracy: 0.9020
Epoch 780/2000
inary accuracy: 0.9020
Epoch 781/2000
inary accuracy: 0.9020
Epoch 782/2000
inary_accuracy: 0.9020
Epoch 783/2000
inary accuracy: 0.9020
Epoch 784/2000
inary accuracy: 0.9020
Epoch 785/2000
inary accuracy: 0.9020
Epoch 786/2000
inary accuracy: 0.9020
Epoch 787/2000
inary accuracy: 0.9020
Epoch 788/2000
inary_accuracy: 0.9020
Epoch 789/2000
inary accuracy: 0.9020
Epoch 790/2000
inary_accuracy: 0.9020
```

```
Epoch 791/2000
inary accuracy: 0.9020
Epoch 792/2000
inary accuracy: 0.9020
Epoch 793/2000
inary accuracy: 0.9020
Epoch 794/2000
inary accuracy: 0.9027
Epoch 795/2000
inary accuracy: 0.9027
Epoch 796/2000
1500/1500 [==============] - 0s - loss: 0.0854 - b
inary accuracy: 0.9027
Epoch 797/2000
inary accuracy: 0.9027
Epoch 798/2000
1500/1500 [==============] - 0s - loss: 0.0854 - b
inary accuracy: 0.9027
Epoch 799/2000
inary accuracy: 0.9027
Epoch 800/2000
inary accuracy: 0.9027
Epoch 801/2000
inary_accuracy: 0.9027
Epoch 802/2000
inary accuracy: 0.9027
Epoch 803/2000
inary accuracy: 0.9027
Epoch 804/2000
inary accuracy: 0.9027
Epoch 805/2000
inary accuracy: 0.9027
Epoch 806/2000
inary accuracy: 0.9027
Epoch 807/2000
inary_accuracy: 0.9027
Epoch 808/2000
inary accuracy: 0.9027
Epoch 809/2000
inary_accuracy: 0.9027
```

```
Epoch 810/2000
inary accuracy: 0.9027
Epoch 811/2000
inary accuracy: 0.9027
Epoch 812/2000
inary accuracy: 0.9027
Epoch 813/2000
inary accuracy: 0.9027
Epoch 814/2000
inary accuracy: 0.9027
Epoch 815/2000
1500/1500 [==============] - 0s - loss: 0.0853 - b
inary accuracy: 0.9027
Epoch 816/2000
inary accuracy: 0.9027
Epoch 817/2000
1500/1500 [==============] - 0s - loss: 0.0853 - b
inary accuracy: 0.9027
Epoch 818/2000
inary accuracy: 0.9027
Epoch 819/2000
inary accuracy: 0.9027
Epoch 820/2000
inary_accuracy: 0.9027
Epoch 821/2000
inary accuracy: 0.9027
Epoch 822/2000
inary accuracy: 0.9027
Epoch 823/2000
inary accuracy: 0.9027
Epoch 824/2000
inary accuracy: 0.9027
Epoch 825/2000
inary accuracy: 0.9027
Epoch 826/2000
inary_accuracy: 0.9027
Epoch 827/2000
inary accuracy: 0.9027
Epoch 828/2000
inary_accuracy: 0.9027
```

```
Epoch 829/2000
inary accuracy: 0.9027
Epoch 830/2000
inary accuracy: 0.9027
Epoch 831/2000
inary accuracy: 0.9027
Epoch 832/2000
inary accuracy: 0.9027
Epoch 833/2000
inary accuracy: 0.9027
Epoch 834/2000
1500/1500 [==============] - 0s - loss: 0.0852 - b
inary accuracy: 0.9027
Epoch 835/2000
inary accuracy: 0.9027
Epoch 836/2000
1500/1500 [==============] - 0s - loss: 0.0852 - b
inary accuracy: 0.9027
Epoch 837/2000
inary accuracy: 0.9027
Epoch 838/2000
inary accuracy: 0.9027
Epoch 839/2000
inary_accuracy: 0.9027
Epoch 840/2000
inary accuracy: 0.9027
Epoch 841/2000
inary accuracy: 0.9027
Epoch 842/2000
inary accuracy: 0.9027
Epoch 843/2000
inary accuracy: 0.9027
Epoch 844/2000
inary accuracy: 0.9027
Epoch 845/2000
inary_accuracy: 0.9027
Epoch 846/2000
inary accuracy: 0.9027
Epoch 847/2000
inary_accuracy: 0.9027
```

```
Epoch 848/2000
inary accuracy: 0.9027
Epoch 849/2000
inary accuracy: 0.9027
Epoch 850/2000
inary accuracy: 0.9027
Epoch 851/2000
inary accuracy: 0.9027
Epoch 852/2000
inary accuracy: 0.9027
Epoch 853/2000
1500/1500 [==============] - 0s - loss: 0.0851 - b
inary accuracy: 0.9027
Epoch 854/2000
inary accuracy: 0.9027
Epoch 855/2000
1500/1500 [==============] - 0s - loss: 0.0851 - b
inary accuracy: 0.9027
Epoch 856/2000
inary accuracy: 0.9027
Epoch 857/2000
inary accuracy: 0.9027
Epoch 858/2000
inary_accuracy: 0.9027
Epoch 859/2000
inary accuracy: 0.9027
Epoch 860/2000
inary accuracy: 0.9027
Epoch 861/2000
inary accuracy: 0.9027
Epoch 862/2000
inary accuracy: 0.9027
Epoch 863/2000
inary accuracy: 0.9027
Epoch 864/2000
inary_accuracy: 0.9027
Epoch 865/2000
inary accuracy: 0.9027
Epoch 866/2000
inary_accuracy: 0.9027
```

```
Epoch 867/2000
inary accuracy: 0.9027
Epoch 868/2000
inary accuracy: 0.9027
Epoch 869/2000
inary accuracy: 0.9027
Epoch 870/2000
inary accuracy: 0.9027
Epoch 871/2000
inary accuracy: 0.9027
Epoch 872/2000
1500/1500 [==============] - 0s - loss: 0.0851 - b
inary accuracy: 0.9027
Epoch 873/2000
inary accuracy: 0.9027
Epoch 874/2000
1500/1500 [==============] - 0s - loss: 0.0850 - b
inary accuracy: 0.9027
Epoch 875/2000
inary accuracy: 0.9027
Epoch 876/2000
inary accuracy: 0.9027
Epoch 877/2000
inary_accuracy: 0.9027
Epoch 878/2000
inary accuracy: 0.9027
Epoch 879/2000
inary accuracy: 0.9027
Epoch 880/2000
inary accuracy: 0.9027
Epoch 881/2000
inary accuracy: 0.9027
Epoch 882/2000
inary accuracy: 0.9027
Epoch 883/2000
inary_accuracy: 0.9027
Epoch 884/2000
inary accuracy: 0.9027
Epoch 885/2000
inary_accuracy: 0.9027
```

```
Epoch 886/2000
inary accuracy: 0.9027
Epoch 887/2000
inary accuracy: 0.9027
Epoch 888/2000
inary accuracy: 0.9027
Epoch 889/2000
inary accuracy: 0.9027
Epoch 890/2000
inary accuracy: 0.9027
Epoch 891/2000
inary accuracy: 0.9027
Epoch 892/2000
inary accuracy: 0.9027
Epoch 893/2000
1500/1500 [==============] - 0s - loss: 0.0850 - b
inary accuracy: 0.9027
Epoch 894/2000
inary accuracy: 0.9027
Epoch 895/2000
inary accuracy: 0.9027
Epoch 896/2000
inary_accuracy: 0.9027
Epoch 897/2000
inary accuracy: 0.9027
Epoch 898/2000
inary accuracy: 0.9027
Epoch 899/2000
inary accuracy: 0.9027
Epoch 900/2000
inary accuracy: 0.9027
Epoch 901/2000
inary accuracy: 0.9027
Epoch 902/2000
inary_accuracy: 0.9027
Epoch 903/2000
inary accuracy: 0.9027
Epoch 904/2000
inary_accuracy: 0.9027
```

```
Epoch 905/2000
inary accuracy: 0.9027
Epoch 906/2000
inary accuracy: 0.9027
Epoch 907/2000
inary accuracy: 0.9027
Epoch 908/2000
inary accuracy: 0.9027
Epoch 909/2000
inary_accuracy: 0.9027 - ETA: 0s - loss: 0.0912 - binary_accur
acy: 0.892
Epoch 910/2000
inary accuracy: 0.9027
Epoch 911/2000
inary_accuracy: 0.9027
Epoch 912/2000
inary accuracy: 0.9027
Epoch 913/2000
inary accuracy: 0.9027
Epoch 914/2000
inary accuracy: 0.9027
Epoch 915/2000
inary_accuracy: 0.9027
Epoch 916/2000
inary_accuracy: 0.9027
Epoch 917/2000
inary_accuracy: 0.9027
Epoch 918/2000
inary_accuracy: 0.9027
Epoch 919/2000
inary_accuracy: 0.9027
Epoch 920/2000
inary accuracy: 0.9027
Epoch 921/2000
inary_accuracy: 0.9027
Epoch 922/2000
inary accuracy: 0.9027
Epoch 923/2000
```

```
inary accuracy: 0.9027
Epoch 924/2000
inary accuracy: 0.9027
Epoch 925/2000
inary accuracy: 0.9027
Epoch 926/2000
inary_accuracy: 0.9027
Epoch 927/2000
inary accuracy: 0.9027
Epoch 928/2000
1500/1500 [==============] - 0s - loss: 0.0848 - b
inary accuracy: 0.9027
Epoch 929/2000
inary accuracy: 0.9027
Epoch 930/2000
inary_accuracy: 0.9027
Epoch 931/2000
inary accuracy: 0.9027
Epoch 932/2000
inary accuracy: 0.9027
Epoch 933/2000
inary accuracy: 0.9027
Epoch 934/2000
inary_accuracy: 0.9027
Epoch 935/2000
inary_accuracy: 0.9027
Epoch 936/2000
inary_accuracy: 0.9027
Epoch 937/2000
inary_accuracy: 0.9027
Epoch 938/2000
inary_accuracy: 0.9027
Epoch 939/2000
inary accuracy: 0.9027
Epoch 940/2000
inary_accuracy: 0.9027
Epoch 941/2000
inary accuracy: 0.9027
Epoch 942/2000
```

```
inary accuracy: 0.9027
Epoch 943/2000
inary accuracy: 0.9027
Epoch 944/2000
inary_accuracy: 0.9027
Epoch 945/2000
inary_accuracy: 0.9027
Epoch 946/2000
inary accuracy: 0.9027
Epoch 947/2000
1500/1500 [==============] - 0s - loss: 0.0847 - b
inary accuracy: 0.9027
Epoch 948/2000
inary accuracy: 0.9027
Epoch 949/2000
inary accuracy: 0.9027
Epoch 950/2000
inary accuracy: 0.9027
Epoch 951/2000
inary accuracy: 0.9027
Epoch 952/2000
inary accuracy: 0.9027
Epoch 953/2000
inary_accuracy: 0.9027
Epoch 954/2000
inary accuracy: 0.9027
Epoch 955/2000
inary_accuracy: 0.9027
Epoch 956/2000
inary_accuracy: 0.9027
Epoch 957/2000
inary_accuracy: 0.9027
Epoch 958/2000
inary_accuracy: 0.9027
Epoch 959/2000
inary_accuracy: 0.9027
Epoch 960/2000
inary accuracy: 0.9027
Epoch 961/2000
```

```
inary accuracy: 0.9027
Epoch 962/2000
inary accuracy: 0.9027
Epoch 963/2000
inary accuracy: 0.9027
Epoch 964/2000
inary_accuracy: 0.9027
Epoch 965/2000
inary accuracy: 0.9027
Epoch 966/2000
1500/1500 [==============] - 0s - loss: 0.0847 - b
inary accuracy: 0.9027
Epoch 967/2000
inary accuracy: 0.9027
Epoch 968/2000
inary_accuracy: 0.9027
Epoch 969/2000
inary accuracy: 0.9027
Epoch 970/2000
inary accuracy: 0.9027
Epoch 971/2000
inary accuracy: 0.9027
Epoch 972/2000
inary_accuracy: 0.9027
Epoch 973/2000
inary accuracy: 0.9027
Epoch 974/2000
inary_accuracy: 0.9027
Epoch 975/2000
inary_accuracy: 0.9027
Epoch 976/2000
inary_accuracy: 0.9027
Epoch 977/2000
inary accuracy: 0.9027
Epoch 978/2000
inary_accuracy: 0.9027
Epoch 979/2000
inary accuracy: 0.9027
Epoch 980/2000
```

```
inary accuracy: 0.9033
Epoch 981/2000
inary accuracy: 0.9033
Epoch 982/2000
inary_accuracy: 0.9027
Epoch 983/2000
inary_accuracy: 0.9027
Epoch 984/2000
inary accuracy: 0.9027
Epoch 985/2000
1500/1500 [==============] - 0s - loss: 0.0846 - b
inary accuracy: 0.9033
Epoch 986/2000
inary accuracy: 0.9027
Epoch 987/2000
inary_accuracy: 0.9033
Epoch 988/2000
inary accuracy: 0.9027
Epoch 989/2000
inary accuracy: 0.9027
Epoch 990/2000
inary accuracy: 0.9033
Epoch 991/2000
inary_accuracy: 0.9027
Epoch 992/2000
inary accuracy: 0.9027
Epoch 993/2000
inary_accuracy: 0.9033
Epoch 994/2000
inary_accuracy: 0.9033
Epoch 995/2000
inary_accuracy: 0.9027
Epoch 996/2000
inary_accuracy: 0.9027
Epoch 997/2000
inary_accuracy: 0.9033
Epoch 998/2000
inary accuracy: 0.9027
Epoch 999/2000
```

```
inary accuracy: 0.9033
Epoch 1000/2000
inary accuracy: 0.9033
Epoch 1001/2000
inary accuracy: 0.9027
Epoch 1002/2000
inary accuracy: 0.9027
Epoch 1003/2000
inary accuracy: 0.9033
Epoch 1004/2000
1500/1500 [==============] - 0s - loss: 0.0845 - b
inary accuracy: 0.9033
Epoch 1005/2000
inary accuracy: 0.9027
Epoch 1006/2000
inary_accuracy: 0.9033
Epoch 1007/2000
inary accuracy: 0.9027
Epoch 1008/2000
1500/1500 [=============== ] - 0s - loss: 0.0845 - b
inary accuracy: 0.9027
Epoch 1009/2000
inary accuracy: 0.9027
Epoch 1010/2000
inary_accuracy: 0.9033
Epoch 1011/2000
1500/1500 [=============== ] - 0s - loss: 0.0845 - b
inary accuracy: 0.9033
Epoch 1012/2000
inary accuracy: 0.9033
Epoch 1013/2000
inary_accuracy: 0.9033
Epoch 1014/2000
inary_accuracy: 0.9033
Epoch 1015/2000
inary accuracy: 0.9033
Epoch 1016/2000
inary_accuracy: 0.9033
Epoch 1017/2000
inary accuracy: 0.9033
Epoch 1018/2000
```

```
inary accuracy: 0.9033
Epoch 1019/2000
inary accuracy: 0.9033
Epoch 1020/2000
inary accuracy: 0.9033
Epoch 1021/2000
inary accuracy: 0.9033
Epoch 1022/2000
inary accuracy: 0.9033
Epoch 1023/2000
1500/1500 [==============] - 0s - loss: 0.0845 - b
inary accuracy: 0.9033
Epoch 1024/2000
inary accuracy: 0.9033
Epoch 1025/2000
inary_accuracy: 0.9033
Epoch 1026/2000
inary accuracy: 0.9033
Epoch 1027/2000
inary accuracy: 0.9033
Epoch 1028/2000
inary accuracy: 0.9033
Epoch 1029/2000
inary_accuracy: 0.9033
Epoch 1030/2000
inary accuracy: 0.9033
Epoch 1031/2000
inary accuracy: 0.9033
Epoch 1032/2000
inary_accuracy: 0.9033
Epoch 1033/2000
inary_accuracy: 0.9033
Epoch 1034/2000
inary accuracy: 0.9033
Epoch 1035/2000
inary_accuracy: 0.9033
Epoch 1036/2000
1500/1500 [==============] - 0s - loss: 0.0844 - b
inary accuracy: 0.9033
Epoch 1037/2000
```

```
inary accuracy: 0.9033
Epoch 1038/2000
inary accuracy: 0.9033
Epoch 1039/2000
inary accuracy: 0.9033
Epoch 1040/2000
inary accuracy: 0.9033
Epoch 1041/2000
1500/1500 [==============] - 0s - loss: 0.0844 - b
inary accuracy: 0.9033
Epoch 1042/2000
1500/1500 [==============] - 0s - loss: 0.0844 - b
inary accuracy: 0.9033
Epoch 1043/2000
inary accuracy: 0.9033
Epoch 1044/2000
inary_accuracy: 0.9033
Epoch 1045/2000
inary accuracy: 0.9033
Epoch 1046/2000
inary accuracy: 0.9033
Epoch 1047/2000
inary accuracy: 0.9033
Epoch 1048/2000
inary_accuracy: 0.9033
Epoch 1049/2000
inary accuracy: 0.9033
Epoch 1050/2000
inary accuracy: 0.9033
Epoch 1051/2000
inary_accuracy: 0.9033
Epoch 1052/2000
inary_accuracy: 0.9033
Epoch 1053/2000
inary accuracy: 0.9033
Epoch 1054/2000
inary_accuracy: 0.9033
Epoch 1055/2000
1500/1500 [==============] - 0s - loss: 0.0843 - b
inary accuracy: 0.9033
Epoch 1056/2000
```

```
inary accuracy: 0.9033
Epoch 1057/2000
inary accuracy: 0.9033
Epoch 1058/2000
inary accuracy: 0.9033
Epoch 1059/2000
inary accuracy: 0.9033
Epoch 1060/2000
inary accuracy: 0.9033
Epoch 1061/2000
1500/1500 [==============] - 0s - loss: 0.0843 - b
inary accuracy: 0.9033
Epoch 1062/2000
inary accuracy: 0.9033
Epoch 1063/2000
inary_accuracy: 0.9033
Epoch 1064/2000
inary accuracy: 0.9033
Epoch 1065/2000
inary accuracy: 0.9033
Epoch 1066/2000
inary accuracy: 0.9033
Epoch 1067/2000
inary_accuracy: 0.9033
Epoch 1068/2000
inary accuracy: 0.9033
Epoch 1069/2000
inary accuracy: 0.9033
Epoch 1070/2000
inary_accuracy: 0.9033
Epoch 1071/2000
inary_accuracy: 0.9033
Epoch 1072/2000
inary accuracy: 0.9033
Epoch 1073/2000
inary_accuracy: 0.9033
Epoch 1074/2000
inary accuracy: 0.9033
Epoch 1075/2000
```

```
inary accuracy: 0.9033
Epoch 1076/2000
inary accuracy: 0.9033
Epoch 1077/2000
inary accuracy: 0.9033
Epoch 1078/2000
inary accuracy: 0.9033
Epoch 1079/2000
inary accuracy: 0.9033
Epoch 1080/2000
1500/1500 [==============] - 0s - loss: 0.0843 - b
inary accuracy: 0.9033
Epoch 1081/2000
inary accuracy: 0.9033
Epoch 1082/2000
inary_accuracy: 0.9033
Epoch 1083/2000
inary accuracy: 0.9033
Epoch 1084/2000
inary accuracy: 0.9033
Epoch 1085/2000
inary accuracy: 0.9033
Epoch 1086/2000
inary_accuracy: 0.9033
Epoch 1087/2000
inary accuracy: 0.9033
Epoch 1088/2000
inary accuracy: 0.9033
Epoch 1089/2000
inary_accuracy: 0.9033
Epoch 1090/2000
inary_accuracy: 0.9033
Epoch 1091/2000
inary accuracy: 0.9033
Epoch 1092/2000
inary_accuracy: 0.9033
Epoch 1093/2000
inary accuracy: 0.9033
Epoch 1094/2000
```

```
inary accuracy: 0.9033
Epoch 1095/2000
inary accuracy: 0.9033
Epoch 1096/2000
inary accuracy: 0.9033
Epoch 1097/2000
inary accuracy: 0.9033
Epoch 1098/2000
inary accuracy: 0.9033
Epoch 1099/2000
1500/1500 [==============] - 0s - loss: 0.0842 - b
inary accuracy: 0.9033
Epoch 1100/2000
inary accuracy: 0.9033
Epoch 1101/2000
inary_accuracy: 0.9033
Epoch 1102/2000
inary accuracy: 0.9033
Epoch 1103/2000
inary accuracy: 0.9033
Epoch 1104/2000
inary accuracy: 0.9033
Epoch 1105/2000
inary_accuracy: 0.9033
Epoch 1106/2000
inary accuracy: 0.9033
Epoch 1107/2000
inary accuracy: 0.9033
Epoch 1108/2000
inary_accuracy: 0.9033
Epoch 1109/2000
inary accuracy: 0.9033
Epoch 1110/2000
inary accuracy: 0.9033
Epoch 1111/2000
inary_accuracy: 0.9033
Epoch 1112/2000
inary accuracy: 0.9033
Epoch 1113/2000
```

```
inary accuracy: 0.9033
Epoch 1114/2000
inary accuracy: 0.9033
Epoch 1115/2000
inary accuracy: 0.9033
Epoch 1116/2000
inary accuracy: 0.9033
Epoch 1117/2000
1500/1500 [==============] - 0s - loss: 0.0842 - b
inary accuracy: 0.9033
Epoch 1118/2000
1500/1500 [==============] - 0s - loss: 0.0842 - b
inary accuracy: 0.9033
Epoch 1119/2000
inary accuracy: 0.9033
Epoch 1120/2000
inary_accuracy: 0.9033
Epoch 1121/2000
inary accuracy: 0.9033
Epoch 1122/2000
inary accuracy: 0.9033
Epoch 1123/2000
inary accuracy: 0.9033
Epoch 1124/2000
inary_accuracy: 0.9033
Epoch 1125/2000
inary accuracy: 0.9033
Epoch 1126/2000
inary_accuracy: 0.9033
Epoch 1127/2000
inary_accuracy: 0.9040
Epoch 1128/2000
inary_accuracy: 0.9033
Epoch 1129/2000
inary accuracy: 0.9040
Epoch 1130/2000
inary_accuracy: 0.9033
Epoch 1131/2000
inary accuracy: 0.9033
Epoch 1132/2000
```

```
inary accuracy: 0.9033
Epoch 1133/2000
inary accuracy: 0.9033
Epoch 1134/2000
inary accuracy: 0.9040
Epoch 1135/2000
inary accuracy: 0.9033
Epoch 1136/2000
inary accuracy: 0.9033
Epoch 1137/2000
1500/1500 [==============] - 0s - loss: 0.0841 - b
inary accuracy: 0.9033
Epoch 1138/2000
inary accuracy: 0.9033
Epoch 1139/2000
7 - binary_accuracy: 0.905 - 0s - loss: 0.0841 - binary_accuracy:
0.9033
Epoch 1140/2000
inary_accuracy: 0.9033
Epoch 1141/2000
1500/1500 [==============] - 0s - loss: 0.0841 - b
inary_accuracy: 0.9033
Epoch 1142/2000
inary_accuracy: 0.9033
Epoch 1143/2000
inary accuracy: 0.9040
Epoch 1144/2000
inary_accuracy: 0.9033
Epoch 1145/2000
inary accuracy: 0.9040
Epoch 1146/2000
inary accuracy: 0.9033
Epoch 1147/2000
inary_accuracy: 0.9033
Epoch 1148/2000
1500/1500 [==============] - 0s - loss: 0.0841 - b
inary accuracy: 0.9033
Epoch 1149/2000
inary accuracy: 0.9040
Epoch 1150/2000
1500/1500 [==============] - 0s - loss: 0.0841 - b
inary accuracy: 0.9033
Epoch 1151/2000
```

```
inary_accuracy: 0.9033
Epoch 1152/2000
1500/1500 [=============== ] - 0s - loss: 0.0841 - b
inary_accuracy: 0.9033
Epoch 1153/2000
inary_accuracy: 0.9040
Epoch 1154/2000
inary_accuracy: 0.9040
Epoch 1155/2000
inary_accuracy: 0.9040
Epoch 1156/2000
inary accuracy: 0.9040
Epoch 1157/2000
1500/1500 [=============== ] - 0s - loss: 0.0840 - b
inary_accuracy: 0.9040
Epoch 1158/2000
inary_accuracy: 0.9040
Epoch 1159/2000
inary_accuracy: 0.9033
Epoch 1160/2000
inary_accuracy: 0.9040
Epoch 1161/2000
inary_accuracy: 0.9033
Epoch 1162/2000
inary accuracy: 0.9040
Epoch 1163/2000
inary_accuracy: 0.9040
Epoch 1164/2000
inary_accuracy: 0.9040
Epoch 1165/2000
inary_accuracy: 0.9040
Epoch 1166/2000
inary_accuracy: 0.9040
Epoch 1167/2000
1500/1500 [==============] - 0s - loss: 0.0840 - b
inary accuracy: 0.9040
Epoch 1168/2000
inary accuracy: 0.9040
Epoch 1169/2000
inary accuracy: 0.9040
Epoch 1170/2000
```

```
inary_accuracy: 0.9040
Epoch 1171/2000
inary accuracy: 0.9040
Epoch 1172/2000
inary_accuracy: 0.9040
Epoch 1173/2000
inary_accuracy: 0.9040
Epoch 1174/2000
inary_accuracy: 0.9040
Epoch 1175/2000
inary accuracy: 0.9040
Epoch 1176/2000
1500/1500 [=============== ] - 0s - loss: 0.0840 - b
inary_accuracy: 0.9040
Epoch 1177/2000
inary_accuracy: 0.9040
Epoch 1178/2000
inary_accuracy: 0.9040
Epoch 1179/2000
inary_accuracy: 0.9040
Epoch 1180/2000
inary_accuracy: 0.9040
Epoch 1181/2000
inary accuracy: 0.9040
Epoch 1182/2000
inary_accuracy: 0.9040
Epoch 1183/2000
inary_accuracy: 0.9040
Epoch 1184/2000
inary_accuracy: 0.9040
Epoch 1185/2000
inary_accuracy: 0.9040
Epoch 1186/2000
1500/1500 [==============] - 0s - loss: 0.0840 - b
inary accuracy: 0.9040
Epoch 1187/2000
inary accuracy: 0.9040
Epoch 1188/2000
inary accuracy: 0.9040
Epoch 1189/2000
```

```
inary_accuracy: 0.9040
Epoch 1190/2000
inary_accuracy: 0.9040
Epoch 1191/2000
inary_accuracy: 0.9040
Epoch 1192/2000
inary_accuracy: 0.9040
Epoch 1193/2000
inary_accuracy: 0.9040
Epoch 1194/2000
inary accuracy: 0.9040
Epoch 1195/2000
1500/1500 [============== ] - 0s - loss: 0.0839 - b
inary_accuracy: 0.9040
Epoch 1196/2000
inary_accuracy: 0.9040
Epoch 1197/2000
inary_accuracy: 0.9040
Epoch 1198/2000
inary_accuracy: 0.9040
Epoch 1199/2000
inary_accuracy: 0.9040
Epoch 1200/2000
inary accuracy: 0.9040
Epoch 1201/2000
inary_accuracy: 0.9040
Epoch 1202/2000
inary_accuracy: 0.9040
Epoch 1203/2000
inary_accuracy: 0.9040
Epoch 1204/2000
inary_accuracy: 0.9040
Epoch 1205/2000
inary accuracy: 0.9040
Epoch 1206/2000
inary accuracy: 0.9040
Epoch 1207/2000
inary accuracy: 0.9040
Epoch 1208/2000
```

```
inary_accuracy: 0.9040
Epoch 1209/2000
inary accuracy: 0.9040
Epoch 1210/2000
inary_accuracy: 0.9040
Epoch 1211/2000
inary_accuracy: 0.9040
Epoch 1212/2000
1500/1500 [=============== ] - 0s - loss: 0.0839 - b
inary_accuracy: 0.9040
Epoch 1213/2000
inary accuracy: 0.9040
Epoch 1214/2000
1500/1500 [============== ] - 0s - loss: 0.0839 - b
inary_accuracy: 0.9040
Epoch 1215/2000
inary accuracy: 0.9040
Epoch 1216/2000
inary_accuracy: 0.9040
Epoch 1217/2000
inary_accuracy: 0.9040
Epoch 1218/2000
inary_accuracy: 0.9040
Epoch 1219/2000
inary accuracy: 0.9040
Epoch 1220/2000
inary_accuracy: 0.9040
Epoch 1221/2000
inary_accuracy: 0.9040
Epoch 1222/2000
inary_accuracy: 0.9040
Epoch 1223/2000
inary_accuracy: 0.9040
Epoch 1224/2000
inary accuracy: 0.9040
Epoch 1225/2000
inary accuracy: 0.9040
Epoch 1226/2000
1500/1500 [=============== ] - 0s - loss: 0.0839 - b
inary accuracy: 0.9047
Epoch 1227/2000
```

```
inary_accuracy: 0.9040
Epoch 1228/2000
inary accuracy: 0.9040
Epoch 1229/2000
inary_accuracy: 0.9040
Epoch 1230/2000
inary_accuracy: 0.9040
Epoch 1231/2000
1500/1500 [=============== ] - 0s - loss: 0.0839 - b
inary_accuracy: 0.9047
Epoch 1232/2000
inary accuracy: 0.9040
Epoch 1233/2000
1500/1500 [============== ] - 0s - loss: 0.0839 - b
inary_accuracy: 0.9040
Epoch 1234/2000
inary_accuracy: 0.9040
Epoch 1235/2000
inary_accuracy: 0.9040
Epoch 1236/2000
inary_accuracy: 0.9040
Epoch 1237/2000
inary_accuracy: 0.9047
Epoch 1238/2000
inary accuracy: 0.9040
Epoch 1239/2000
inary_accuracy: 0.9040
Epoch 1240/2000
inary_accuracy: 0.9040
Epoch 1241/2000
inary_accuracy: 0.9047
Epoch 1242/2000
inary_accuracy: 0.9040
Epoch 1243/2000
1500/1500 [==============] - 0s - loss: 0.0838 - b
inary accuracy: 0.9040
Epoch 1244/2000
inary accuracy: 0.9040
Epoch 1245/2000
inary accuracy: 0.9040
Epoch 1246/2000
```

```
inary_accuracy: 0.9040
Epoch 1247/2000
inary accuracy: 0.9040
Epoch 1248/2000
inary_accuracy: 0.9040
Epoch 1249/2000
1500/1500 [==============] - 0s - loss: 0.0838 - b
inary_accuracy: 0.9040
Epoch 1250/2000
inary_accuracy: 0.9047
Epoch 1251/2000
inary accuracy: 0.9040
Epoch 1252/2000
1500/1500 [==============] - 0s - loss: 0.0838 - b
inary_accuracy: 0.9047
Epoch 1253/2000
inary_accuracy: 0.9040
Epoch 1254/2000
inary_accuracy: 0.9040
Epoch 1255/2000
inary_accuracy: 0.9040
Epoch 1256/2000
inary_accuracy: 0.9040
Epoch 1257/2000
inary accuracy: 0.9040
Epoch 1258/2000
inary_accuracy: 0.9040
Epoch 1259/2000
inary_accuracy: 0.9040
Epoch 1260/2000
inary_accuracy: 0.9047
Epoch 1261/2000
inary_accuracy: 0.9040
Epoch 1262/2000
1500/1500 [==============] - 0s - loss: 0.0838 - b
inary accuracy: 0.9040
Epoch 1263/2000
inary accuracy: 0.9040
Epoch 1264/2000
inary accuracy: 0.9040
Epoch 1265/2000
```

```
inary_accuracy: 0.9040
Epoch 1266/2000
inary accuracy: 0.9047
Epoch 1267/2000
inary_accuracy: 0.9040
Epoch 1268/2000
inary_accuracy: 0.9040
Epoch 1269/2000
inary_accuracy: 0.9047
Epoch 1270/2000
inary accuracy: 0.9047
Epoch 1271/2000
1500/1500 [==============] - 0s - loss: 0.0838 - b
inary_accuracy: 0.9047
Epoch 1272/2000
inary_accuracy: 0.9040
Epoch 1273/2000
inary_accuracy: 0.9040
Epoch 1274/2000
inary_accuracy: 0.9047
Epoch 1275/2000
inary_accuracy: 0.9047
Epoch 1276/2000
inary accuracy: 0.9033
Epoch 1277/2000
inary_accuracy: 0.9047
Epoch 1278/2000
inary_accuracy: 0.9047
Epoch 1279/2000
inary_accuracy: 0.9047
Epoch 1280/2000
inary_accuracy: 0.9047
Epoch 1281/2000
1500/1500 [==============] - 0s - loss: 0.0837 - b
inary accuracy: 0.9047
Epoch 1282/2000
1500/1500 [=============== ] - 0s - loss: 0.0837 - b
inary accuracy: 0.9047
Epoch 1283/2000
inary accuracy: 0.9040
Epoch 1284/2000
```

```
inary_accuracy: 0.9047
Epoch 1285/2000
inary_accuracy: 0.9047
Epoch 1286/2000
inary_accuracy: 0.9047
Epoch 1287/2000
inary_accuracy: 0.9040
Epoch 1288/2000
inary accuracy: 0.9040
Epoch 1289/2000
inary accuracy: 0.9040
Epoch 1290/2000
1500/1500 [============== ] - 0s - loss: 0.0837 - b
inary_accuracy: 0.9047
Epoch 1291/2000
inary accuracy: 0.9047
Epoch 1292/2000
inary_accuracy: 0.9047
Epoch 1293/2000
inary_accuracy: 0.9047
Epoch 1294/2000
inary_accuracy: 0.9047
Epoch 1295/2000
inary accuracy: 0.9047
Epoch 1296/2000
inary_accuracy: 0.9040
Epoch 1297/2000
inary_accuracy: 0.9040
Epoch 1298/2000
inary_accuracy: 0.9040
Epoch 1299/2000
1500/1500 [==============] - 0s - loss: 0.0837 - b
inary_accuracy: 0.9047
Epoch 1300/2000
1500/1500 [==============] - 0s - loss: 0.0837 - b
inary accuracy: 0.9040
Epoch 1301/2000
1500/1500 [=============== ] - 0s - loss: 0.0837 - b
inary accuracy: 0.9047
Epoch 1302/2000
inary accuracy: 0.9047
Epoch 1303/2000
```

```
inary_accuracy: 0.9047
Epoch 1304/2000
inary accuracy: 0.9047
Epoch 1305/2000
inary_accuracy: 0.9047
Epoch 1306/2000
1500/1500 [============== ] - 0s - loss: 0.0837 - b
inary_accuracy: 0.9047
Epoch 1307/2000
inary accuracy: 0.9047
Epoch 1308/2000
inary accuracy: 0.9047
Epoch 1309/2000
1500/1500 [============== ] - 0s - loss: 0.0837 - b
inary_accuracy: 0.9040
Epoch 1310/2000
inary accuracy: 0.9040
Epoch 1311/2000
inary_accuracy: 0.9047
Epoch 1312/2000
inary_accuracy: 0.9040
Epoch 1313/2000
inary_accuracy: 0.9047
Epoch 1314/2000
inary accuracy: 0.9047
Epoch 1315/2000
inary_accuracy: 0.9047
Epoch 1316/2000
inary_accuracy: 0.9040
Epoch 1317/2000
inary_accuracy: 0.9047
Epoch 1318/2000
inary_accuracy: 0.9047
Epoch 1319/2000
1500/1500 [==============] - 0s - loss: 0.0836 - b
inary accuracy: 0.9047
Epoch 1320/2000
inary accuracy: 0.9040
Epoch 1321/2000
inary accuracy: 0.9040
Epoch 1322/2000
```

```
inary_accuracy: 0.9047
Epoch 1323/2000
1500/1500 [=============== ] - 0s - loss: 0.0836 - b
inary accuracy: 0.9040
Epoch 1324/2000
inary_accuracy: 0.9047
Epoch 1325/2000
inary_accuracy: 0.9047
Epoch 1326/2000
1500/1500 [=============== ] - 0s - loss: 0.0836 - b
inary_accuracy: 0.9047
Epoch 1327/2000
inary accuracy: 0.9047
Epoch 1328/2000
1500/1500 [==============] - 0s - loss: 0.0836 - b
inary_accuracy: 0.9047
Epoch 1329/2000
inary accuracy: 0.9040
Epoch 1330/2000
inary_accuracy: 0.9040
Epoch 1331/2000
inary_accuracy: 0.9040
Epoch 1332/2000
inary_accuracy: 0.9040
Epoch 1333/2000
inary accuracy: 0.9047
Epoch 1334/2000
inary_accuracy: 0.9047
Epoch 1335/2000
inary_accuracy: 0.9040
Epoch 1336/2000
inary_accuracy: 0.9047
Epoch 1337/2000
inary_accuracy: 0.9047
Epoch 1338/2000
1500/1500 [==============] - 0s - loss: 0.0836 - b
inary accuracy: 0.9040
Epoch 1339/2000
inary accuracy: 0.9040
Epoch 1340/2000
inary accuracy: 0.9047
Epoch 1341/2000
```

```
inary_accuracy: 0.9047
Epoch 1342/2000
1500/1500 [=============== ] - 0s - loss: 0.0836 - b
inary accuracy: 0.9040
Epoch 1343/2000
inary_accuracy: 0.9040
Epoch 1344/2000
inary_accuracy: 0.9047
Epoch 1345/2000
inary_accuracy: 0.9040
Epoch 1346/2000
inary accuracy: 0.9047
Epoch 1347/2000
1500/1500 [==============] - 0s - loss: 0.0836 - b
inary_accuracy: 0.9040
Epoch 1348/2000
inary_accuracy: 0.9040
Epoch 1349/2000
inary_accuracy: 0.9047
Epoch 1350/2000
inary_accuracy: 0.9040
Epoch 1351/2000
inary_accuracy: 0.9040
Epoch 1352/2000
inary accuracy: 0.9047
Epoch 1353/2000
inary_accuracy: 0.9047
Epoch 1354/2000
inary_accuracy: 0.9040
Epoch 1355/2000
inary_accuracy: 0.9040
Epoch 1356/2000
inary_accuracy: 0.9047
Epoch 1357/2000
1500/1500 [==============] - 0s - loss: 0.0836 - b
inary accuracy: 0.9047
Epoch 1358/2000
inary accuracy: 0.9040
Epoch 1359/2000
inary_accuracy: 0.9040
Epoch 1360/2000
```

```
inary_accuracy: 0.9040
Epoch 1361/2000
1500/1500 [=============== ] - 0s - loss: 0.0836 - b
inary accuracy: 0.9040
Epoch 1362/2000
inary_accuracy: 0.9040
Epoch 1363/2000
1500/1500 [==============] - 0s - loss: 0.0836 - b
inary_accuracy: 0.9040
Epoch 1364/2000
inary_accuracy: 0.9040
Epoch 1365/2000
inary accuracy: 0.9040
Epoch 1366/2000
1500/1500 [============== ] - 0s - loss: 0.0835 - b
inary_accuracy: 0.9047
Epoch 1367/2000
inary accuracy: 0.9040
Epoch 1368/2000
inary_accuracy: 0.9047
Epoch 1369/2000
inary_accuracy: 0.9040
Epoch 1370/2000
inary_accuracy: 0.9047
Epoch 1371/2000
inary accuracy: 0.9040
Epoch 1372/2000
inary_accuracy: 0.9040
Epoch 1373/2000
inary_accuracy: 0.9040
Epoch 1374/2000
inary_accuracy: 0.9040
Epoch 1375/2000
inary_accuracy: 0.9047
Epoch 1376/2000
1500/1500 [==============] - 0s - loss: 0.0835 - b
inary accuracy: 0.9040
Epoch 1377/2000
inary accuracy: 0.9040
Epoch 1378/2000
inary accuracy: 0.9047
Epoch 1379/2000
```

```
inary_accuracy: 0.9040
Epoch 1380/2000
inary accuracy: 0.9040
Epoch 1381/2000
inary_accuracy: 0.9047
Epoch 1382/2000
1500/1500 [============== ] - 0s - loss: 0.0835 - b
inary_accuracy: 0.9040
Epoch 1383/2000
inary_accuracy: 0.9040
Epoch 1384/2000
inary accuracy: 0.9047
Epoch 1385/2000
1500/1500 [============== ] - 0s - loss: 0.0835 - b
inary_accuracy: 0.9040
Epoch 1386/2000
inary accuracy: 0.9040
Epoch 1387/2000
inary_accuracy: 0.9047
Epoch 1388/2000
inary_accuracy: 0.9047
Epoch 1389/2000
inary_accuracy: 0.9040
Epoch 1390/2000
inary accuracy: 0.9040
Epoch 1391/2000
inary_accuracy: 0.9040
Epoch 1392/2000
inary_accuracy: 0.9040
Epoch 1393/2000
inary_accuracy: 0.9040
Epoch 1394/2000
inary_accuracy: 0.9040
Epoch 1395/2000
1500/1500 [==============] - 0s - loss: 0.0835 - b
inary accuracy: 0.9040
Epoch 1396/2000
inary accuracy: 0.9040
Epoch 1397/2000
inary accuracy: 0.9040
Epoch 1398/2000
```

```
inary_accuracy: 0.9040
Epoch 1399/2000
inary_accuracy: 0.9040
Epoch 1400/2000
inary_accuracy: 0.9040
Epoch 1401/2000
inary_accuracy: 0.9040
Epoch 1402/2000
inary accuracy: 0.9040
Epoch 1403/2000
inary accuracy: 0.9040
Epoch 1404/2000
1500/1500 [============== ] - 0s - loss: 0.0835 - b
inary_accuracy: 0.9040
Epoch 1405/2000
inary accuracy: 0.9040
Epoch 1406/2000
inary_accuracy: 0.9040
Epoch 1407/2000
inary_accuracy: 0.9040
Epoch 1408/2000
inary_accuracy: 0.9040
Epoch 1409/2000
inary accuracy: 0.9040
Epoch 1410/2000
inary_accuracy: 0.9040
Epoch 1411/2000
inary_accuracy: 0.9040
Epoch 1412/2000
inary_accuracy: 0.9047
Epoch 1413/2000
inary_accuracy: 0.9040
Epoch 1414/2000
1500/1500 [==============] - 0s - loss: 0.0834 - b
inary accuracy: 0.9040
Epoch 1415/2000
inary accuracy: 0.9040
Epoch 1416/2000
inary accuracy: 0.9040
Epoch 1417/2000
```

```
inary_accuracy: 0.9040
Epoch 1418/2000
1500/1500 [============== ] - 0s - loss: 0.0834 - b
inary_accuracy: 0.9040
Epoch 1419/2000
inary_accuracy: 0.9040
Epoch 1420/2000
inary_accuracy: 0.9040
Epoch 1421/2000
inary_accuracy: 0.9040
Epoch 1422/2000
inary accuracy: 0.9040
Epoch 1423/2000
1500/1500 [=============== ] - 0s - loss: 0.0834 - b
inary_accuracy: 0.9040
Epoch 1424/2000
inary accuracy: 0.9040
Epoch 1425/2000
inary_accuracy: 0.9040
Epoch 1426/2000
acy: 0.909
Epoch 1427/2000
1500/1500 [==============] - 0s - loss: 0.0834 - b
inary_accuracy: 0.9040
Epoch 1428/2000
inary accuracy: 0.9040
Epoch 1429/2000
inary accuracy: 0.9040
Epoch 1430/2000
inary accuracy: 0.9040
Epoch 1431/2000
inary accuracy: 0.9040
Epoch 1432/2000
inary accuracy: 0.9040
Epoch 1433/2000
inary_accuracy: 0.9047
Epoch 1434/2000
inary accuracy: 0.9040
Epoch 1435/2000
1500/1500 [==============] - 0s - loss: 0.0834 - b
inary_accuracy: 0.9040
```

```
Epoch 1436/2000
inary accuracy: 0.9040
Epoch 1437/2000
inary accuracy: 0.9040
Epoch 1438/2000
inary accuracy: 0.9040
Epoch 1439/2000
inary accuracy: 0.9040
Epoch 1440/2000
inary accuracy: 0.9040
Epoch 1441/2000
inary accuracy: 0.9040
Epoch 1442/2000
inary accuracy: 0.9040
Epoch 1443/2000
1500/1500 [==============] - 0s - loss: 0.0834 - b
inary accuracy: 0.9040
Epoch 1444/2000
inary accuracy: 0.9040
Epoch 1445/2000
inary accuracy: 0.9040
Epoch 1446/2000
inary_accuracy: 0.9040
Epoch 1447/2000
inary accuracy: 0.9040
Epoch 1448/2000
inary accuracy: 0.9040
Epoch 1449/2000
inary accuracy: 0.9040
Epoch 1450/2000
inary accuracy: 0.9040
Epoch 1451/2000
inary accuracy: 0.9040
Epoch 1452/2000
inary_accuracy: 0.9040
Epoch 1453/2000
inary accuracy: 0.9040
Epoch 1454/2000
inary_accuracy: 0.9040
```

```
Epoch 1455/2000
inary accuracy: 0.9040
Epoch 1456/2000
inary accuracy: 0.9040
Epoch 1457/2000
inary accuracy: 0.9047
Epoch 1458/2000
inary accuracy: 0.9040
Epoch 1459/2000
inary accuracy: 0.9040
Epoch 1460/2000
inary accuracy: 0.9040
Epoch 1461/2000
inary accuracy: 0.9040
Epoch 1462/2000
1500/1500 [==============] - 0s - loss: 0.0834 - b
inary accuracy: 0.9040
Epoch 1463/2000
inary accuracy: 0.9040
Epoch 1464/2000
inary accuracy: 0.9040
Epoch 1465/2000
inary_accuracy: 0.9040
Epoch 1466/2000
inary accuracy: 0.9040
Epoch 1467/2000
inary accuracy: 0.9040
Epoch 1468/2000
inary accuracy: 0.9040
Epoch 1469/2000
inary accuracy: 0.9040
Epoch 1470/2000
inary accuracy: 0.9040
Epoch 1471/2000
inary_accuracy: 0.9040
Epoch 1472/2000
inary accuracy: 0.9040
Epoch 1473/2000
inary_accuracy: 0.9040
```

```
Epoch 1474/2000
inary accuracy: 0.9040
Epoch 1475/2000
inary accuracy: 0.9040
Epoch 1476/2000
inary accuracy: 0.9040
Epoch 1477/2000
inary accuracy: 0.9040
Epoch 1478/2000
inary accuracy: 0.9040
Epoch 1479/2000
1500/1500 [==============] - 0s - loss: 0.0833 - b
inary accuracy: 0.9040
Epoch 1480/2000
inary accuracy: 0.9040
Epoch 1481/2000
1500/1500 [==============] - 0s - loss: 0.0833 - b
inary accuracy: 0.9040
Epoch 1482/2000
inary accuracy: 0.9040
Epoch 1483/2000
inary accuracy: 0.9040
Epoch 1484/2000
inary_accuracy: 0.9040
Epoch 1485/2000
inary accuracy: 0.9040
Epoch 1486/2000
inary accuracy: 0.9040
Epoch 1487/2000
inary accuracy: 0.9040
Epoch 1488/2000
inary accuracy: 0.9040
Epoch 1489/2000
inary accuracy: 0.9040
Epoch 1490/2000
inary_accuracy: 0.9040
Epoch 1491/2000
inary accuracy: 0.9040
Epoch 1492/2000
inary_accuracy: 0.9040
```

```
Epoch 1493/2000
inary accuracy: 0.9040
Epoch 1494/2000
inary accuracy: 0.9040
Epoch 1495/2000
inary accuracy: 0.9040
Epoch 1496/2000
inary accuracy: 0.9040
Epoch 1497/2000
inary_accuracy: 0.9040
Epoch 1498/2000
inary accuracy: 0.9040
Epoch 1499/2000
inary accuracy: 0.9040
Epoch 1500/2000
1500/1500 [============== ] - 0s - loss: 0.0833 - b
inary accuracy: 0.9040 - ETA: 0s - loss: 0.0879 - binary accur
acy: 0.899
Epoch 1501/2000
inary accuracy: 0.9040
Epoch 1502/2000
inary accuracy: 0.9040
Epoch 1503/2000
inary_accuracy: 0.9040
Epoch 1504/2000
inary_accuracy: 0.9040
Epoch 1505/2000
inary_accuracy: 0.9040
Epoch 1506/2000
inary_accuracy: 0.9040
Epoch 1507/2000
inary_accuracy: 0.9040
Epoch 1508/2000
inary accuracy: 0.9040
Epoch 1509/2000
inary_accuracy: 0.9040
Epoch 1510/2000
inary accuracy: 0.9040
Epoch 1511/2000
```

```
inary accuracy: 0.9040
Epoch 1512/2000
inary accuracy: 0.9040
Epoch 1513/2000
inary accuracy: 0.9040
Epoch 1514/2000
inary accuracy: 0.9040
Epoch 1515/2000
inary accuracy: 0.9040
Epoch 1516/2000
inary accuracy: 0.9040
Epoch 1517/2000
inary accuracy: 0.9040
Epoch 1518/2000
inary_accuracy: 0.9040
Epoch 1519/2000
inary accuracy: 0.9040
Epoch 1520/2000
inary accuracy: 0.9040
Epoch 1521/2000
inary accuracy: 0.9040
Epoch 1522/2000
inary_accuracy: 0.9040
Epoch 1523/2000
1500/1500 [=============== ] - 0s - loss: 0.0832 - b
inary_accuracy: 0.9040
Epoch 1524/2000
inary_accuracy: 0.9040
Epoch 1525/2000
inary_accuracy: 0.9040
Epoch 1526/2000
inary_accuracy: 0.9040
Epoch 1527/2000
inary accuracy: 0.9040
Epoch 1528/2000
inary_accuracy: 0.9040
Epoch 1529/2000
inary accuracy: 0.9040
Epoch 1530/2000
```

```
inary accuracy: 0.9040
Epoch 1531/2000
inary accuracy: 0.9040
Epoch 1532/2000
inary accuracy: 0.9040
Epoch 1533/2000
inary accuracy: 0.9040
Epoch 1534/2000
inary accuracy: 0.9040
Epoch 1535/2000
1500/1500 [==============] - 0s - loss: 0.0832 - b
inary accuracy: 0.9040
Epoch 1536/2000
inary accuracy: 0.9040
Epoch 1537/2000
inary_accuracy: 0.9040
Epoch 1538/2000
inary accuracy: 0.9040
Epoch 1539/2000
inary accuracy: 0.9040
Epoch 1540/2000
inary accuracy: 0.9040
Epoch 1541/2000
inary_accuracy: 0.9040
Epoch 1542/2000
1500/1500 [=============== ] - 0s - loss: 0.0832 - b
inary_accuracy: 0.9040
Epoch 1543/2000
inary_accuracy: 0.9040
Epoch 1544/2000
inary_accuracy: 0.9040
Epoch 1545/2000
inary_accuracy: 0.9040
Epoch 1546/2000
inary accuracy: 0.9040
Epoch 1547/2000
inary_accuracy: 0.9040
Epoch 1548/2000
1500/1500 [==============] - 0s - loss: 0.0832 - b
inary accuracy: 0.9040
Epoch 1549/2000
```

```
inary accuracy: 0.9040
Epoch 1550/2000
inary accuracy: 0.9040
Epoch 1551/2000
inary accuracy: 0.9040
Epoch 1552/2000
inary accuracy: 0.9040
Epoch 1553/2000
inary accuracy: 0.9040
Epoch 1554/2000
1500/1500 [==============] - 0s - loss: 0.0832 - b
inary accuracy: 0.9040
Epoch 1555/2000
inary accuracy: 0.9040
Epoch 1556/2000
inary_accuracy: 0.9040
Epoch 1557/2000
inary accuracy: 0.9040
Epoch 1558/2000
inary accuracy: 0.9040
Epoch 1559/2000
inary accuracy: 0.9040
Epoch 1560/2000
inary_accuracy: 0.9040
Epoch 1561/2000
1500/1500 [=============== ] - 0s - loss: 0.0832 - b
inary_accuracy: 0.9040
Epoch 1562/2000
inary_accuracy: 0.9040
Epoch 1563/2000
inary_accuracy: 0.9040
Epoch 1564/2000
inary_accuracy: 0.9040
Epoch 1565/2000
inary accuracy: 0.9040
Epoch 1566/2000
inary_accuracy: 0.9040
Epoch 1567/2000
inary accuracy: 0.9040
Epoch 1568/2000
```

```
inary accuracy: 0.9040
Epoch 1569/2000
inary accuracy: 0.9040
Epoch 1570/2000
inary accuracy: 0.9040
Epoch 1571/2000
inary accuracy: 0.9040
Epoch 1572/2000
inary accuracy: 0.9040
Epoch 1573/2000
1500/1500 [==============] - 0s - loss: 0.0832 - b
inary accuracy: 0.9040
Epoch 1574/2000
inary accuracy: 0.9040
Epoch 1575/2000
inary_accuracy: 0.9040
Epoch 1576/2000
inary accuracy: 0.9040
Epoch 1577/2000
inary accuracy: 0.9040
Epoch 1578/2000
inary accuracy: 0.9040
Epoch 1579/2000
inary_accuracy: 0.9040
Epoch 1580/2000
1500/1500 [=============== ] - 0s - loss: 0.0831 - b
inary_accuracy: 0.9040
Epoch 1581/2000
inary_accuracy: 0.9040
Epoch 1582/2000
inary_accuracy: 0.9040
Epoch 1583/2000
inary_accuracy: 0.9040
Epoch 1584/2000
inary accuracy: 0.9040
Epoch 1585/2000
inary_accuracy: 0.9040
Epoch 1586/2000
inary accuracy: 0.9040
Epoch 1587/2000
```

```
inary accuracy: 0.9040
Epoch 1588/2000
inary accuracy: 0.9040
Epoch 1589/2000
inary accuracy: 0.9040
Epoch 1590/2000
inary accuracy: 0.9040
Epoch 1591/2000
inary accuracy: 0.9040
Epoch 1592/2000
inary accuracy: 0.9040
Epoch 1593/2000
inary accuracy: 0.9040
Epoch 1594/2000
inary_accuracy: 0.9040
Epoch 1595/2000
inary accuracy: 0.9040
Epoch 1596/2000
inary accuracy: 0.9040
Epoch 1597/2000
inary accuracy: 0.9040
Epoch 1598/2000
inary_accuracy: 0.9040
Epoch 1599/2000
1500/1500 [=============== ] - 0s - loss: 0.0831 - b
inary accuracy: 0.9040
Epoch 1600/2000
inary_accuracy: 0.9040
Epoch 1601/2000
inary_accuracy: 0.9040
Epoch 1602/2000
inary_accuracy: 0.9040
Epoch 1603/2000
inary accuracy: 0.9040
Epoch 1604/2000
inary_accuracy: 0.9040
Epoch 1605/2000
inary_accuracy: 0.9040
Epoch 1606/2000
```

```
inary accuracy: 0.9040
Epoch 1607/2000
inary accuracy: 0.9040
Epoch 1608/2000
inary accuracy: 0.9040
Epoch 1609/2000
inary accuracy: 0.9040
Epoch 1610/2000
inary accuracy: 0.9040
Epoch 1611/2000
inary accuracy: 0.9040
Epoch 1612/2000
inary accuracy: 0.9040
Epoch 1613/2000
inary_accuracy: 0.9040
Epoch 1614/2000
inary accuracy: 0.9040
Epoch 1615/2000
inary accuracy: 0.9040
Epoch 1616/2000
inary accuracy: 0.9040
Epoch 1617/2000
inary_accuracy: 0.9040
Epoch 1618/2000
inary accuracy: 0.9040
Epoch 1619/2000
inary accuracy: 0.9040
Epoch 1620/2000
inary_accuracy: 0.9040
Epoch 1621/2000
inary accuracy: 0.9040
Epoch 1622/2000
inary accuracy: 0.9040
Epoch 1623/2000
inary_accuracy: 0.9040
Epoch 1624/2000
inary_accuracy: 0.9040
Epoch 1625/2000
```

```
inary accuracy: 0.9040
Epoch 1626/2000
inary accuracy: 0.9040
Epoch 1627/2000
1500/1500 [=============== ] - 0s - loss: 0.0831 - b
inary accuracy: 0.9040
Epoch 1628/2000
inary accuracy: 0.9040
Epoch 1629/2000
inary accuracy: 0.9040
Epoch 1630/2000
inary accuracy: 0.9040
Epoch 1631/2000
inary accuracy: 0.9040
Epoch 1632/2000
inary_accuracy: 0.9040
Epoch 1633/2000
inary accuracy: 0.9040
Epoch 1634/2000
inary accuracy: 0.9040
Epoch 1635/2000
inary accuracy: 0.9040
Epoch 1636/2000
inary_accuracy: 0.9040
Epoch 1637/2000
inary accuracy: 0.9040
Epoch 1638/2000
inary accuracy: 0.9040
Epoch 1639/2000
inary_accuracy: 0.9040
Epoch 1640/2000
inary accuracy: 0.9040
Epoch 1641/2000
inary accuracy: 0.9040
Epoch 1642/2000
inary_accuracy: 0.9040
Epoch 1643/2000
inary_accuracy: 0.9040
Epoch 1644/2000
```

```
inary accuracy: 0.9040
Epoch 1645/2000
inary accuracy: 0.9040
Epoch 1646/2000
inary accuracy: 0.9040
Epoch 1647/2000
inary accuracy: 0.9040
Epoch 1648/2000
inary accuracy: 0.9040
Epoch 1649/2000
inary accuracy: 0.9040
Epoch 1650/2000
inary accuracy: 0.9040
Epoch 1651/2000
inary_accuracy: 0.9040
Epoch 1652/2000
inary accuracy: 0.9040
Epoch 1653/2000
inary accuracy: 0.9040
Epoch 1654/2000
inary accuracy: 0.9040
Epoch 1655/2000
inary_accuracy: 0.9040
Epoch 1656/2000
inary accuracy: 0.9040
Epoch 1657/2000
inary accuracy: 0.9040
Epoch 1658/2000
inary_accuracy: 0.9040
Epoch 1659/2000
inary_accuracy: 0.9040
Epoch 1660/2000
inary accuracy: 0.9040
Epoch 1661/2000
inary_accuracy: 0.9040
Epoch 1662/2000
inary_accuracy: 0.9040
Epoch 1663/2000
```

```
inary accuracy: 0.9040
Epoch 1664/2000
inary accuracy: 0.9040
Epoch 1665/2000
inary accuracy: 0.9040
Epoch 1666/2000
inary accuracy: 0.9040
Epoch 1667/2000
inary accuracy: 0.9040
Epoch 1668/2000
inary accuracy: 0.9040
Epoch 1669/2000
inary accuracy: 0.9040
Epoch 1670/2000
inary_accuracy: 0.9040
Epoch 1671/2000
inary accuracy: 0.9040
Epoch 1672/2000
inary accuracy: 0.9040
Epoch 1673/2000
inary accuracy: 0.9040
Epoch 1674/2000
inary_accuracy: 0.9040
Epoch 1675/2000
inary accuracy: 0.9040
Epoch 1676/2000
inary accuracy: 0.9040
Epoch 1677/2000
inary_accuracy: 0.9040
Epoch 1678/2000
inary_accuracy: 0.9040
Epoch 1679/2000
inary accuracy: 0.9040
Epoch 1680/2000
inary_accuracy: 0.9040
Epoch 1681/2000
inary accuracy: 0.9040
Epoch 1682/2000
```

```
inary accuracy: 0.9040
Epoch 1683/2000
inary accuracy: 0.9040
Epoch 1684/2000
inary accuracy: 0.9040
Epoch 1685/2000
inary accuracy: 0.9040
Epoch 1686/2000
inary accuracy: 0.9040
Epoch 1687/2000
inary accuracy: 0.9040
Epoch 1688/2000
inary accuracy: 0.9040
Epoch 1689/2000
inary_accuracy: 0.9040
Epoch 1690/2000
inary accuracy: 0.9040
Epoch 1691/2000
inary accuracy: 0.9040
Epoch 1692/2000
inary accuracy: 0.9040
Epoch 1693/2000
inary_accuracy: 0.9040
Epoch 1694/2000
inary_accuracy: 0.9040
Epoch 1695/2000
inary_accuracy: 0.9040
Epoch 1696/2000
inary_accuracy: 0.9040
Epoch 1697/2000
1500/1500 [==============] - 0s - loss: 0.0829 - b
inary_accuracy: 0.9040
Epoch 1698/2000
inary accuracy: 0.9040
Epoch 1699/2000
inary_accuracy: 0.9040
Epoch 1700/2000
1500/1500 [==============] - 0s - loss: 0.0829 - b
inary_accuracy: 0.9040
Epoch 1701/2000
```

```
inary accuracy: 0.9040
Epoch 1702/2000
inary accuracy: 0.9040
Epoch 1703/2000
inary accuracy: 0.9040
Epoch 1704/2000
inary accuracy: 0.9040
Epoch 1705/2000
inary accuracy: 0.9040
Epoch 1706/2000
1500/1500 [==============] - 0s - loss: 0.0829 - b
inary accuracy: 0.9040
Epoch 1707/2000
inary accuracy: 0.9040
Epoch 1708/2000
inary_accuracy: 0.9040
Epoch 1709/2000
inary accuracy: 0.9040
Epoch 1710/2000
inary accuracy: 0.9040
Epoch 1711/2000
inary accuracy: 0.9040
Epoch 1712/2000
inary_accuracy: 0.9040
Epoch 1713/2000
inary accuracy: 0.9040
Epoch 1714/2000
inary accuracy: 0.9040
Epoch 1715/2000
inary_accuracy: 0.9040
Epoch 1716/2000
1500/1500 [==============] - 0s - loss: 0.0829 - b
inary accuracy: 0.9040
Epoch 1717/2000
inary accuracy: 0.9040
Epoch 1718/2000
inary_accuracy: 0.9040
Epoch 1719/2000
1500/1500 [==============] - 0s - loss: 0.0829 - b
inary_accuracy: 0.9040
Epoch 1720/2000
```

```
inary accuracy: 0.9040
Epoch 1721/2000
inary accuracy: 0.9040
Epoch 1722/2000
inary accuracy: 0.9040
Epoch 1723/2000
inary accuracy: 0.9040
Epoch 1724/2000
1500/1500 [==============] - 0s - loss: 0.0829 - b
inary accuracy: 0.9040
Epoch 1725/2000
1500/1500 [==============] - 0s - loss: 0.0829 - b
inary accuracy: 0.9040
Epoch 1726/2000
inary accuracy: 0.9040
Epoch 1727/2000
inary_accuracy: 0.9040
Epoch 1728/2000
inary accuracy: 0.9040
Epoch 1729/2000
inary accuracy: 0.9040
Epoch 1730/2000
inary accuracy: 0.9040
Epoch 1731/2000
inary_accuracy: 0.9040
Epoch 1732/2000
inary_accuracy: 0.9040
Epoch 1733/2000
inary accuracy: 0.9040
Epoch 1734/2000
inary_accuracy: 0.9040
Epoch 1735/2000
inary_accuracy: 0.9040
Epoch 1736/2000
inary accuracy: 0.9040
Epoch 1737/2000
inary_accuracy: 0.9040
Epoch 1738/2000
1500/1500 [==============] - 0s - loss: 0.0829 - b
inary accuracy: 0.9040
Epoch 1739/2000
```

```
inary accuracy: 0.9040
Epoch 1740/2000
inary accuracy: 0.9040
Epoch 1741/2000
inary accuracy: 0.9040
Epoch 1742/2000
inary accuracy: 0.9040
Epoch 1743/2000
inary accuracy: 0.9040
Epoch 1744/2000
1500/1500 [==============] - 0s - loss: 0.0829 - b
inary accuracy: 0.9040
Epoch 1745/2000
inary accuracy: 0.9040
Epoch 1746/2000
inary_accuracy: 0.9040
Epoch 1747/2000
inary accuracy: 0.9040
Epoch 1748/2000
inary accuracy: 0.9040
Epoch 1749/2000
inary accuracy: 0.9040
Epoch 1750/2000
inary_accuracy: 0.9040
Epoch 1751/2000
inary_accuracy: 0.9040
Epoch 1752/2000
inary_accuracy: 0.9040
Epoch 1753/2000
inary_accuracy: 0.9040
Epoch 1754/2000
inary_accuracy: 0.9040
Epoch 1755/2000
inary accuracy: 0.9040
Epoch 1756/2000
inary_accuracy: 0.9040
Epoch 1757/2000
inary accuracy: 0.9040
Epoch 1758/2000
```

```
inary accuracy: 0.9040
Epoch 1759/2000
1500/1500 [=============== ] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1760/2000
1500/1500 [=============== ] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1761/2000
inary accuracy: 0.9040
Epoch 1762/2000
inary accuracy: 0.9040
Epoch 1763/2000
1500/1500 [==============] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1764/2000
inary accuracy: 0.9040
Epoch 1765/2000
inary_accuracy: 0.9040
Epoch 1766/2000
inary accuracy: 0.9040
Epoch 1767/2000
1500/1500 [=============== ] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1768/2000
inary accuracy: 0.9040
Epoch 1769/2000
inary_accuracy: 0.9040
Epoch 1770/2000
inary accuracy: 0.9040
Epoch 1771/2000
inary_accuracy: 0.9040
Epoch 1772/2000
inary_accuracy: 0.9040
Epoch 1773/2000
inary_accuracy: 0.9040
Epoch 1774/2000
inary accuracy: 0.9040
Epoch 1775/2000
1500/1500 [=============== ] - 0s - loss: 0.0828 - b
inary_accuracy: 0.9040
Epoch 1776/2000
inary accuracy: 0.9040
Epoch 1777/2000
```

```
inary accuracy: 0.9040
Epoch 1778/2000
1500/1500 [=============== ] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1779/2000
1500/1500 [=============== ] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1780/2000
inary_accuracy: 0.9040
Epoch 1781/2000
inary accuracy: 0.9040
Epoch 1782/2000
1500/1500 [==============] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1783/2000
1500/1500 [=============== ] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1784/2000
inary_accuracy: 0.9040
Epoch 1785/2000
inary accuracy: 0.9040
Epoch 1786/2000
inary accuracy: 0.9040
Epoch 1787/2000
inary accuracy: 0.9040
Epoch 1788/2000
inary_accuracy: 0.9040
Epoch 1789/2000
1500/1500 [=============== ] - 0s - loss: 0.0828 - b
inary_accuracy: 0.9040
Epoch 1790/2000
inary accuracy: 0.9040
Epoch 1791/2000
inary accuracy: 0.9040 - ETA: 0s - loss: 0.0841 - binary accur
acy: 0.902
Epoch 1792/2000
inary_accuracy: 0.9040
Epoch 1793/2000
1500/1500 [==============] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1794/2000
1500/1500 [=============== ] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1795/2000
1500/1500 [==============] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1796/2000
```

```
inary_accuracy: 0.9040
Epoch 1797/2000
1500/1500 [=============== ] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1798/2000
inary_accuracy: 0.9040
Epoch 1799/2000
inary_accuracy: 0.9040
Epoch 1800/2000
inary_accuracy: 0.9040
Epoch 1801/2000
inary accuracy: 0.9040
Epoch 1802/2000
1500/1500 [==============] - 0s - loss: 0.0828 - b
inary_accuracy: 0.9040
Epoch 1803/2000
inary accuracy: 0.9040
Epoch 1804/2000
inary_accuracy: 0.9040
Epoch 1805/2000
inary_accuracy: 0.9040
Epoch 1806/2000
inary_accuracy: 0.9040
Epoch 1807/2000
inary accuracy: 0.9040
Epoch 1808/2000
inary_accuracy: 0.9040
Epoch 1809/2000
inary_accuracy: 0.9040
Epoch 1810/2000
inary_accuracy: 0.9040
Epoch 1811/2000
inary_accuracy: 0.9040
Epoch 1812/2000
1500/1500 [==============] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1813/2000
1500/1500 [=============== ] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1814/2000
1500/1500 [==============] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040
Epoch 1815/2000
```

```
inary_accuracy: 0.9040
Epoch 1816/2000
1500/1500 [=============== ] - 0s - loss: 0.0828 - b
inary_accuracy: 0.9040
Epoch 1817/2000
inary_accuracy: 0.9040
Epoch 1818/2000
inary_accuracy: 0.9040
Epoch 1819/2000
1500/1500 [==============] - 0s - loss: 0.0828 - b
inary_accuracy: 0.9040
Epoch 1820/2000
inary accuracy: 0.9040
Epoch 1821/2000
1500/1500 [==============] - 0s - loss: 0.0828 - b
inary_accuracy: 0.9040
Epoch 1822/2000
1500/1500 [==============] - 0s - loss: 0.0828 - b
inary accuracy: 0.9040 - ETA: 0s - loss: 0.0857 - binary accur
acy: 0.899
Epoch 1823/2000
inary accuracy: 0.9040
Epoch 1824/2000
inary accuracy: 0.9040
Epoch 1825/2000
inary_accuracy: 0.9040
Epoch 1826/2000
inary accuracy: 0.9040
Epoch 1827/2000
inary accuracy: 0.9047
Epoch 1828/2000
inary accuracy: 0.9040
Epoch 1829/2000
inary accuracy: 0.9040
Epoch 1830/2000
inary accuracy: 0.9040
Epoch 1831/2000
inary_accuracy: 0.9040
Epoch 1832/2000
inary accuracy: 0.9040
Epoch 1833/2000
inary_accuracy: 0.9040
```

```
Epoch 1834/2000
inary accuracy: 0.9040
Epoch 1835/2000
inary accuracy: 0.9040
Epoch 1836/2000
inary accuracy: 0.9040
Epoch 1837/2000
inary accuracy: 0.9047
Epoch 1838/2000
inary accuracy: 0.9040
Epoch 1839/2000
1500/1500 [==============] - 0s - loss: 0.0827 - b
inary accuracy: 0.9040
Epoch 1840/2000
inary accuracy: 0.9040
Epoch 1841/2000
1500/1500 [==============] - 0s - loss: 0.0827 - b
inary accuracy: 0.9040
Epoch 1842/2000
inary accuracy: 0.9040
Epoch 1843/2000
inary accuracy: 0.9040
Epoch 1844/2000
inary_accuracy: 0.9040
Epoch 1845/2000
inary accuracy: 0.9040
Epoch 1846/2000
inary accuracy: 0.9047
Epoch 1847/2000
inary accuracy: 0.9040
Epoch 1848/2000
inary accuracy: 0.9040
Epoch 1849/2000
inary accuracy: 0.9047
Epoch 1850/2000
inary_accuracy: 0.9040
Epoch 1851/2000
inary accuracy: 0.9047
Epoch 1852/2000
inary_accuracy: 0.9040
```

```
Epoch 1853/2000
inary accuracy: 0.9040
Epoch 1854/2000
inary accuracy: 0.9040
Epoch 1855/2000
inary accuracy: 0.9040
Epoch 1856/2000
inary accuracy: 0.9047
Epoch 1857/2000
inary accuracy: 0.9040
Epoch 1858/2000
1500/1500 [==============] - 0s - loss: 0.0827 - b
inary accuracy: 0.9040
Epoch 1859/2000
inary accuracy: 0.9040
Epoch 1860/2000
1500/1500 [==============] - 0s - loss: 0.0827 - b
inary accuracy: 0.9047
Epoch 1861/2000
inary accuracy: 0.9040
Epoch 1862/2000
inary accuracy: 0.9040
Epoch 1863/2000
1500/1500 [==============] - 0s - loss: 0.0827 - b
inary_accuracy: 0.9047
Epoch 1864/2000
inary accuracy: 0.9040
Epoch 1865/2000
inary accuracy: 0.9040
Epoch 1866/2000
inary accuracy: 0.9040
Epoch 1867/2000
inary accuracy: 0.9047
Epoch 1868/2000
inary accuracy: 0.9040
Epoch 1869/2000
inary_accuracy: 0.9047
Epoch 1870/2000
inary accuracy: 0.9047
Epoch 1871/2000
inary_accuracy: 0.9040
```

```
Epoch 1872/2000
inary accuracy: 0.9047
Epoch 1873/2000
inary_accuracy: 0.9047 - ETA: 0s - loss: 0.0786 - binary_accur
acy: 0.909
Epoch 1874/2000
inary accuracy: 0.9047
Epoch 1875/2000
inary accuracy: 0.9040
Epoch 1876/2000
1500/1500 [==============] - 0s - loss: 0.0827 - b
inary accuracy: 0.9040
Epoch 1877/2000
inary accuracy: 0.9047
Epoch 1878/2000
inary_accuracy: 0.9040
Epoch 1879/2000
inary accuracy: 0.9040
Epoch 1880/2000
inary accuracy: 0.9047
Epoch 1881/2000
inary accuracy: 0.9047
Epoch 1882/2000
inary_accuracy: 0.9047
Epoch 1883/2000
inary accuracy: 0.9047
Epoch 1884/2000
inary accuracy: 0.9047
Epoch 1885/2000
inary_accuracy: 0.9047
Epoch 1886/2000
inary_accuracy: 0.9047
Epoch 1887/2000
inary accuracy: 0.9047
Epoch 1888/2000
inary_accuracy: 0.9040
Epoch 1889/2000
inary_accuracy: 0.9047
Epoch 1890/2000
```

```
inary accuracy: 0.9047
Epoch 1891/2000
inary accuracy: 0.9040
Epoch 1892/2000
inary accuracy: 0.9047
Epoch 1893/2000
inary accuracy: 0.9040
Epoch 1894/2000
inary accuracy: 0.9047
Epoch 1895/2000
1500/1500 [==============] - 0s - loss: 0.0826 - b
inary accuracy: 0.9040
Epoch 1896/2000
inary accuracy: 0.9040
Epoch 1897/2000
inary_accuracy: 0.9047
Epoch 1898/2000
inary accuracy: 0.9047
Epoch 1899/2000
inary accuracy: 0.9047
Epoch 1900/2000
inary accuracy: 0.9047
Epoch 1901/2000
inary_accuracy: 0.9047
Epoch 1902/2000
inary_accuracy: 0.9047
Epoch 1903/2000
inary_accuracy: 0.9047
Epoch 1904/2000
inary_accuracy: 0.9047
Epoch 1905/2000
inary_accuracy: 0.9047
Epoch 1906/2000
inary accuracy: 0.9047
Epoch 1907/2000
inary_accuracy: 0.9047
Epoch 1908/2000
inary accuracy: 0.9047
Epoch 1909/2000
```

```
inary accuracy: 0.9047
Epoch 1910/2000
inary accuracy: 0.9047
Epoch 1911/2000
inary accuracy: 0.9047
Epoch 1912/2000
inary accuracy: 0.9047
Epoch 1913/2000
inary accuracy: 0.9047
Epoch 1914/2000
1500/1500 [==============] - 0s - loss: 0.0826 - b
inary accuracy: 0.9047
Epoch 1915/2000
inary accuracy: 0.9047
Epoch 1916/2000
inary_accuracy: 0.9047
Epoch 1917/2000
inary accuracy: 0.9047
Epoch 1918/2000
inary accuracy: 0.9047
Epoch 1919/2000
inary accuracy: 0.9047
Epoch 1920/2000
inary_accuracy: 0.9047
Epoch 1921/2000
inary_accuracy: 0.9047
Epoch 1922/2000
inary_accuracy: 0.9047
Epoch 1923/2000
inary_accuracy: 0.9047
Epoch 1924/2000
inary_accuracy: 0.9047
Epoch 1925/2000
inary accuracy: 0.9047
Epoch 1926/2000
inary_accuracy: 0.9047
Epoch 1927/2000
inary accuracy: 0.9047
Epoch 1928/2000
```

```
inary accuracy: 0.9047
Epoch 1929/2000
inary accuracy: 0.9047
Epoch 1930/2000
inary accuracy: 0.9047
Epoch 1931/2000
inary accuracy: 0.9047
Epoch 1932/2000
inary accuracy: 0.9047
Epoch 1933/2000
1500/1500 [==============] - 0s - loss: 0.0826 - b
inary accuracy: 0.9047
Epoch 1934/2000
inary accuracy: 0.9047
Epoch 1935/2000
inary_accuracy: 0.9047
Epoch 1936/2000
inary accuracy: 0.9047
Epoch 1937/2000
inary accuracy: 0.9047
Epoch 1938/2000
inary accuracy: 0.9047
Epoch 1939/2000
inary_accuracy: 0.9047
Epoch 1940/2000
inary_accuracy: 0.9047
Epoch 1941/2000
inary_accuracy: 0.9047
Epoch 1942/2000
inary_accuracy: 0.9047
Epoch 1943/2000
inary_accuracy: 0.9047
Epoch 1944/2000
inary accuracy: 0.9047
Epoch 1945/2000
inary_accuracy: 0.9047
Epoch 1946/2000
inary accuracy: 0.9047
Epoch 1947/2000
```

```
inary accuracy: 0.9047
Epoch 1948/2000
inary accuracy: 0.9040
Epoch 1949/2000
inary accuracy: 0.9047
Epoch 1950/2000
inary accuracy: 0.9047
Epoch 1951/2000
inary accuracy: 0.9047
Epoch 1952/2000
1500/1500 [==============] - 0s - loss: 0.0826 - b
inary accuracy: 0.9047
Epoch 1953/2000
inary accuracy: 0.9047
Epoch 1954/2000
inary_accuracy: 0.9047
Epoch 1955/2000
inary accuracy: 0.9047
Epoch 1956/2000
inary accuracy: 0.9047
Epoch 1957/2000
inary accuracy: 0.9047
Epoch 1958/2000
inary_accuracy: 0.9047
Epoch 1959/2000
inary_accuracy: 0.9047
Epoch 1960/2000
inary_accuracy: 0.9047
Epoch 1961/2000
inary_accuracy: 0.9047
Epoch 1962/2000
inary_accuracy: 0.9047
Epoch 1963/2000
inary accuracy: 0.9047
Epoch 1964/2000
inary_accuracy: 0.9047
Epoch 1965/2000
inary accuracy: 0.9047
Epoch 1966/2000
```

```
inary accuracy: 0.9047
Epoch 1967/2000
inary accuracy: 0.9047
Epoch 1968/2000
inary accuracy: 0.9047
Epoch 1969/2000
inary accuracy: 0.9047
Epoch 1970/2000
1500/1500 [==============] - 0s - loss: 0.0825 - b
inary accuracy: 0.9047
Epoch 1971/2000
1500/1500 [==============] - 0s - loss: 0.0825 - b
inary accuracy: 0.9047
Epoch 1972/2000
inary accuracy: 0.9047
Epoch 1973/2000
inary_accuracy: 0.9047
Epoch 1974/2000
inary accuracy: 0.9047
Epoch 1975/2000
inary accuracy: 0.9047
Epoch 1976/2000
inary accuracy: 0.9047
Epoch 1977/2000
inary_accuracy: 0.9047
Epoch 1978/2000
inary_accuracy: 0.9047
Epoch 1979/2000
inary_accuracy: 0.9047
Epoch 1980/2000
inary_accuracy: 0.9047
Epoch 1981/2000
inary_accuracy: 0.9047
Epoch 1982/2000
inary accuracy: 0.9047
Epoch 1983/2000
inary_accuracy: 0.9047
Epoch 1984/2000
inary accuracy: 0.9047
Epoch 1985/2000
```

```
inary accuracy: 0.9047
Epoch 1986/2000
inary_accuracy: 0.9047
Epoch 1987/2000
inary_accuracy: 0.9047
Epoch 1988/2000
inary accuracy: 0.9047
Epoch 1989/2000
inary accuracy: 0.9047
Epoch 1990/2000
inary accuracy: 0.9047
Epoch 1991/2000
inary accuracy: 0.9047
Epoch 1992/2000
inary accuracy: 0.9047
Epoch 1993/2000
inary accuracy: 0.9047
Epoch 1994/2000
inary accuracy: 0.9047
Epoch 1995/2000
inary accuracy: 0.9047
Epoch 1996/2000
inary accuracy: 0.9047
Epoch 1997/2000
inary accuracy: 0.9047
Epoch 1998/2000
inary accuracy: 0.9047
Epoch 1999/2000
inary accuracy: 0.9047
Epoch 2000/2000
```

inary accuracy: 0.9047

### In [174]:

##

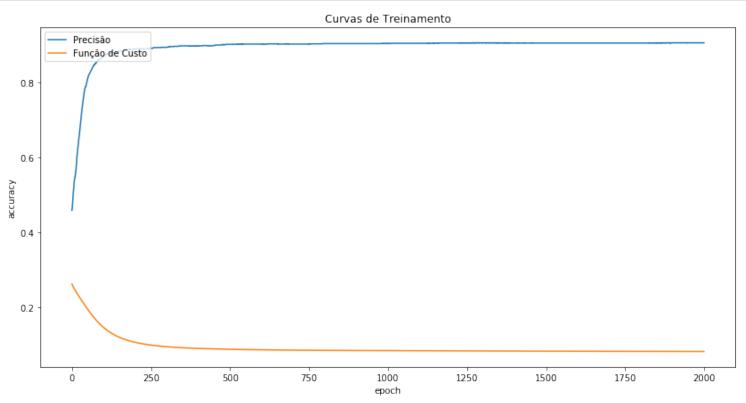
```
# Obtendo as métricas para exibir o Gráfico
metrics = history.history
metrics.keys()
```

### Out[174]:

```
dict_keys(['loss', 'binary_accuracy'])
```

## In [175]:

```
plt.figure(figsize=(14,7))
plt.plot(metrics['binary_accuracy'])
plt.plot(metrics['loss'])
plt.title('Curvas de Treinamento')
plt.ylabel('accuracy')
plt.xlabel('epoch')
plt.legend(['Precisão', 'Função de Custo'], loc='upper left')
plt.show();
```



# Construção da Rede Neural feed-forward with Neurons = 11 and Activation = relu

```
In [176]:
```

```
model = Sequential()
L1 = Dense(11, input_dim=11, activation='relu')
model.add(L1)
L2 = Dense(1, activation='relu')
model.add(L2)
```

## Configuração da Rede Neural feed - forward with Epochs = 2000

### In [177]:

```
t1 = time.process time()
model.compile(loss='mean squared error', optimizer='sgd', metrics=['binary acc
uracy'])
history = model.fit(PTrain, Train, epochs=2000, verbose=1)
t2 = time.process time()
Epoch 1/2000
inary accuracy: 0.5673
Epoch 2/2000
inary accuracy: 0.6713
Epoch 3/2000
1500/1500 [=============== ] - 0s - loss: 0.2127 - b
inary accuracy: 0.7300
Epoch 4/2000
inary accuracy: 0.7660
Epoch 5/2000
inary accuracy: 0.7867
Epoch 6/2000
inary accuracy: 0.8060
Epoch 7/2000
inary_accuracy: 0.8200
Epoch 8/2000
inary_accuracy: 0.8253
Epoch 9/2000
inary accuracy: 0.8307
Epoch 10/2000
inary accuracy: 0.8367
Epoch 11/2000
inary_accuracy: 0.8393
```

```
Epoch 12/2000
inary_accuracy: 0.8440
Epoch 13/2000
inary_accuracy: 0.8487
Epoch 14/2000
1500/1500 [=============== ] - 0s - loss: 0.1199 - b
inary_accuracy: 0.8493
Epoch 15/2000
inary_accuracy: 0.8500
Epoch 16/2000
inary accuracy: 0.8513
Epoch 17/2000
1500/1500 [============== ] - 0s - loss: 0.1163 - b
inary accuracy: 0.8553
Epoch 18/2000
inary accuracy: 0.8527
Epoch 19/2000
1500/1500 [=============== ] - 0s - loss: 0.1144 - b
inary accuracy: 0.8573
Epoch 20/2000
inary accuracy: 0.8553
Epoch 21/2000
inary accuracy: 0.8593
Epoch 22/2000
inary accuracy: 0.8607
Epoch 23/2000
inary accuracy: 0.8607
Epoch 24/2000
inary accuracy: 0.8607
Epoch 25/2000
inary accuracy: 0.8627
Epoch 26/2000
inary accuracy: 0.8600
Epoch 27/2000
inary_accuracy: 0.8633
Epoch 28/2000
1500/1500 [============== ] - 0s - loss: 0.1089 - b
inary accuracy: 0.8633
Epoch 29/2000
inary accuracy: 0.8640
Epoch 30/2000
inary_accuracy: 0.8647
```

```
Epoch 31/2000
inary_accuracy: 0.8633
Epoch 32/2000
inary_accuracy: 0.8653
Epoch 33/2000
inary_accuracy: 0.8660
Epoch 34/2000
inary_accuracy: 0.8627
Epoch 35/2000
inary accuracy: 0.8680
Epoch 36/2000
1500/1500 [==============] - 0s - loss: 0.1062 - b
inary accuracy: 0.8660
Epoch 37/2000
inary_accuracy: 0.8667
Epoch 38/2000
inary accuracy: 0.8673
Epoch 39/2000
inary accuracy: 0.8667
Epoch 40/2000
inary accuracy: 0.8667
Epoch 41/2000
1500/1500 [=============== ] - 0s - loss: 0.1051 - b
inary accuracy: 0.8667
Epoch 42/2000
inary accuracy: 0.8680
Epoch 43/2000
inary accuracy: 0.8660
Epoch 44/2000
inary accuracy: 0.8653
Epoch 45/2000
inary accuracy: 0.8673
Epoch 46/2000
inary_accuracy: 0.8667
Epoch 47/2000
1500/1500 [==============] - 0s - loss: 0.1041 - b
inary accuracy: 0.8673
Epoch 48/2000
inary accuracy: 0.8660
Epoch 49/2000
inary_accuracy: 0.8660
```

```
Epoch 50/2000
inary_accuracy: 0.8667
Epoch 51/2000
inary_accuracy: 0.8667
Epoch 52/2000
1500/1500 [=============== ] - 0s - loss: 0.1031 - b
inary_accuracy: 0.8673
Epoch 53/2000
inary_accuracy: 0.8680
Epoch 54/2000
inary accuracy: 0.8680
Epoch 55/2000
1500/1500 [==============] - 0s - loss: 0.1027 - b
inary accuracy: 0.8667
Epoch 56/2000
inary accuracy: 0.8673
Epoch 57/2000
inary accuracy: 0.8707
Epoch 58/2000
inary accuracy: 0.8673
Epoch 59/2000
inary accuracy: 0.8667
Epoch 60/2000
inary accuracy: 0.8687
Epoch 61/2000
inary accuracy: 0.8660
Epoch 62/2000
inary accuracy: 0.8667
Epoch 63/2000
inary accuracy: 0.8653
Epoch 64/2000
inary accuracy: 0.8687
Epoch 65/2000
inary_accuracy: 0.8693
Epoch 66/2000
1500/1500 [============== ] - 0s - loss: 0.1013 - b
inary accuracy: 0.8667
Epoch 67/2000
inary accuracy: 0.8687
Epoch 68/2000
inary_accuracy: 0.8700
```

```
Epoch 69/2000
inary_accuracy: 0.8720
Epoch 70/2000
inary_accuracy: 0.8687
Epoch 71/2000
inary_accuracy: 0.8713
Epoch 72/2000
inary_accuracy: 0.8687
Epoch 73/2000
1500/1500 [============== ] - 0s - loss: 0.1006 - b
inary accuracy: 0.8713
Epoch 74/2000
1500/1500 [==============] - 0s - loss: 0.1005 - b
inary accuracy: 0.8700
Epoch 75/2000
inary accuracy: 0.8700
Epoch 76/2000
inary accuracy: 0.8727
Epoch 77/2000
inary accuracy: 0.8707
Epoch 78/2000
inary accuracy: 0.8720
Epoch 79/2000
inary accuracy: 0.8707
Epoch 80/2000
inary accuracy: 0.8713
Epoch 81/2000
inary accuracy: 0.8713
Epoch 82/2000
inary accuracy: 0.8707
Epoch 83/2000
inary accuracy: 0.8720
Epoch 84/2000
inary_accuracy: 0.8720
Epoch 85/2000
1500/1500 [==============] - 0s - loss: 0.0996 - b
inary accuracy: 0.8727
Epoch 86/2000
inary accuracy: 0.8693
Epoch 87/2000
inary_accuracy: 0.8720
```

```
Epoch 88/2000
inary_accuracy: 0.8700
Epoch 89/2000
inary_accuracy: 0.8747
Epoch 90/2000
1500/1500 [=============== ] - 0s - loss: 0.0992 - b
inary_accuracy: 0.8727
Epoch 91/2000
inary_accuracy: 0.8733
Epoch 92/2000
1500/1500 [=============== ] - 0s - loss: 0.0990 - b
inary accuracy: 0.8713
Epoch 93/2000
inary accuracy: 0.8733
Epoch 94/2000
inary accuracy: 0.8720
Epoch 95/2000
inary accuracy: 0.8753
Epoch 96/2000
inary accuracy: 0.8733
Epoch 97/2000
inary accuracy: 0.8720
Epoch 98/2000
inary accuracy: 0.8753
Epoch 99/2000
inary accuracy: 0.8727
Epoch 100/2000
inary accuracy: 0.8740
Epoch 101/2000
inary accuracy: 0.8740
Epoch 102/2000
inary accuracy: 0.8740
Epoch 103/2000
inary_accuracy: 0.8733
Epoch 104/2000
1500/1500 [==============] - 0s - loss: 0.0981 - b
inary accuracy: 0.8747
Epoch 105/2000
inary accuracy: 0.8740
Epoch 106/2000
inary_accuracy: 0.8733
```

```
Epoch 107/2000
1500/1500 [=============== ] - 0s - loss: 0.0979 - b
inary_accuracy: 0.8747
Epoch 108/2000
inary_accuracy: 0.8747
Epoch 109/2000
1500/1500 [=============== ] - 0s - loss: 0.0977 - b
inary_accuracy: 0.8733
Epoch 110/2000
inary_accuracy: 0.8753
Epoch 111/2000
inary accuracy: 0.8767
Epoch 112/2000
1500/1500 [==============] - 0s - loss: 0.0976 - b
inary accuracy: 0.8747
Epoch 113/2000
inary accuracy: 0.8747
Epoch 114/2000
inary accuracy: 0.8753
Epoch 115/2000
inary accuracy: 0.8753
Epoch 116/2000
inary accuracy: 0.8773
Epoch 117/2000
1500/1500 [==============] - 0s - loss: 0.0973 - b
inary accuracy: 0.8767
Epoch 118/2000
inary accuracy: 0.8753
Epoch 119/2000
inary accuracy: 0.8747
Epoch 120/2000
inary accuracy: 0.8753
Epoch 121/2000
inary accuracy: 0.8753
Epoch 122/2000
inary_accuracy: 0.8773
Epoch 123/2000
1500/1500 [==============] - 0s - loss: 0.0967 - b
inary accuracy: 0.8760
Epoch 124/2000
inary accuracy: 0.8767
Epoch 125/2000
inary_accuracy: 0.8760
```

```
Epoch 126/2000
inary_accuracy: 0.8760
Epoch 127/2000
inary accuracy: 0.8753
Epoch 128/2000
inary accuracy: 0.8780
Epoch 129/2000
3 - binary_accuracy: 0.872 - 0s - loss: 0.0961 - binary_accuracy:
0.8773
Epoch 130/2000
inary accuracy: 0.8767
Epoch 131/2000
inary accuracy: 0.8753
Epoch 132/2000
inary accuracy: 0.8760
Epoch 133/2000
1500/1500 [============== ] - 0s - loss: 0.0959 - b
inary_accuracy: 0.8773
Epoch 134/2000
1500/1500 [==============] - 0s - loss: 0.0957 - b
inary_accuracy: 0.8787
Epoch 135/2000
inary accuracy: 0.8773
Epoch 136/2000
inary accuracy: 0.8780
Epoch 137/2000
inary accuracy: 0.8793
Epoch 138/2000
inary accuracy: 0.8780
Epoch 139/2000
inary accuracy: 0.8787
Epoch 140/2000
inary_accuracy: 0.8800
Epoch 141/2000
inary accuracy: 0.8787
Epoch 142/2000
inary_accuracy: 0.8787
Epoch 143/2000
inary accuracy: 0.8787
Epoch 144/2000
```

```
inary accuracy: 0.8793
Epoch 145/2000
1500/1500 [=============== ] - 0s - loss: 0.0949 - b
inary_accuracy: 0.8780
Epoch 146/2000
inary accuracy: 0.8780
Epoch 147/2000
inary_accuracy: 0.8787
Epoch 148/2000
inary accuracy: 0.8807
Epoch 149/2000
inary_accuracy: 0.8787
Epoch 150/2000
inary accuracy: 0.8793
Epoch 151/2000
inary accuracy: 0.8793
Epoch 152/2000
1500/1500 [============== ] - 0s - loss: 0.0946 - b
inary_accuracy: 0.8793
Epoch 153/2000
1500/1500 [==============] - 0s - loss: 0.0944 - b
inary_accuracy: 0.8787
Epoch 154/2000
inary accuracy: 0.8820
Epoch 155/2000
1500/1500 [============== ] - 0s - loss: 0.0944 - b
inary accuracy: 0.8813
Epoch 156/2000
inary accuracy: 0.8807
Epoch 157/2000
inary accuracy: 0.8787
Epoch 158/2000
inary accuracy: 0.8800
Epoch 159/2000
inary_accuracy: 0.8833
Epoch 160/2000
inary accuracy: 0.8800
Epoch 161/2000
inary_accuracy: 0.8827
Epoch 162/2000
inary accuracy: 0.8820
Epoch 163/2000
```

```
inary accuracy: 0.8800
Epoch 164/2000
inary accuracy: 0.8820
Epoch 165/2000
1500/1500 [==============] - 0s - loss: 0.0938 - b
inary accuracy: 0.8833
Epoch 166/2000
1500/1500 [==============] - 0s - loss: 0.0938 - b
inary_accuracy: 0.8800
Epoch 167/2000
inary accuracy: 0.8833
Epoch 168/2000
inary_accuracy: 0.8840
Epoch 169/2000
1500/1500 [=============== ] - 0s - loss: 0.0937 - b
inary accuracy: 0.8820
Epoch 170/2000
inary accuracy: 0.8813
Epoch 171/2000
1500/1500 [============== ] - 0s - loss: 0.0936 - b
inary_accuracy: 0.8827
Epoch 172/2000
1500/1500 [==============] - 0s - loss: 0.0936 - b
inary_accuracy: 0.8813
Epoch 173/2000
inary accuracy: 0.8813
Epoch 174/2000
inary accuracy: 0.8820
Epoch 175/2000
inary_accuracy: 0.8820
Epoch 176/2000
inary accuracy: 0.8833
Epoch 177/2000
inary accuracy: 0.8827
Epoch 178/2000
inary_accuracy: 0.8827
Epoch 179/2000
inary accuracy: 0.8840
Epoch 180/2000
inary_accuracy: 0.8833
Epoch 181/2000
inary accuracy: 0.8860
Epoch 182/2000
```

```
inary accuracy: 0.8847
Epoch 183/2000
1500/1500 [=============== ] - 0s - loss: 0.0931 - b
inary_accuracy: 0.8827
Epoch 184/2000
1500/1500 [==============] - 0s - loss: 0.0931 - b
inary accuracy: 0.8860
Epoch 185/2000
inary_accuracy: 0.8840
Epoch 186/2000
inary accuracy: 0.8853
Epoch 187/2000
inary_accuracy: 0.8840
Epoch 188/2000
1500/1500 [============== ] - 0s - loss: 0.0928 - b
inary accuracy: 0.8840
Epoch 189/2000
inary accuracy: 0.8820
Epoch 190/2000
1500/1500 [============== ] - 0s - loss: 0.0927 - b
inary_accuracy: 0.8847
Epoch 191/2000
1500/1500 [==============] - 0s - loss: 0.0927 - b
inary_accuracy: 0.8847
Epoch 192/2000
inary accuracy: 0.8867
Epoch 193/2000
inary accuracy: 0.8860
Epoch 194/2000
inary accuracy: 0.8860
Epoch 195/2000
inary accuracy: 0.8847
Epoch 196/2000
inary accuracy: 0.8840
Epoch 197/2000
inary_accuracy: 0.8873
Epoch 198/2000
inary accuracy: 0.8860
Epoch 199/2000
inary_accuracy: 0.8840
Epoch 200/2000
inary accuracy: 0.8867
Epoch 201/2000
```

```
inary accuracy: 0.8880
Epoch 202/2000
1500/1500 [============== ] - 0s - loss: 0.0923 - b
inary_accuracy: 0.8900
Epoch 203/2000
1500/1500 [==============] - 0s - loss: 0.0925 - b
inary accuracy: 0.8840
Epoch 204/2000
1500/1500 [==============] - 0s - loss: 0.0925 - b
inary_accuracy: 0.8853
Epoch 205/2000
inary accuracy: 0.8880
Epoch 206/2000
inary_accuracy: 0.8887
Epoch 207/2000
1500/1500 [==============] - 0s - loss: 0.0923 - b
inary accuracy: 0.8847
Epoch 208/2000
inary accuracy: 0.8867
Epoch 209/2000
1500/1500 [============== ] - 0s - loss: 0.0922 - b
inary_accuracy: 0.8867
Epoch 210/2000
1500/1500 [==============] - 0s - loss: 0.0921 - b
inary_accuracy: 0.8880
Epoch 211/2000
inary accuracy: 0.8887
Epoch 212/2000
1500/1500 [==============] - 0s - loss: 0.0921 - b
inary accuracy: 0.8887
Epoch 213/2000
inary accuracy: 0.8880
Epoch 214/2000
inary accuracy: 0.8873
Epoch 215/2000
1500/1500 [=============== ] - 0s - loss: 0.0920 - b
inary accuracy: 0.8893
Epoch 216/2000
inary_accuracy: 0.8873
Epoch 217/2000
inary accuracy: 0.8893
Epoch 218/2000
inary_accuracy: 0.8887
Epoch 219/2000
inary accuracy: 0.8887
Epoch 220/2000
```

```
inary accuracy: 0.8907
Epoch 221/2000
inary_accuracy: 0.8880
Epoch 222/2000
inary accuracy: 0.8853
Epoch 223/2000
1500/1500 [==============] - 0s - loss: 0.0918 - b
inary_accuracy: 0.8900
Epoch 224/2000
inary accuracy: 0.8900
Epoch 225/2000
inary_accuracy: 0.8880
Epoch 226/2000
inary accuracy: 0.8900
Epoch 227/2000
inary accuracy: 0.8900
Epoch 228/2000
1500/1500 [=============== ] - 0s - loss: 0.0915 - b
inary_accuracy: 0.8920
Epoch 229/2000
1500/1500 [=============== ] - 0s - loss: 0.0916 - b
inary_accuracy: 0.8900
Epoch 230/2000
inary accuracy: 0.8900
Epoch 231/2000
1500/1500 [=============== ] - 0s - loss: 0.0914 - b
inary accuracy: 0.8907
Epoch 232/2000
inary accuracy: 0.8900
Epoch 233/2000
inary accuracy: 0.8920
Epoch 234/2000
inary accuracy: 0.8893
Epoch 235/2000
inary_accuracy: 0.8907
Epoch 236/2000
inary accuracy: 0.8887
Epoch 237/2000
inary_accuracy: 0.8900
Epoch 238/2000
inary accuracy: 0.8887
Epoch 239/2000
```

```
inary accuracy: 0.8900
Epoch 240/2000
1500/1500 [=============== ] - 0s - loss: 0.0912 - b
inary_accuracy: 0.8893
Epoch 241/2000
1500/1500 [==============] - 0s - loss: 0.0911 - b
inary accuracy: 0.8907
Epoch 242/2000
1500/1500 [==============] - 0s - loss: 0.0911 - b
inary_accuracy: 0.8900
Epoch 243/2000
inary accuracy: 0.8893
Epoch 244/2000
inary_accuracy: 0.8907
Epoch 245/2000
1500/1500 [=============== ] - 0s - loss: 0.0909 - b
inary accuracy: 0.8900
Epoch 246/2000
inary accuracy: 0.8900
Epoch 247/2000
1500/1500 [=============== ] - 0s - loss: 0.0907 - b
inary_accuracy: 0.8900
Epoch 248/2000
1500/1500 [=============== ] - 0s - loss: 0.0907 - b
inary_accuracy: 0.8913
Epoch 249/2000
inary accuracy: 0.8893
Epoch 250/2000
1500/1500 [============== ] - 0s - loss: 0.0905 - b
inary accuracy: 0.8913
Epoch 251/2000
inary accuracy: 0.8907
Epoch 252/2000
inary accuracy: 0.8920
Epoch 253/2000
inary accuracy: 0.8927
Epoch 254/2000
inary_accuracy: 0.8920
Epoch 255/2000
inary accuracy: 0.8907
Epoch 256/2000
inary_accuracy: 0.8927
Epoch 257/2000
inary accuracy: 0.8913
Epoch 258/2000
```

```
inary accuracy: 0.8920
Epoch 259/2000
inary_accuracy: 0.8913
Epoch 260/2000
1500/1500 [==============] - 0s - loss: 0.0899 - b
inary accuracy: 0.8920
Epoch 261/2000
1500/1500 [==============] - 0s - loss: 0.0898 - b
inary_accuracy: 0.8907
Epoch 262/2000
inary accuracy: 0.8900
Epoch 263/2000
inary_accuracy: 0.8907
Epoch 264/2000
1500/1500 [=============== ] - 0s - loss: 0.0896 - b
inary_accuracy: 0.8920
Epoch 265/2000
inary accuracy: 0.8920
Epoch 266/2000
1500/1500 [=============== ] - 0s - loss: 0.0895 - b
inary_accuracy: 0.8900
Epoch 267/2000
1500/1500 [==============] - 0s - loss: 0.0894 - b
inary_accuracy: 0.8933
Epoch 268/2000
inary accuracy: 0.8907
Epoch 269/2000
1500/1500 [============== ] - 0s - loss: 0.0893 - b
inary accuracy: 0.8913
Epoch 270/2000
inary accuracy: 0.8900
Epoch 271/2000
inary accuracy: 0.8927
Epoch 272/2000
inary accuracy: 0.8907
Epoch 273/2000
inary_accuracy: 0.8913
Epoch 274/2000
inary accuracy: 0.8927
Epoch 275/2000
inary_accuracy: 0.8913
Epoch 276/2000
inary accuracy: 0.8920
Epoch 277/2000
```

```
inary accuracy: 0.8933
Epoch 278/2000
inary_accuracy: 0.8920
Epoch 279/2000
1500/1500 [==============] - 0s - loss: 0.0888 - b
inary accuracy: 0.8913
Epoch 280/2000
1500/1500 [==============] - 0s - loss: 0.0888 - b
inary accuracy: 0.8933
Epoch 281/2000
inary accuracy: 0.8920
Epoch 282/2000
inary_accuracy: 0.8913
Epoch 283/2000
1500/1500 [=============== ] - 0s - loss: 0.0886 - b
inary accuracy: 0.8927
Epoch 284/2000
inary accuracy: 0.8913
Epoch 285/2000
1500/1500 [=============== ] - 0s - loss: 0.0885 - b
inary_accuracy: 0.8913
Epoch 286/2000
1500/1500 [==============] - 0s - loss: 0.0884 - b
inary_accuracy: 0.8913
Epoch 287/2000
inary accuracy: 0.8920
Epoch 288/2000
1500/1500 [==============] - 0s - loss: 0.0884 - b
inary accuracy: 0.8920
Epoch 289/2000
inary accuracy: 0.8920
Epoch 290/2000
inary accuracy: 0.8913
Epoch 291/2000
1500/1500 [============== ] - 0s - loss: 0.0882 - b
inary accuracy: 0.8913
Epoch 292/2000
inary_accuracy: 0.8927
Epoch 293/2000
inary accuracy: 0.8920
Epoch 294/2000
inary_accuracy: 0.8913
Epoch 295/2000
inary accuracy: 0.8920
Epoch 296/2000
```

```
inary accuracy: 0.8913
Epoch 297/2000
inary_accuracy: 0.8907
Epoch 298/2000
inary accuracy: 0.8927
Epoch 299/2000
inary_accuracy: 0.8907
Epoch 300/2000
inary accuracy: 0.8940
Epoch 301/2000
inary_accuracy: 0.8920
Epoch 302/2000
inary accuracy: 0.8933
Epoch 303/2000
inary accuracy: 0.8933
Epoch 304/2000
1500/1500 [=============== ] - 0s - loss: 0.0877 - b
inary_accuracy: 0.8933
Epoch 305/2000
1500/1500 [==============] - 0s - loss: 0.0874 - b
inary accuracy: 0.8953
Epoch 306/2000
inary accuracy: 0.8933
Epoch 307/2000
inary accuracy: 0.8920
Epoch 308/2000
inary_accuracy: 0.8933
Epoch 309/2000
inary accuracy: 0.8933
Epoch 310/2000
inary accuracy: 0.8960
Epoch 311/2000
inary_accuracy: 0.8933
Epoch 312/2000
inary accuracy: 0.8940
Epoch 313/2000
inary_accuracy: 0.8927
Epoch 314/2000
inary accuracy: 0.8927
Epoch 315/2000
```

```
inary accuracy: 0.8940
Epoch 316/2000
inary_accuracy: 0.8940
Epoch 317/2000
inary accuracy: 0.8947
Epoch 318/2000
inary_accuracy: 0.8947
Epoch 319/2000
inary accuracy: 0.8940
Epoch 320/2000
inary_accuracy: 0.8940
Epoch 321/2000
inary_accuracy: 0.8947
Epoch 322/2000
inary accuracy: 0.8933
Epoch 323/2000
inary_accuracy: 0.8947
Epoch 324/2000
1500/1500 [==============] - 0s - loss: 0.0869 - b
inary accuracy: 0.8953
Epoch 325/2000
inary_accuracy: 0.8960
Epoch 326/2000
1500/1500 [=============== ] - 0s - loss: 0.0869 - b
inary accuracy: 0.8960
Epoch 327/2000
inary accuracy: 0.8940
Epoch 328/2000
inary accuracy: 0.8927
Epoch 329/2000
inary accuracy: 0.8947
Epoch 330/2000
inary_accuracy: 0.8960
Epoch 331/2000
inary accuracy: 0.8940
Epoch 332/2000
inary_accuracy: 0.8933
Epoch 333/2000
inary accuracy: 0.8973
Epoch 334/2000
```

```
inary accuracy: 0.8947
Epoch 335/2000
inary_accuracy: 0.8947
Epoch 336/2000
1500/1500 [==============] - 0s - loss: 0.0866 - b
inary_accuracy: 0.8973
Epoch 337/2000
1500/1500 [==============] - 0s - loss: 0.0866 - b
inary accuracy: 0.8933
Epoch 338/2000
inary_accuracy: 0.8967
Epoch 339/2000
inary_accuracy: 0.8967
Epoch 340/2000
1500/1500 [=============== ] - 0s - loss: 0.0864 - b
inary_accuracy: 0.8987
Epoch 341/2000
inary accuracy: 0.8967
Epoch 342/2000
inary_accuracy: 0.8933
Epoch 343/2000
inary_accuracy: 0.8980
Epoch 344/2000
inary accuracy: 0.8960
Epoch 345/2000
1500/1500 [============== ] - 0s - loss: 0.0863 - b
inary accuracy: 0.8967
Epoch 346/2000
inary accuracy: 0.8947
Epoch 347/2000
inary accuracy: 0.8987
Epoch 348/2000
6 - binary_accuracy: 0.905 - 0s - loss: 0.0862 - binary_accuracy:
0.8953
Epoch 349/2000
inary_accuracy: 0.8980
Epoch 350/2000
inary accuracy: 0.8960
Epoch 351/2000
inary accuracy: 0.8980
Epoch 352/2000
inary_accuracy: 0.8987
Epoch 353/2000
```

```
inary accuracy: 0.8947
Epoch 354/2000
inary accuracy: 0.8987
Epoch 355/2000
inary accuracy: 0.8993
Epoch 356/2000
inary accuracy: 0.8980
Epoch 357/2000
inary accuracy: 0.8987
Epoch 358/2000
inary accuracy: 0.8953
Epoch 359/2000
inary accuracy: 0.8967
Epoch 360/2000
inary_accuracy: 0.8947
Epoch 361/2000
inary accuracy: 0.8993
Epoch 362/2000
inary accuracy: 0.8980
Epoch 363/2000
inary_accuracy: 0.8973
Epoch 364/2000
inary accuracy: 0.8993
Epoch 365/2000
inary_accuracy: 0.8980
Epoch 366/2000
inary accuracy: 0.8967
Epoch 367/2000
inary accuracy: 0.8993
Epoch 368/2000
inary_accuracy: 0.8953
Epoch 369/2000
inary accuracy: 0.8973
Epoch 370/2000
inary accuracy: 0.8967
Epoch 371/2000
inary_accuracy: 0.8993
Epoch 372/2000
```

```
inary accuracy: 0.8993
Epoch 373/2000
inary accuracy: 0.8967
Epoch 374/2000
inary accuracy: 0.8973
Epoch 375/2000
inary accuracy: 0.8960
Epoch 376/2000
inary accuracy: 0.8973
Epoch 377/2000
inary accuracy: 0.8973
Epoch 378/2000
inary accuracy: 0.8980
Epoch 379/2000
inary accuracy: 0.8980
Epoch 380/2000
inary accuracy: 0.8967
Epoch 381/2000
inary accuracy: 0.8993
Epoch 382/2000
inary_accuracy: 0.8980
Epoch 383/2000
inary accuracy: 0.8993
Epoch 384/2000
inary_accuracy: 0.8973
Epoch 385/2000
inary_accuracy: 0.8980
Epoch 386/2000
inary accuracy: 0.8940
Epoch 387/2000
inary_accuracy: 0.9000
Epoch 388/2000
inary accuracy: 0.8987
Epoch 389/2000
inary accuracy: 0.8987
Epoch 390/2000
inary_accuracy: 0.8980
Epoch 391/2000
```

```
inary accuracy: 0.8960
Epoch 392/2000
inary accuracy: 0.8980
Epoch 393/2000
inary accuracy: 0.8967
Epoch 394/2000
inary accuracy: 0.8973
Epoch 395/2000
inary accuracy: 0.8987
Epoch 396/2000
inary accuracy: 0.9007
Epoch 397/2000
inary accuracy: 0.9000
Epoch 398/2000
inary accuracy: 0.8967
Epoch 399/2000
inary accuracy: 0.8987
Epoch 400/2000
inary accuracy: 0.9007
Epoch 401/2000
inary_accuracy: 0.8967
Epoch 402/2000
inary accuracy: 0.8973
Epoch 403/2000
inary_accuracy: 0.9000
Epoch 404/2000
inary_accuracy: 0.9000
Epoch 405/2000
1500/1500 [==============] - 0s - loss: 0.0847 - b
inary accuracy: 0.8980
Epoch 406/2000
inary_accuracy: 0.8980
Epoch 407/2000
inary accuracy: 0.8987
Epoch 408/2000
inary accuracy: 0.8973
Epoch 409/2000
inary_accuracy: 0.8973
Epoch 410/2000
```

```
inary accuracy: 0.8973
Epoch 411/2000
inary accuracy: 0.8980
Epoch 412/2000
inary accuracy: 0.8967
Epoch 413/2000
inary accuracy: 0.8967
Epoch 414/2000
inary accuracy: 0.9013
Epoch 415/2000
inary accuracy: 0.8987
Epoch 416/2000
inary accuracy: 0.8993
Epoch 417/2000
inary_accuracy: 0.8987
Epoch 418/2000
inary accuracy: 0.8987
Epoch 419/2000
inary accuracy: 0.8980
Epoch 420/2000
inary_accuracy: 0.8987
Epoch 421/2000
inary accuracy: 0.8993
Epoch 422/2000
inary_accuracy: 0.9000
Epoch 423/2000
inary_accuracy: 0.8987
Epoch 424/2000
1500/1500 [==============] - 0s - loss: 0.0843 - b
inary accuracy: 0.8973
Epoch 425/2000
inary_accuracy: 0.8987
Epoch 426/2000
inary accuracy: 0.8993
Epoch 427/2000
1500/1500 [==============] - 0s - loss: 0.0842 - b
inary accuracy: 0.8993
Epoch 428/2000
inary_accuracy: 0.8993
Epoch 429/2000
```

```
inary_accuracy: 0.8980
Epoch 430/2000
inary accuracy: 0.8987
Epoch 431/2000
inary accuracy: 0.8993
Epoch 432/2000
inary accuracy: 0.8987
Epoch 433/2000
inary accuracy: 0.9007
Epoch 434/2000
inary accuracy: 0.8987
Epoch 435/2000
inary accuracy: 0.8967
Epoch 436/2000
inary_accuracy: 0.9000
Epoch 437/2000
inary accuracy: 0.8987
Epoch 438/2000
inary accuracy: 0.9013
Epoch 439/2000
inary_accuracy: 0.9007
Epoch 440/2000
inary accuracy: 0.8993
Epoch 441/2000
inary_accuracy: 0.9007
Epoch 442/2000
inary_accuracy: 0.8980
Epoch 443/2000
inary accuracy: 0.9007
Epoch 444/2000
inary_accuracy: 0.9007
Epoch 445/2000
inary accuracy: 0.8980
Epoch 446/2000
inary accuracy: 0.9013
Epoch 447/2000
inary_accuracy: 0.8987
Epoch 448/2000
```

```
inary_accuracy: 0.8993
Epoch 449/2000
inary accuracy: 0.9000
Epoch 450/2000
inary accuracy: 0.8987
Epoch 451/2000
inary accuracy: 0.8987
Epoch 452/2000
inary accuracy: 0.8993
Epoch 453/2000
inary accuracy: 0.9000
Epoch 454/2000
inary accuracy: 0.8980
Epoch 455/2000
inary accuracy: 0.9013
Epoch 456/2000
inary accuracy: 0.9013
Epoch 457/2000
inary accuracy: 0.9000
Epoch 458/2000
inary_accuracy: 0.9013
Epoch 459/2000
inary_accuracy: 0.9000
Epoch 460/2000
inary_accuracy: 0.8993
Epoch 461/2000
inary accuracy: 0.9007
Epoch 462/2000
inary accuracy: 0.9000
Epoch 463/2000
inary_accuracy: 0.9020
Epoch 464/2000
inary accuracy: 0.9007
Epoch 465/2000
inary accuracy: 0.9000
Epoch 466/2000
inary_accuracy: 0.8987
Epoch 467/2000
```

```
inary_accuracy: 0.8987
Epoch 468/2000
inary accuracy: 0.9007
Epoch 469/2000
1500/1500 [=============== ] - 0s - loss: 0.0834 - b
inary accuracy: 0.9000
Epoch 470/2000
inary accuracy: 0.8987
Epoch 471/2000
inary accuracy: 0.9000
Epoch 472/2000
inary accuracy: 0.8980
Epoch 473/2000
inary accuracy: 0.8987
Epoch 474/2000
inary accuracy: 0.9007
Epoch 475/2000
inary accuracy: 0.8980
Epoch 476/2000
inary accuracy: 0.8993
Epoch 477/2000
inary_accuracy: 0.8993
Epoch 478/2000
inary accuracy: 0.8980
Epoch 479/2000
inary_accuracy: 0.8987
Epoch 480/2000
inary_accuracy: 0.8993
Epoch 481/2000
1500/1500 [==============] - 0s - loss: 0.0831 - b
inary accuracy: 0.9000
Epoch 482/2000
inary_accuracy: 0.9013
Epoch 483/2000
inary accuracy: 0.9000
Epoch 484/2000
1500/1500 [==============] - 0s - loss: 0.0831 - b
inary accuracy: 0.8987
Epoch 485/2000
inary_accuracy: 0.9000
Epoch 486/2000
```

```
inary accuracy: 0.8993
Epoch 487/2000
inary accuracy: 0.9013
Epoch 488/2000
1500/1500 [=============== ] - 0s - loss: 0.0831 - b
inary accuracy: 0.9007
Epoch 489/2000
inary accuracy: 0.9000
Epoch 490/2000
inary accuracy: 0.9013
Epoch 491/2000
1500/1500 [=============== ] - 0s - loss: 0.0830 - b
inary accuracy: 0.8987
Epoch 492/2000
inary accuracy: 0.8993
Epoch 493/2000
inary accuracy: 0.9000
Epoch 494/2000
inary accuracy: 0.9020
Epoch 495/2000
inary accuracy: 0.9013
Epoch 496/2000
inary_accuracy: 0.9007
Epoch 497/2000
inary_accuracy: 0.8980
Epoch 498/2000
1500/1500 [=============== ] - 0s - loss: 0.0829 - b
inary_accuracy: 0.9013
Epoch 499/2000
inary_accuracy: 0.9007
Epoch 500/2000
1500/1500 [==============] - 0s - loss: 0.0828 - b
inary accuracy: 0.9007
Epoch 501/2000
inary_accuracy: 0.8993
Epoch 502/2000
inary accuracy: 0.9020
Epoch 503/2000
inary accuracy: 0.9013
Epoch 504/2000
inary_accuracy: 0.9013
Epoch 505/2000
```

```
inary accuracy: 0.9020
Epoch 506/2000
inary accuracy: 0.9013
Epoch 507/2000
inary accuracy: 0.9013
Epoch 508/2000
inary accuracy: 0.9027
Epoch 509/2000
inary accuracy: 0.9027
Epoch 510/2000
inary accuracy: 0.9020
Epoch 511/2000
inary accuracy: 0.9020
Epoch 512/2000
inary_accuracy: 0.9013
Epoch 513/2000
inary accuracy: 0.9020
Epoch 514/2000
inary accuracy: 0.9013
Epoch 515/2000
inary_accuracy: 0.9027
Epoch 516/2000
inary_accuracy: 0.9020
Epoch 517/2000
inary_accuracy: 0.9033
Epoch 518/2000
inary_accuracy: 0.9033
Epoch 519/2000
1500/1500 [==============] - 0s - loss: 0.0825 - b
inary accuracy: 0.9020
Epoch 520/2000
inary_accuracy: 0.9060
Epoch 521/2000
inary accuracy: 0.9040
Epoch 522/2000
1500/1500 [==============] - 0s - loss: 0.0824 - b
inary accuracy: 0.9040
Epoch 523/2000
inary_accuracy: 0.9040
Epoch 524/2000
```

```
inary accuracy: 0.9033
Epoch 525/2000
inary_accuracy: 0.9033
Epoch 526/2000
inary accuracy: 0.9040
Epoch 527/2000
inary_accuracy: 0.9027
Epoch 528/2000
inary accuracy: 0.9040
Epoch 529/2000
9 - binary accuracy: 0.908 - 0s - loss: 0.0823 - binary accuracy:
0.9033
Epoch 530/2000
inary accuracy: 0.9040
Epoch 531/2000
1500/1500 [=============== ] - 0s - loss: 0.0823 - b
inary accuracy: 0.9040
Epoch 532/2000
inary accuracy: 0.9020
Epoch 533/2000
inary accuracy: 0.9040
Epoch 534/2000
1500/1500 [============== ] - 0s - loss: 0.0823 - b
inary_accuracy: 0.9047
Epoch 535/2000
inary accuracy: 0.9053
Epoch 536/2000
inary accuracy: 0.9047
Epoch 537/2000
inary accuracy: 0.9053
Epoch 538/2000
inary accuracy: 0.9040
Epoch 539/2000
inary_accuracy: 0.9047
Epoch 540/2000
1500/1500 [==============] - 0s - loss: 0.0821 - b
inary accuracy: 0.9047
Epoch 541/2000
inary accuracy: 0.9060
Epoch 542/2000
inary_accuracy: 0.9053
```

```
Epoch 543/2000
inary_accuracy: 0.9053
Epoch 544/2000
inary_accuracy: 0.9033
Epoch 545/2000
inary accuracy: 0.9047
Epoch 546/2000
inary_accuracy: 0.9047
Epoch 547/2000
inary accuracy: 0.9033
Epoch 548/2000
1500/1500 [=============] - 0s - loss: 0.0820 - b
inary accuracy: 0.9053
Epoch 549/2000
inary accuracy: 0.9040
Epoch 550/2000
1500/1500 [=============== ] - 0s - loss: 0.0820 - b
inary accuracy: 0.9033
Epoch 551/2000
inary accuracy: 0.9047
Epoch 552/2000
inary accuracy: 0.9033
Epoch 553/2000
inary accuracy: 0.9053
Epoch 554/2000
inary accuracy: 0.9047
Epoch 555/2000
inary accuracy: 0.9047
Epoch 556/2000
inary accuracy: 0.9047
Epoch 557/2000
inary accuracy: 0.9067
Epoch 558/2000
inary_accuracy: 0.9040
Epoch 559/2000
1500/1500 [==============] - 0s - loss: 0.0819 - b
inary accuracy: 0.9053
Epoch 560/2000
inary accuracy: 0.9040
Epoch 561/2000
inary_accuracy: 0.9020
```

```
Epoch 562/2000
inary_accuracy: 0.9047
Epoch 563/2000
inary_accuracy: 0.9047
Epoch 564/2000
inary_accuracy: 0.9053
Epoch 565/2000
inary_accuracy: 0.9033
Epoch 566/2000
inary accuracy: 0.9033
Epoch 567/2000
1500/1500 [==============] - 0s - loss: 0.0818 - b
inary accuracy: 0.9047
Epoch 568/2000
inary accuracy: 0.9053
Epoch 569/2000
inary accuracy: 0.9047
Epoch 570/2000
inary accuracy: 0.9053
Epoch 571/2000
inary accuracy: 0.9053
Epoch 572/2000
inary accuracy: 0.9047
Epoch 573/2000
inary accuracy: 0.9033
Epoch 574/2000
inary accuracy: 0.9067
Epoch 575/2000
inary accuracy: 0.9033
Epoch 576/2000
inary accuracy: 0.9040
Epoch 577/2000
inary_accuracy: 0.9053
Epoch 578/2000
1500/1500 [==============] - 0s - loss: 0.0816 - b
inary accuracy: 0.9047
Epoch 579/2000
inary accuracy: 0.9033
Epoch 580/2000
inary_accuracy: 0.9047
```

```
Epoch 581/2000
inary_accuracy: 0.9047
Epoch 582/2000
inary_accuracy: 0.9033
Epoch 583/2000
1500/1500 [=============== ] - 0s - loss: 0.0816 - b
inary accuracy: 0.9040
Epoch 584/2000
inary_accuracy: 0.9047
Epoch 585/2000
inary accuracy: 0.9053
Epoch 586/2000
1500/1500 [==============] - 0s - loss: 0.0815 - b
inary accuracy: 0.9040
Epoch 587/2000
inary accuracy: 0.9040
Epoch 588/2000
1500/1500 [=============== ] - 0s - loss: 0.0815 - b
inary accuracy: 0.9047
Epoch 589/2000
inary_accuracy: 0.9047
Epoch 590/2000
inary_accuracy: 0.9033
Epoch 591/2000
inary accuracy: 0.9040
Epoch 592/2000
inary accuracy: 0.9033
Epoch 593/2000
inary accuracy: 0.9047
Epoch 594/2000
inary accuracy: 0.9053
Epoch 595/2000
inary accuracy: 0.9027
Epoch 596/2000
inary_accuracy: 0.9047
Epoch 597/2000
1500/1500 [==============] - 0s - loss: 0.0813 - b
inary accuracy: 0.9040
Epoch 598/2000
inary accuracy: 0.9040
Epoch 599/2000
inary_accuracy: 0.9033
```

```
Epoch 600/2000
inary_accuracy: 0.9053
Epoch 601/2000
inary_accuracy: 0.9020
Epoch 602/2000
inary accuracy: 0.9040
Epoch 603/2000
inary_accuracy: 0.9047
Epoch 604/2000
inary accuracy: 0.9047
Epoch 605/2000
1500/1500 [==============] - 0s - loss: 0.0813 - b
inary accuracy: 0.9040
Epoch 606/2000
inary accuracy: 0.9033
Epoch 607/2000
inary accuracy: 0.9060
Epoch 608/2000
inary_accuracy: 0.9040
Epoch 609/2000
inary_accuracy: 0.9047
Epoch 610/2000
inary accuracy: 0.9053
Epoch 611/2000
inary accuracy: 0.9047
Epoch 612/2000
inary accuracy: 0.9047
Epoch 613/2000
inary accuracy: 0.9047
Epoch 614/2000
inary accuracy: 0.9053
Epoch 615/2000
inary_accuracy: 0.9040
Epoch 616/2000
1500/1500 [==============] - 0s - loss: 0.0811 - b
inary accuracy: 0.9053
Epoch 617/2000
inary accuracy: 0.9040
Epoch 618/2000
inary_accuracy: 0.9053
```

```
Epoch 619/2000
inary_accuracy: 0.9053
Epoch 620/2000
inary_accuracy: 0.9053
Epoch 621/2000
inary_accuracy: 0.9060
Epoch 622/2000
inary_accuracy: 0.9060
Epoch 623/2000
inary accuracy: 0.9053
Epoch 624/2000
inary accuracy: 0.9040
Epoch 625/2000
inary accuracy: 0.9047
Epoch 626/2000
1500/1500 [=============== ] - 0s - loss: 0.0808 - b
inary accuracy: 0.9047
Epoch 627/2000
inary accuracy: 0.9067
Epoch 628/2000
inary_accuracy: 0.9047
Epoch 629/2000
inary accuracy: 0.9067
Epoch 630/2000
inary accuracy: 0.9067
Epoch 631/2000
inary accuracy: 0.9067
Epoch 632/2000
inary_accuracy: 0.9060
Epoch 633/2000
inary_accuracy: 0.9053
Epoch 634/2000
inary_accuracy: 0.9067
Epoch 635/2000
1500/1500 [==============] - 0s - loss: 0.0806 - b
inary accuracy: 0.9053
Epoch 636/2000
inary accuracy: 0.9060
Epoch 637/2000
inary_accuracy: 0.9047
```

```
Epoch 638/2000
1500/1500 [=============== ] - 0s - loss: 0.0805 - b
inary_accuracy: 0.9040
Epoch 639/2000
inary_accuracy: 0.9047
Epoch 640/2000
inary_accuracy: 0.9060
Epoch 641/2000
inary_accuracy: 0.9053
Epoch 642/2000
inary accuracy: 0.9080
Epoch 643/2000
1500/1500 [==============] - 0s - loss: 0.0803 - b
inary accuracy: 0.9073
Epoch 644/2000
inary accuracy: 0.9040
Epoch 645/2000
inary accuracy: 0.9073
Epoch 646/2000
inary_accuracy: 0.9053
Epoch 647/2000
inary_accuracy: 0.9060
Epoch 648/2000
inary accuracy: 0.9047
Epoch 649/2000
inary accuracy: 0.9047
Epoch 650/2000
inary accuracy: 0.9053
Epoch 651/2000
inary accuracy: 0.9047
Epoch 652/2000
inary accuracy: 0.9067
Epoch 653/2000
inary_accuracy: 0.9040
Epoch 654/2000
1500/1500 [==============] - 0s - loss: 0.0800 - b
inary accuracy: 0.9067
Epoch 655/2000
inary accuracy: 0.9073
Epoch 656/2000
inary_accuracy: 0.9067
```

```
Epoch 657/2000
1500/1500 [============== ] - 0s - loss: 0.0799 - b
inary_accuracy: 0.9080
Epoch 658/2000
inary_accuracy: 0.9073
Epoch 659/2000
inary_accuracy: 0.9067
Epoch 660/2000
inary_accuracy: 0.9073
Epoch 661/2000
inary accuracy: 0.9060
Epoch 662/2000
1500/1500 [==============] - 0s - loss: 0.0798 - b
inary accuracy: 0.9060
Epoch 663/2000
inary accuracy: 0.9060
Epoch 664/2000
inary accuracy: 0.9080
Epoch 665/2000
inary accuracy: 0.9073
Epoch 666/2000
inary accuracy: 0.9093
Epoch 667/2000
1500/1500 [==============] - 0s - loss: 0.0796 - b
inary accuracy: 0.9073
Epoch 668/2000
inary accuracy: 0.9073
Epoch 669/2000
inary accuracy: 0.9080
Epoch 670/2000
inary accuracy: 0.9067
Epoch 671/2000
inary accuracy: 0.9093
Epoch 672/2000
inary_accuracy: 0.9067
Epoch 673/2000
1500/1500 [==============] - 0s - loss: 0.0795 - b
inary accuracy: 0.9080
Epoch 674/2000
inary accuracy: 0.9080
Epoch 675/2000
inary_accuracy: 0.9080
```

```
Epoch 676/2000
1500/1500 [============== ] - 0s - loss: 0.0796 - b
inary_accuracy: 0.9080
Epoch 677/2000
inary_accuracy: 0.9087
Epoch 678/2000
inary_accuracy: 0.9067
Epoch 679/2000
inary_accuracy: 0.9073
Epoch 680/2000
inary accuracy: 0.9073
Epoch 681/2000
1500/1500 [==============] - 0s - loss: 0.0794 - b
inary accuracy: 0.9087
Epoch 682/2000
inary accuracy: 0.9053
Epoch 683/2000
inary accuracy: 0.9060
Epoch 684/2000
inary_accuracy: 0.9093
Epoch 685/2000
inary accuracy: 0.9067
Epoch 686/2000
inary accuracy: 0.9073
Epoch 687/2000
inary accuracy: 0.9073
Epoch 688/2000
inary accuracy: 0.9080
Epoch 689/2000
inary accuracy: 0.9060
Epoch 690/2000
inary accuracy: 0.9073
Epoch 691/2000
inary_accuracy: 0.9080
Epoch 692/2000
1500/1500 [==============] - 0s - loss: 0.0794 - b
inary accuracy: 0.9073
Epoch 693/2000
inary accuracy: 0.9087
Epoch 694/2000
inary_accuracy: 0.9073
```

```
Epoch 695/2000
inary_accuracy: 0.9067
Epoch 696/2000
inary_accuracy: 0.9060
Epoch 697/2000
1500/1500 [=============== ] - 0s - loss: 0.0793 - b
inary accuracy: 0.9060
Epoch 698/2000
inary_accuracy: 0.9073
Epoch 699/2000
1500/1500 [============== ] - 0s - loss: 0.0792 - b
inary accuracy: 0.9067
Epoch 700/2000
1500/1500 [==============] - 0s - loss: 0.0792 - b
inary accuracy: 0.9047
Epoch 701/2000
inary accuracy: 0.9073
Epoch 702/2000
inary accuracy: 0.9080
Epoch 703/2000
inary accuracy: 0.9093
Epoch 704/2000
inary accuracy: 0.9100
Epoch 705/2000
inary accuracy: 0.9073
Epoch 706/2000
inary accuracy: 0.9080
Epoch 707/2000
inary accuracy: 0.9080
Epoch 708/2000
inary accuracy: 0.9073
Epoch 709/2000
inary accuracy: 0.9067
Epoch 710/2000
1500/1500 [=============== ] - 0s - loss: 0.0790 - b
inary accuracy: 0.9073
Epoch 711/2000
1500/1500 [============== ] - 0s - loss: 0.0791 - b
inary accuracy: 0.9053
Epoch 712/2000
inary accuracy: 0.9087
Epoch 713/2000
inary_accuracy: 0.9067
```

```
Epoch 714/2000
1500/1500 [=============== ] - 0s - loss: 0.0789 - b
inary_accuracy: 0.9067
Epoch 715/2000
inary_accuracy: 0.9087
Epoch 716/2000
1500/1500 [=============== ] - 0s - loss: 0.0789 - b
inary accuracy: 0.9067
Epoch 717/2000
inary_accuracy: 0.9073
Epoch 718/2000
inary accuracy: 0.9060
Epoch 719/2000
1500/1500 [=============== ] - 0s - loss: 0.0789 - b
inary accuracy: 0.9073
Epoch 720/2000
inary_accuracy: 0.9067
Epoch 721/2000
1500/1500 [=============== ] - 0s - loss: 0.0786 - b
inary accuracy: 0.9067
Epoch 722/2000
inary_accuracy: 0.9060
Epoch 723/2000
inary accuracy: 0.9073
Epoch 724/2000
1500/1500 [==============] - 0s - loss: 0.0788 - b
inary accuracy: 0.9073
Epoch 725/2000
inary accuracy: 0.9073
Epoch 726/2000
inary accuracy: 0.9080
Epoch 727/2000
inary accuracy: 0.9067
Epoch 728/2000
inary accuracy: 0.9087
Epoch 729/2000
inary_accuracy: 0.9073
Epoch 730/2000
1500/1500 [==============] - 0s - loss: 0.0786 - b
inary accuracy: 0.9073
Epoch 731/2000
inary accuracy: 0.9073
Epoch 732/2000
inary_accuracy: 0.9067
```

```
Epoch 733/2000
inary_accuracy: 0.9073
Epoch 734/2000
inary_accuracy: 0.9073
Epoch 735/2000
inary_accuracy: 0.9073
Epoch 736/2000
inary_accuracy: 0.9080
Epoch 737/2000
1500/1500 [============== ] - 0s - loss: 0.0785 - b
inary accuracy: 0.9073
Epoch 738/2000
1500/1500 [==============] - 0s - loss: 0.0785 - b
inary accuracy: 0.9073
Epoch 739/2000
inary accuracy: 0.9093
Epoch 740/2000
inary accuracy: 0.9087
Epoch 741/2000
inary_accuracy: 0.9080
Epoch 742/2000
inary accuracy: 0.9100
Epoch 743/2000
inary accuracy: 0.9100
Epoch 744/2000
inary accuracy: 0.9093
Epoch 745/2000
inary accuracy: 0.9100
Epoch 746/2000
inary accuracy: 0.9093
Epoch 747/2000
inary accuracy: 0.9093
Epoch 748/2000
inary accuracy: 0.9087
Epoch 749/2000
1500/1500 [==============] - 0s - loss: 0.0782 - b
inary accuracy: 0.9087
Epoch 750/2000
inary accuracy: 0.9093
Epoch 751/2000
inary_accuracy: 0.9087
```

```
Epoch 752/2000
1500/1500 [=============== ] - 0s - loss: 0.0783 - b
inary_accuracy: 0.9087
Epoch 753/2000
inary_accuracy: 0.9087
Epoch 754/2000
1500/1500 [=============== ] - 0s - loss: 0.0782 - b
inary accuracy: 0.9087
Epoch 755/2000
inary_accuracy: 0.9093
Epoch 756/2000
inary accuracy: 0.9100
Epoch 757/2000
1500/1500 [============== ] - 0s - loss: 0.0782 - b
inary accuracy: 0.9093
Epoch 758/2000
inary accuracy: 0.9080
Epoch 759/2000
1500/1500 [=============== ] - 0s - loss: 0.0781 - b
inary accuracy: 0.9093
Epoch 760/2000
inary_accuracy: 0.9080
Epoch 761/2000
inary_accuracy: 0.9087
Epoch 762/2000
inary accuracy: 0.9080
Epoch 763/2000
inary accuracy: 0.9087
Epoch 764/2000
inary accuracy: 0.9093
Epoch 765/2000
inary accuracy: 0.9100
Epoch 766/2000
inary accuracy: 0.9107
Epoch 767/2000
inary accuracy: 0.9093
Epoch 768/2000
1500/1500 [==============] - 0s - loss: 0.0780 - b
inary accuracy: 0.9100
Epoch 769/2000
inary accuracy: 0.9093
Epoch 770/2000
inary_accuracy: 0.9093
```

```
Epoch 771/2000
1500/1500 [=============== ] - 0s - loss: 0.0779 - b
inary_accuracy: 0.9093
Epoch 772/2000
inary_accuracy: 0.9093
Epoch 773/2000
1500/1500 [=============== ] - 0s - loss: 0.0778 - b
inary accuracy: 0.9100
Epoch 774/2000
inary_accuracy: 0.9100
Epoch 775/2000
inary accuracy: 0.9093
Epoch 776/2000
1500/1500 [==============] - 0s - loss: 0.0778 - b
inary accuracy: 0.9093
Epoch 777/2000
inary accuracy: 0.9093
Epoch 778/2000
inary accuracy: 0.9093
Epoch 779/2000
inary accuracy: 0.9100
Epoch 780/2000
inary accuracy: 0.9100
Epoch 781/2000
inary accuracy: 0.9093
Epoch 782/2000
inary accuracy: 0.9100
Epoch 783/2000
inary accuracy: 0.9087
Epoch 784/2000
inary accuracy: 0.9093
Epoch 785/2000
inary accuracy: 0.9087
Epoch 786/2000
inary accuracy: 0.9107
Epoch 787/2000
1500/1500 [==============] - 0s - loss: 0.0777 - b
inary accuracy: 0.9087
Epoch 788/2000
inary accuracy: 0.9093
Epoch 789/2000
inary_accuracy: 0.9100
```

```
Epoch 790/2000
1500/1500 [=============== ] - 0s - loss: 0.0776 - b
inary_accuracy: 0.9100
Epoch 791/2000
inary_accuracy: 0.9107
Epoch 792/2000
inary accuracy: 0.9113
Epoch 793/2000
inary_accuracy: 0.9080
Epoch 794/2000
1500/1500 [============== ] - 0s - loss: 0.0776 - b
inary accuracy: 0.9093
Epoch 795/2000
1500/1500 [==============] - 0s - loss: 0.0776 - b
inary accuracy: 0.9093
Epoch 796/2000
inary accuracy: 0.9093
Epoch 797/2000
1500/1500 [=============== ] - 0s - loss: 0.0775 - b
inary accuracy: 0.9093
Epoch 798/2000
inary_accuracy: 0.9100
Epoch 799/2000
inary_accuracy: 0.9087
Epoch 800/2000
inary accuracy: 0.9100
Epoch 801/2000
inary accuracy: 0.9093
Epoch 802/2000
inary accuracy: 0.9093
Epoch 803/2000
inary accuracy: 0.9093
Epoch 804/2000
inary accuracy: 0.9100
Epoch 805/2000
inary_accuracy: 0.9093
Epoch 806/2000
1500/1500 [==============] - 0s - loss: 0.0774 - b
inary accuracy: 0.9093
Epoch 807/2000
inary accuracy: 0.9107
Epoch 808/2000
inary_accuracy: 0.9107
```

```
Epoch 809/2000
inary_accuracy: 0.9100
Epoch 810/2000
inary_accuracy: 0.9093
Epoch 811/2000
inary accuracy: 0.9113
Epoch 812/2000
inary_accuracy: 0.9100
Epoch 813/2000
inary_accuracy: 0.9073
Epoch 814/2000
1500/1500 [==============] - 0s - loss: 0.0773 - b
inary accuracy: 0.9107
Epoch 815/2000
inary accuracy: 0.9100
Epoch 816/2000
inary accuracy: 0.9100
Epoch 817/2000
inary accuracy: 0.9113
Epoch 818/2000
inary accuracy: 0.9107
Epoch 819/2000
inary_accuracy: 0.9087 - ETA: 0s - loss: 0.0746 - binary_accur
acy: 0.913
Epoch 820/2000
inary accuracy: 0.9100
Epoch 821/2000
inary accuracy: 0.9100
Epoch 822/2000
inary accuracy: 0.9113
Epoch 823/2000
inary_accuracy: 0.9100
Epoch 824/2000
inary accuracy: 0.9100
Epoch 825/2000
inary_accuracy: 0.9080
Epoch 826/2000
inary_accuracy: 0.9107
Epoch 827/2000
```

```
inary accuracy: 0.9100
Epoch 828/2000
inary_accuracy: 0.9087
Epoch 829/2000
1500/1500 [==============] - 0s - loss: 0.0772 - b
inary accuracy: 0.9093
Epoch 830/2000
1500/1500 [==============] - 0s - loss: 0.0772 - b
inary accuracy: 0.9100
Epoch 831/2000
inary_accuracy: 0.9127
Epoch 832/2000
inary_accuracy: 0.9087
Epoch 833/2000
1500/1500 [============== ] - 0s - loss: 0.0772 - b
inary accuracy: 0.9080
Epoch 834/2000
inary accuracy: 0.9093
Epoch 835/2000
1500/1500 [==============] - 0s - loss: 0.0771 - b
inary_accuracy: 0.9087
Epoch 836/2000
1500/1500 [==============] - 0s - loss: 0.0771 - b
inary_accuracy: 0.9087
Epoch 837/2000
inary accuracy: 0.9080
Epoch 838/2000
inary accuracy: 0.9100
Epoch 839/2000
inary accuracy: 0.9100
Epoch 840/2000
inary accuracy: 0.9093
Epoch 841/2000
1500/1500 [=============== ] - 0s - loss: 0.0771 - b
inary accuracy: 0.9087
Epoch 842/2000
inary_accuracy: 0.9107
Epoch 843/2000
inary accuracy: 0.9100
Epoch 844/2000
inary_accuracy: 0.9087
Epoch 845/2000
inary accuracy: 0.9107
Epoch 846/2000
```

```
inary accuracy: 0.9080
Epoch 847/2000
inary_accuracy: 0.9107
Epoch 848/2000
1500/1500 [==============] - 0s - loss: 0.0770 - b
inary accuracy: 0.9120
Epoch 849/2000
1500/1500 [==============] - 0s - loss: 0.0769 - b
inary_accuracy: 0.9080
Epoch 850/2000
inary accuracy: 0.9100
Epoch 851/2000
inary_accuracy: 0.9107
Epoch 852/2000
inary accuracy: 0.9113
Epoch 853/2000
inary accuracy: 0.9100
Epoch 854/2000
1500/1500 [============== ] - 0s - loss: 0.0769 - b
inary_accuracy: 0.9113
Epoch 855/2000
1500/1500 [==============] - 0s - loss: 0.0769 - b
inary_accuracy: 0.9073
Epoch 856/2000
inary accuracy: 0.9093
Epoch 857/2000
inary accuracy: 0.9093
Epoch 858/2000
inary accuracy: 0.9087
Epoch 859/2000
inary accuracy: 0.9080
Epoch 860/2000
1500/1500 [=============== ] - 0s - loss: 0.0768 - b
inary accuracy: 0.9100
Epoch 861/2000
inary_accuracy: 0.9087
Epoch 862/2000
inary accuracy: 0.9080
Epoch 863/2000
inary_accuracy: 0.9080
Epoch 864/2000
inary accuracy: 0.9073
Epoch 865/2000
```

```
inary accuracy: 0.9093
Epoch 866/2000
inary_accuracy: 0.9100
Epoch 867/2000
1500/1500 [==============] - 0s - loss: 0.0767 - b
inary accuracy: 0.9080
Epoch 868/2000
1500/1500 [==============] - 0s - loss: 0.0766 - b
inary_accuracy: 0.9087
Epoch 869/2000
1500/1500 [=============== ] - 0s - loss: 0.0766 - b
inary accuracy: 0.9107
Epoch 870/2000
inary_accuracy: 0.9107
Epoch 871/2000
1500/1500 [=============== ] - 0s - loss: 0.0766 - b
inary accuracy: 0.9087
Epoch 872/2000
inary accuracy: 0.9093
Epoch 873/2000
1500/1500 [============== ] - 0s - loss: 0.0766 - b
inary_accuracy: 0.9100
Epoch 874/2000
1500/1500 [==============] - 0s - loss: 0.0767 - b
inary_accuracy: 0.9093
Epoch 875/2000
inary_accuracy: 0.9107
Epoch 876/2000
1500/1500 [============== ] - 0s - loss: 0.0765 - b
inary accuracy: 0.9113
Epoch 877/2000
inary accuracy: 0.9080
Epoch 878/2000
inary accuracy: 0.9087
Epoch 879/2000
inary accuracy: 0.9080
Epoch 880/2000
inary_accuracy: 0.9107
Epoch 881/2000
inary accuracy: 0.9073
Epoch 882/2000
inary_accuracy: 0.9093
Epoch 883/2000
inary accuracy: 0.9080
Epoch 884/2000
```

```
inary_accuracy: 0.9087
Epoch 885/2000
1500/1500 [=============== ] - 0s - loss: 0.0764 - b
inary_accuracy: 0.9087
Epoch 886/2000
1500/1500 [==============] - 0s - loss: 0.0764 - b
inary accuracy: 0.9100
Epoch 887/2000
1500/1500 [==============] - 0s - loss: 0.0764 - b
inary_accuracy: 0.9087
Epoch 888/2000
inary accuracy: 0.9093
Epoch 889/2000
inary_accuracy: 0.9093
Epoch 890/2000
1500/1500 [=============== ] - 0s - loss: 0.0763 - b
inary accuracy: 0.9100
Epoch 891/2000
inary accuracy: 0.9093
Epoch 892/2000
1500/1500 [============== ] - 0s - loss: 0.0763 - b
inary_accuracy: 0.9080
Epoch 893/2000
1500/1500 [==============] - 0s - loss: 0.0764 - b
inary_accuracy: 0.9087
Epoch 894/2000
inary accuracy: 0.9093
Epoch 895/2000
1500/1500 [============== ] - 0s - loss: 0.0763 - b
inary accuracy: 0.9093
Epoch 896/2000
inary accuracy: 0.9093
Epoch 897/2000
inary accuracy: 0.9107
Epoch 898/2000
inary accuracy: 0.9100
Epoch 899/2000
inary_accuracy: 0.9087
Epoch 900/2000
inary accuracy: 0.9087
Epoch 901/2000
inary_accuracy: 0.9093
Epoch 902/2000
inary accuracy: 0.9100
Epoch 903/2000
```

```
inary accuracy: 0.9093
Epoch 904/2000
1500/1500 [=============== ] - 0s - loss: 0.0763 - b
inary_accuracy: 0.9087
Epoch 905/2000
1500/1500 [==============] - 0s - loss: 0.0762 - b
inary accuracy: 0.9073
Epoch 906/2000
inary_accuracy: 0.9087
Epoch 907/2000
inary accuracy: 0.9093
Epoch 908/2000
inary_accuracy: 0.9087
Epoch 909/2000
inary accuracy: 0.9093
Epoch 910/2000
inary accuracy: 0.9087
Epoch 911/2000
1500/1500 [============== ] - 0s - loss: 0.0761 - b
inary_accuracy: 0.9087
Epoch 912/2000
1500/1500 [==============] - 0s - loss: 0.0760 - b
inary accuracy: 0.9100
Epoch 913/2000
inary accuracy: 0.9080
Epoch 914/2000
1500/1500 [============== ] - 0s - loss: 0.0761 - b
inary accuracy: 0.9087
Epoch 915/2000
inary accuracy: 0.9080
Epoch 916/2000
inary accuracy: 0.9100
Epoch 917/2000
1500/1500 [=============== ] - 0s - loss: 0.0760 - b
inary accuracy: 0.9093
Epoch 918/2000
inary_accuracy: 0.9100
Epoch 919/2000
inary accuracy: 0.9087
Epoch 920/2000
inary_accuracy: 0.9100
Epoch 921/2000
inary accuracy: 0.9100
Epoch 922/2000
```

```
inary accuracy: 0.9080
Epoch 923/2000
inary_accuracy: 0.9113
Epoch 924/2000
1500/1500 [==============] - 0s - loss: 0.0760 - b
inary accuracy: 0.9100
Epoch 925/2000
inary_accuracy: 0.9100
Epoch 926/2000
inary accuracy: 0.9093
Epoch 927/2000
inary_accuracy: 0.9080
Epoch 928/2000
1500/1500 [=============== ] - 0s - loss: 0.0758 - b
inary accuracy: 0.9087
Epoch 929/2000
inary accuracy: 0.9093
Epoch 930/2000
1500/1500 [============== ] - 0s - loss: 0.0758 - b
inary_accuracy: 0.9093
Epoch 931/2000
1500/1500 [=============== ] - 0s - loss: 0.0758 - b
inary accuracy: 0.9093
Epoch 932/2000
inary accuracy: 0.9093
Epoch 933/2000
1500/1500 [============== ] - 0s - loss: 0.0757 - b
inary accuracy: 0.9113
Epoch 934/2000
inary accuracy: 0.9113
Epoch 935/2000
inary accuracy: 0.9100
Epoch 936/2000
inary accuracy: 0.9093
Epoch 937/2000
inary_accuracy: 0.9100
Epoch 938/2000
inary accuracy: 0.9093
Epoch 939/2000
inary_accuracy: 0.9107
Epoch 940/2000
inary accuracy: 0.9100
Epoch 941/2000
```

```
inary accuracy: 0.9100
Epoch 942/2000
inary_accuracy: 0.9113
Epoch 943/2000
1500/1500 [==============] - 0s - loss: 0.0756 - b
inary accuracy: 0.9100
Epoch 944/2000
1500/1500 [==============] - 0s - loss: 0.0756 - b
inary_accuracy: 0.9113
Epoch 945/2000
1500/1500 [=============== ] - 0s - loss: 0.0756 - b
inary accuracy: 0.9107
Epoch 946/2000
inary_accuracy: 0.9107
Epoch 947/2000
1500/1500 [=============== ] - 0s - loss: 0.0755 - b
inary accuracy: 0.9107
Epoch 948/2000
inary accuracy: 0.9100
Epoch 949/2000
1500/1500 [=============== ] - 0s - loss: 0.0756 - b
inary_accuracy: 0.9113
Epoch 950/2000
1500/1500 [=============== ] - 0s - loss: 0.0755 - b
inary accuracy: 0.9107
Epoch 951/2000
inary accuracy: 0.9113
Epoch 952/2000
1500/1500 [============== ] - 0s - loss: 0.0755 - b
inary accuracy: 0.9100
Epoch 953/2000
inary accuracy: 0.9113
Epoch 954/2000
inary accuracy: 0.9107
Epoch 955/2000
1500/1500 [=============== ] - 0s - loss: 0.0755 - b
inary accuracy: 0.9100
Epoch 956/2000
inary_accuracy: 0.9107
Epoch 957/2000
inary accuracy: 0.9107
Epoch 958/2000
inary_accuracy: 0.9113
Epoch 959/2000
inary accuracy: 0.9120
Epoch 960/2000
```

```
inary accuracy: 0.9113
Epoch 961/2000
inary_accuracy: 0.9127
Epoch 962/2000
1500/1500 [==============] - 0s - loss: 0.0754 - b
inary accuracy: 0.9113
Epoch 963/2000
1500/1500 [==============] - 0s - loss: 0.0754 - b
inary_accuracy: 0.9113
Epoch 964/2000
inary accuracy: 0.9100
Epoch 965/2000
inary_accuracy: 0.9113
Epoch 966/2000
inary accuracy: 0.9100
Epoch 967/2000
inary accuracy: 0.9120
Epoch 968/2000
1500/1500 [============== ] - 0s - loss: 0.0754 - b
inary_accuracy: 0.9120
Epoch 969/2000
1500/1500 [==============] - 0s - loss: 0.0753 - b
inary accuracy: 0.9107
Epoch 970/2000
inary accuracy: 0.9107
Epoch 971/2000
1500/1500 [============== ] - 0s - loss: 0.0753 - b
inary accuracy: 0.9120
Epoch 972/2000
inary accuracy: 0.9113
Epoch 973/2000
inary accuracy: 0.9113
Epoch 974/2000
inary accuracy: 0.9113
Epoch 975/2000
inary_accuracy: 0.9120
Epoch 976/2000
inary accuracy: 0.9113
Epoch 977/2000
inary_accuracy: 0.9127
Epoch 978/2000
inary accuracy: 0.9120
Epoch 979/2000
```

```
inary accuracy: 0.9120
Epoch 980/2000
inary_accuracy: 0.9107
Epoch 981/2000
1500/1500 [==============] - 0s - loss: 0.0752 - b
inary accuracy: 0.9107
Epoch 982/2000
1500/1500 [==============] - 0s - loss: 0.0753 - b
inary_accuracy: 0.9133
Epoch 983/2000
inary accuracy: 0.9133
Epoch 984/2000
inary_accuracy: 0.9113
Epoch 985/2000
inary accuracy: 0.9127
Epoch 986/2000
inary accuracy: 0.9100
Epoch 987/2000
1500/1500 [============== ] - 0s - loss: 0.0751 - b
inary_accuracy: 0.9100
Epoch 988/2000
1500/1500 [==============] - 0s - loss: 0.0752 - b
inary accuracy: 0.9113
Epoch 989/2000
inary accuracy: 0.9120
Epoch 990/2000
1500/1500 [============== ] - 0s - loss: 0.0751 - b
inary accuracy: 0.9133
Epoch 991/2000
inary accuracy: 0.9113
Epoch 992/2000
inary accuracy: 0.9093
Epoch 993/2000
inary accuracy: 0.9107
Epoch 994/2000
inary_accuracy: 0.9120
Epoch 995/2000
inary accuracy: 0.9120
Epoch 996/2000
inary_accuracy: 0.9100
Epoch 997/2000
inary accuracy: 0.9127
Epoch 998/2000
```

```
inary_accuracy: 0.9120
Epoch 999/2000
inary_accuracy: 0.9147
Epoch 1000/2000
inary accuracy: 0.9107
Epoch 1001/2000
1500/1500 [==============] - 0s - loss: 0.0750 - b
inary accuracy: 0.9127
Epoch 1002/2000
inary_accuracy: 0.9127
Epoch 1003/2000
inary_accuracy: 0.9107
Epoch 1004/2000
1500/1500 [============== ] - 0s - loss: 0.0749 - b
inary accuracy: 0.9120
Epoch 1005/2000
inary accuracy: 0.9120
Epoch 1006/2000
inary_accuracy: 0.9107
Epoch 1007/2000
inary_accuracy: 0.9113
Epoch 1008/2000
inary accuracy: 0.9113
Epoch 1009/2000
1500/1500 [============== ] - 0s - loss: 0.0748 - b
inary accuracy: 0.9140
Epoch 1010/2000
inary accuracy: 0.9120
Epoch 1011/2000
inary_accuracy: 0.9127 - ETA: 0s - loss: 0.0728 - binary_accur
acy: 0.916
Epoch 1012/2000
inary accuracy: 0.9133
Epoch 1013/2000
inary_accuracy: 0.9113
Epoch 1014/2000
inary accuracy: 0.9127
Epoch 1015/2000
inary accuracy: 0.9120
Epoch 1016/2000
inary_accuracy: 0.9100
Epoch 1017/2000
```

```
inary accuracy: 0.9113
Epoch 1018/2000
inary accuracy: 0.9140
Epoch 1019/2000
inary accuracy: 0.9120
Epoch 1020/2000
inary accuracy: 0.9107
Epoch 1021/2000
inary accuracy: 0.9100
Epoch 1022/2000
inary accuracy: 0.9133
Epoch 1023/2000
inary accuracy: 0.9120
Epoch 1024/2000
inary accuracy: 0.9100
Epoch 1025/2000
inary accuracy: 0.9127
Epoch 1026/2000
inary accuracy: 0.9113
Epoch 1027/2000
inary accuracy: 0.9120
Epoch 1028/2000
inary_accuracy: 0.9140
Epoch 1029/2000
inary_accuracy: 0.9120
Epoch 1030/2000
inary_accuracy: 0.9133
Epoch 1031/2000
inary accuracy: 0.9133
Epoch 1032/2000
inary_accuracy: 0.9160
Epoch 1033/2000
inary accuracy: 0.9133
Epoch 1034/2000
inary accuracy: 0.9127
Epoch 1035/2000
inary_accuracy: 0.9127
Epoch 1036/2000
```

```
inary accuracy: 0.9113
Epoch 1037/2000
inary accuracy: 0.9113
Epoch 1038/2000
inary accuracy: 0.9127
Epoch 1039/2000
inary accuracy: 0.9120
Epoch 1040/2000
inary accuracy: 0.9140
Epoch 1041/2000
inary accuracy: 0.9120
Epoch 1042/2000
inary_accuracy: 0.9127
Epoch 1043/2000
inary accuracy: 0.9140
Epoch 1044/2000
inary_accuracy: 0.9127
Epoch 1045/2000
inary accuracy: 0.9133
Epoch 1046/2000
inary_accuracy: 0.9133
Epoch 1047/2000
inary accuracy: 0.9147
Epoch 1048/2000
inary accuracy: 0.9133 - ETA: 0s - loss: 0.0744 - binary accur
acy: 0.913
Epoch 1049/2000
inary accuracy: 0.9120
Epoch 1050/2000
inary accuracy: 0.9153
Epoch 1051/2000
inary accuracy: 0.9127
Epoch 1052/2000
1500/1500 [==============] - 0s - loss: 0.0745 - b
inary accuracy: 0.9133
Epoch 1053/2000
inary accuracy: 0.9147
Epoch 1054/2000
inary_accuracy: 0.9120
```

```
Epoch 1055/2000
1500/1500 [=============== ] - 0s - loss: 0.0745 - b
inary_accuracy: 0.9140
Epoch 1056/2000
inary accuracy: 0.9147
Epoch 1057/2000
inary_accuracy: 0.9107
Epoch 1058/2000
inary_accuracy: 0.9140
Epoch 1059/2000
inary accuracy: 0.9133
Epoch 1060/2000
1500/1500 [==============] - 0s - loss: 0.0744 - b
inary accuracy: 0.9140
Epoch 1061/2000
inary accuracy: 0.9127
Epoch 1062/2000
1500/1500 [=============== ] - 0s - loss: 0.0743 - b
inary accuracy: 0.9120
Epoch 1063/2000
inary accuracy: 0.9133
Epoch 1064/2000
inary accuracy: 0.9140
Epoch 1065/2000
inary accuracy: 0.9133
Epoch 1066/2000
inary accuracy: 0.9100
Epoch 1067/2000
inary accuracy: 0.9140
Epoch 1068/2000
inary accuracy: 0.9147
Epoch 1069/2000
inary accuracy: 0.9133
Epoch 1070/2000
inary accuracy: 0.9127
Epoch 1071/2000
1500/1500 [==============] - 0s - loss: 0.0743 - b
inary accuracy: 0.9147
Epoch 1072/2000
inary accuracy: 0.9113
Epoch 1073/2000
inary_accuracy: 0.9153
```

```
Epoch 1074/2000
inary_accuracy: 0.9120
Epoch 1075/2000
inary accuracy: 0.9140
Epoch 1076/2000
1500/1500 [=============== ] - 0s - loss: 0.0743 - b
inary_accuracy: 0.9140
Epoch 1077/2000
inary_accuracy: 0.9120
Epoch 1078/2000
inary accuracy: 0.9140
Epoch 1079/2000
1500/1500 [==============] - 0s - loss: 0.0743 - b
inary accuracy: 0.9140
Epoch 1080/2000
inary accuracy: 0.9120
Epoch 1081/2000
1500/1500 [=============== ] - 0s - loss: 0.0743 - b
inary accuracy: 0.9120
Epoch 1082/2000
inary accuracy: 0.9127
Epoch 1083/2000
inary accuracy: 0.9113
Epoch 1084/2000
inary accuracy: 0.9127
Epoch 1085/2000
inary accuracy: 0.9120
Epoch 1086/2000
inary accuracy: 0.9147
Epoch 1087/2000
inary accuracy: 0.9113
Epoch 1088/2000
inary accuracy: 0.9133
Epoch 1089/2000
inary accuracy: 0.9120
Epoch 1090/2000
1500/1500 [==============] - 0s - loss: 0.0742 - b
inary accuracy: 0.9133
Epoch 1091/2000
inary accuracy: 0.9120
Epoch 1092/2000
inary_accuracy: 0.9120
```

```
Epoch 1093/2000
1500/1500 [=============== ] - 0s - loss: 0.0742 - b
inary_accuracy: 0.9127
Epoch 1094/2000
inary accuracy: 0.9133
Epoch 1095/2000
inary_accuracy: 0.9107
Epoch 1096/2000
inary_accuracy: 0.9120
Epoch 1097/2000
inary accuracy: 0.9113
Epoch 1098/2000
1500/1500 [==============] - 0s - loss: 0.0741 - b
inary accuracy: 0.9140
Epoch 1099/2000
inary accuracy: 0.9120
Epoch 1100/2000
1500/1500 [=============== ] - 0s - loss: 0.0741 - b
inary accuracy: 0.9133
Epoch 1101/2000
inary accuracy: 0.9127
Epoch 1102/2000
inary accuracy: 0.9140
Epoch 1103/2000
inary accuracy: 0.9127
Epoch 1104/2000
inary accuracy: 0.9133
Epoch 1105/2000
inary accuracy: 0.9127
Epoch 1106/2000
inary accuracy: 0.9133
Epoch 1107/2000
inary accuracy: 0.9120
Epoch 1108/2000
inary accuracy: 0.9127
Epoch 1109/2000
1500/1500 [==============] - 0s - loss: 0.0740 - b
inary accuracy: 0.9120
Epoch 1110/2000
inary accuracy: 0.9133
Epoch 1111/2000
inary_accuracy: 0.9127
```

```
Epoch 1112/2000
1500/1500 [=============== ] - 0s - loss: 0.0741 - b
inary_accuracy: 0.9140
Epoch 1113/2000
inary accuracy: 0.9127
Epoch 1114/2000
inary_accuracy: 0.9127
Epoch 1115/2000
inary_accuracy: 0.9127
Epoch 1116/2000
inary accuracy: 0.9133
Epoch 1117/2000
1500/1500 [==============] - 0s - loss: 0.0740 - b
inary accuracy: 0.9120
Epoch 1118/2000
inary accuracy: 0.9153
Epoch 1119/2000
1500/1500 [=============== ] - 0s - loss: 0.0740 - b
inary accuracy: 0.9120
Epoch 1120/2000
inary accuracy: 0.9120
Epoch 1121/2000
inary accuracy: 0.9133
Epoch 1122/2000
inary accuracy: 0.9140
Epoch 1123/2000
inary accuracy: 0.9153
Epoch 1124/2000
inary accuracy: 0.9120
Epoch 1125/2000
1500/1500 [============== ] - 0s - loss: 0.0739 - b
inary accuracy: 0.9127
Epoch 1126/2000
inary accuracy: 0.9127
Epoch 1127/2000
inary accuracy: 0.9133
Epoch 1128/2000
1500/1500 [==============] - 0s - loss: 0.0739 - b
inary accuracy: 0.9140
Epoch 1129/2000
inary accuracy: 0.9133
Epoch 1130/2000
inary_accuracy: 0.9127
```

```
Epoch 1131/2000
1500/1500 [=============== ] - 0s - loss: 0.0739 - b
inary_accuracy: 0.9120
Epoch 1132/2000
inary accuracy: 0.9147
Epoch 1133/2000
inary_accuracy: 0.9120
Epoch 1134/2000
inary_accuracy: 0.9140
Epoch 1135/2000
inary accuracy: 0.9147
Epoch 1136/2000
1500/1500 [==============] - 0s - loss: 0.0739 - b
inary accuracy: 0.9127
Epoch 1137/2000
inary accuracy: 0.9120
Epoch 1138/2000
1500/1500 [=============== ] - 0s - loss: 0.0739 - b
inary accuracy: 0.9100
Epoch 1139/2000
inary accuracy: 0.9120
Epoch 1140/2000
inary accuracy: 0.9120
Epoch 1141/2000
inary accuracy: 0.9133
Epoch 1142/2000
inary accuracy: 0.9113
Epoch 1143/2000
inary accuracy: 0.9140
Epoch 1144/2000
inary accuracy: 0.9127
Epoch 1145/2000
inary accuracy: 0.9140
Epoch 1146/2000
inary accuracy: 0.9160
Epoch 1147/2000
1500/1500 [==============] - 0s - loss: 0.0738 - b
inary accuracy: 0.9127
Epoch 1148/2000
inary accuracy: 0.9133
Epoch 1149/2000
inary_accuracy: 0.9140
```

```
Epoch 1150/2000
1500/1500 [=============== ] - 0s - loss: 0.0738 - b
inary_accuracy: 0.9120
Epoch 1151/2000
inary accuracy: 0.9127
Epoch 1152/2000
1500/1500 [=============== ] - 0s - loss: 0.0737 - b
inary_accuracy: 0.9113
Epoch 1153/2000
inary_accuracy: 0.9133
Epoch 1154/2000
inary accuracy: 0.9133
Epoch 1155/2000
1500/1500 [==============] - 0s - loss: 0.0738 - b
inary accuracy: 0.9127
Epoch 1156/2000
inary accuracy: 0.9127
Epoch 1157/2000
1500/1500 [=============== ] - 0s - loss: 0.0737 - b
inary accuracy: 0.9113
Epoch 1158/2000
inary accuracy: 0.9140
Epoch 1159/2000
inary accuracy: 0.9120
Epoch 1160/2000
inary accuracy: 0.9127
Epoch 1161/2000
inary accuracy: 0.9113
Epoch 1162/2000
inary accuracy: 0.9113
Epoch 1163/2000
inary accuracy: 0.9140
Epoch 1164/2000
inary accuracy: 0.9133
Epoch 1165/2000
inary accuracy: 0.9120
Epoch 1166/2000
1500/1500 [==============] - 0s - loss: 0.0737 - b
inary accuracy: 0.9120
Epoch 1167/2000
inary accuracy: 0.9127
Epoch 1168/2000
inary_accuracy: 0.9133
```

```
Epoch 1169/2000
inary_accuracy: 0.9127
Epoch 1170/2000
inary accuracy: 0.9127
Epoch 1171/2000
inary_accuracy: 0.9147
Epoch 1172/2000
inary_accuracy: 0.9107
Epoch 1173/2000
inary accuracy: 0.9133
Epoch 1174/2000
1500/1500 [==============] - 0s - loss: 0.0736 - b
inary accuracy: 0.9127
Epoch 1175/2000
inary accuracy: 0.9127
Epoch 1176/2000
1500/1500 [=============== ] - 0s - loss: 0.0736 - b
inary accuracy: 0.9120
Epoch 1177/2000
inary accuracy: 0.9113
Epoch 1178/2000
inary accuracy: 0.9120
Epoch 1179/2000
inary accuracy: 0.9140
Epoch 1180/2000
inary accuracy: 0.9113
Epoch 1181/2000
inary accuracy: 0.9120
Epoch 1182/2000
inary accuracy: 0.9133
Epoch 1183/2000
inary accuracy: 0.9127
Epoch 1184/2000
inary accuracy: 0.9140
Epoch 1185/2000
1500/1500 [==============] - 0s - loss: 0.0735 - b
inary accuracy: 0.9127
Epoch 1186/2000
inary accuracy: 0.9140
Epoch 1187/2000
inary_accuracy: 0.9147
```

```
Epoch 1188/2000
1500/1500 [============== ] - 0s - loss: 0.0735 - b
inary_accuracy: 0.9133
Epoch 1189/2000
inary accuracy: 0.9127
Epoch 1190/2000
inary_accuracy: 0.9127
Epoch 1191/2000
inary_accuracy: 0.9120
Epoch 1192/2000
inary accuracy: 0.9120
Epoch 1193/2000
1500/1500 [==============] - 0s - loss: 0.0734 - b
inary accuracy: 0.9133
Epoch 1194/2000
inary accuracy: 0.9133
Epoch 1195/2000
1500/1500 [=============== ] - 0s - loss: 0.0734 - b
inary accuracy: 0.9140
Epoch 1196/2000
inary accuracy: 0.9120
Epoch 1197/2000
inary accuracy: 0.9120
Epoch 1198/2000
inary accuracy: 0.9127
Epoch 1199/2000
inary accuracy: 0.9133
Epoch 1200/2000
inary accuracy: 0.9127
Epoch 1201/2000
inary accuracy: 0.9133
Epoch 1202/2000
inary accuracy: 0.9107
Epoch 1203/2000
inary accuracy: 0.9127
Epoch 1204/2000
1500/1500 [==============] - 0s - loss: 0.0734 - b
inary accuracy: 0.9140
Epoch 1205/2000
inary accuracy: 0.9120
Epoch 1206/2000
inary_accuracy: 0.9147
```

```
Epoch 1207/2000
1500/1500 [=============== ] - 0s - loss: 0.0734 - b
inary_accuracy: 0.9140
Epoch 1208/2000
inary accuracy: 0.9127
Epoch 1209/2000
inary_accuracy: 0.9127
Epoch 1210/2000
inary_accuracy: 0.9127
Epoch 1211/2000
inary accuracy: 0.9107
Epoch 1212/2000
1500/1500 [==============] - 0s - loss: 0.0734 - b
inary accuracy: 0.9127
Epoch 1213/2000
inary accuracy: 0.9120
Epoch 1214/2000
1500/1500 [=============== ] - 0s - loss: 0.0734 - b
inary accuracy: 0.9127
Epoch 1215/2000
inary accuracy: 0.9133
Epoch 1216/2000
inary accuracy: 0.9127
Epoch 1217/2000
1500/1500 [=============== ] - 0s - loss: 0.0733 - b
inary accuracy: 0.9113
Epoch 1218/2000
inary accuracy: 0.9147
Epoch 1219/2000
inary accuracy: 0.9127
Epoch 1220/2000
inary accuracy: 0.9120
Epoch 1221/2000
inary accuracy: 0.9120
Epoch 1222/2000
inary accuracy: 0.9127
Epoch 1223/2000
inary accuracy: 0.9133
Epoch 1224/2000
inary accuracy: 0.9133
Epoch 1225/2000
inary_accuracy: 0.9133
```

```
Epoch 1226/2000
inary_accuracy: 0.9140
Epoch 1227/2000
inary accuracy: 0.9147
Epoch 1228/2000
1500/1500 [=============== ] - 0s - loss: 0.0733 - b
inary_accuracy: 0.9127
Epoch 1229/2000
inary_accuracy: 0.9140
Epoch 1230/2000
inary accuracy: 0.9153
Epoch 1231/2000
1500/1500 [==============] - 0s - loss: 0.0732 - b
inary accuracy: 0.9147
Epoch 1232/2000
inary accuracy: 0.9127
Epoch 1233/2000
1500/1500 [=============== ] - 0s - loss: 0.0733 - b
inary accuracy: 0.9113
Epoch 1234/2000
inary accuracy: 0.9120
Epoch 1235/2000
inary accuracy: 0.9127
Epoch 1236/2000
1500/1500 [==============] - 0s - loss: 0.0732 - b
inary accuracy: 0.9140
Epoch 1237/2000
inary accuracy: 0.9133
Epoch 1238/2000
inary accuracy: 0.9153
Epoch 1239/2000
inary accuracy: 0.9127
Epoch 1240/2000
inary accuracy: 0.9140
Epoch 1241/2000
inary accuracy: 0.9147
Epoch 1242/2000
inary accuracy: 0.9140
Epoch 1243/2000
inary accuracy: 0.9147
Epoch 1244/2000
inary_accuracy: 0.9120
```

```
Epoch 1245/2000
inary_accuracy: 0.9153
Epoch 1246/2000
inary accuracy: 0.9140
Epoch 1247/2000
inary_accuracy: 0.9140
Epoch 1248/2000
inary_accuracy: 0.9140
Epoch 1249/2000
inary accuracy: 0.9140
Epoch 1250/2000
1500/1500 [==============] - 0s - loss: 0.0732 - b
inary accuracy: 0.9147
Epoch 1251/2000
inary accuracy: 0.9133
Epoch 1252/2000
1500/1500 [=============== ] - 0s - loss: 0.0731 - b
inary accuracy: 0.9140
Epoch 1253/2000
inary accuracy: 0.9133
Epoch 1254/2000
inary accuracy: 0.9147
Epoch 1255/2000
1500/1500 [==============] - 0s - loss: 0.0732 - b
inary accuracy: 0.9127
Epoch 1256/2000
inary accuracy: 0.9133
Epoch 1257/2000
inary accuracy: 0.9147
Epoch 1258/2000
inary accuracy: 0.9140
Epoch 1259/2000
inary accuracy: 0.9133
Epoch 1260/2000
inary accuracy: 0.9160
Epoch 1261/2000
1500/1500 [==============] - 0s - loss: 0.0731 - b
inary accuracy: 0.9147
Epoch 1262/2000
inary accuracy: 0.9140
Epoch 1263/2000
inary_accuracy: 0.9127
```

```
Epoch 1264/2000
inary_accuracy: 0.9147
Epoch 1265/2000
inary accuracy: 0.9153
Epoch 1266/2000
inary_accuracy: 0.9133
Epoch 1267/2000
inary_accuracy: 0.9153
Epoch 1268/2000
inary accuracy: 0.9140
Epoch 1269/2000
1500/1500 [==============] - 0s - loss: 0.0731 - b
inary accuracy: 0.9147
Epoch 1270/2000
inary accuracy: 0.9140
Epoch 1271/2000
1500/1500 [=============== ] - 0s - loss: 0.0731 - b
inary accuracy: 0.9140
Epoch 1272/2000
inary accuracy: 0.9133
Epoch 1273/2000
inary accuracy: 0.9147
Epoch 1274/2000
inary accuracy: 0.9140
Epoch 1275/2000
inary accuracy: 0.9147
Epoch 1276/2000
inary accuracy: 0.9133
Epoch 1277/2000
1500/1500 [=============== ] - 0s - loss: 0.0731 - b
inary accuracy: 0.9140
Epoch 1278/2000
inary accuracy: 0.9140
Epoch 1279/2000
inary accuracy: 0.9140
Epoch 1280/2000
1500/1500 [==============] - 0s - loss: 0.0731 - b
inary accuracy: 0.9160
Epoch 1281/2000
inary accuracy: 0.9160
Epoch 1282/2000
inary_accuracy: 0.9133
```

```
Epoch 1283/2000
1500/1500 [=============== ] - 0s - loss: 0.0730 - b
inary_accuracy: 0.9147
Epoch 1284/2000
inary accuracy: 0.9147
Epoch 1285/2000
1500/1500 [=============== ] - 0s - loss: 0.0730 - b
inary_accuracy: 0.9147
Epoch 1286/2000
inary_accuracy: 0.9153
Epoch 1287/2000
inary accuracy: 0.9140
Epoch 1288/2000
1500/1500 [==============] - 0s - loss: 0.0730 - b
inary accuracy: 0.9140
Epoch 1289/2000
inary accuracy: 0.9140
Epoch 1290/2000
1500/1500 [============== ] - 0s - loss: 0.0729 - b
inary accuracy: 0.9153
Epoch 1291/2000
inary accuracy: 0.9140
Epoch 1292/2000
inary accuracy: 0.9153
Epoch 1293/2000
inary accuracy: 0.9140
Epoch 1294/2000
inary accuracy: 0.9147
Epoch 1295/2000
inary accuracy: 0.9140
Epoch 1296/2000
inary accuracy: 0.9147
Epoch 1297/2000
inary accuracy: 0.9140
Epoch 1298/2000
inary accuracy: 0.9160
Epoch 1299/2000
1500/1500 [==============] - 0s - loss: 0.0729 - b
inary accuracy: 0.9140
Epoch 1300/2000
inary accuracy: 0.9160
Epoch 1301/2000
inary_accuracy: 0.9140
```

```
Epoch 1302/2000
1500/1500 [=============== ] - 0s - loss: 0.0728 - b
inary_accuracy: 0.9160
Epoch 1303/2000
inary accuracy: 0.9153
Epoch 1304/2000
1500/1500 [=============== ] - 0s - loss: 0.0729 - b
inary_accuracy: 0.9153
Epoch 1305/2000
inary_accuracy: 0.9153
Epoch 1306/2000
inary accuracy: 0.9147
Epoch 1307/2000
1500/1500 [==============] - 0s - loss: 0.0728 - b
inary accuracy: 0.9153
Epoch 1308/2000
inary accuracy: 0.9167
Epoch 1309/2000
inary accuracy: 0.9153
Epoch 1310/2000
inary accuracy: 0.9160
Epoch 1311/2000
inary accuracy: 0.9167
Epoch 1312/2000
inary accuracy: 0.9160
Epoch 1313/2000
inary accuracy: 0.9153
Epoch 1314/2000
inary accuracy: 0.9153
Epoch 1315/2000
inary accuracy: 0.9140
Epoch 1316/2000
inary accuracy: 0.9147
Epoch 1317/2000
inary accuracy: 0.9147
Epoch 1318/2000
1500/1500 [==============] - 0s - loss: 0.0728 - b
inary accuracy: 0.9160
Epoch 1319/2000
inary accuracy: 0.9153
Epoch 1320/2000
inary_accuracy: 0.9153
```

```
Epoch 1321/2000
1500/1500 [=============== ] - 0s - loss: 0.0728 - b
inary_accuracy: 0.9167
Epoch 1322/2000
inary accuracy: 0.9147
Epoch 1323/2000
inary_accuracy: 0.9147
Epoch 1324/2000
inary_accuracy: 0.9153
Epoch 1325/2000
inary accuracy: 0.9153
Epoch 1326/2000
1500/1500 [==============] - 0s - loss: 0.0727 - b
inary accuracy: 0.9153
Epoch 1327/2000
inary accuracy: 0.9160
Epoch 1328/2000
inary accuracy: 0.9147
Epoch 1329/2000
inary accuracy: 0.9160
Epoch 1330/2000
inary accuracy: 0.9160
Epoch 1331/2000
inary accuracy: 0.9160
Epoch 1332/2000
inary accuracy: 0.9167
Epoch 1333/2000
inary accuracy: 0.9160
Epoch 1334/2000
inary accuracy: 0.9147
Epoch 1335/2000
inary accuracy: 0.9153
Epoch 1336/2000
inary accuracy: 0.9153
Epoch 1337/2000
1500/1500 [==============] - 0s - loss: 0.0727 - b
inary accuracy: 0.9160
Epoch 1338/2000
inary accuracy: 0.9160
Epoch 1339/2000
inary_accuracy: 0.9180
```

```
Epoch 1340/2000
inary_accuracy: 0.9160
Epoch 1341/2000
inary accuracy: 0.9160
Epoch 1342/2000
inary_accuracy: 0.9153
Epoch 1343/2000
inary_accuracy: 0.9160
Epoch 1344/2000
inary accuracy: 0.9193
Epoch 1345/2000
1500/1500 [==============] - 0s - loss: 0.0727 - b
inary accuracy: 0.9160
Epoch 1346/2000
inary accuracy: 0.9167
Epoch 1347/2000
1500/1500 [=============== ] - 0s - loss: 0.0727 - b
inary accuracy: 0.9153
Epoch 1348/2000
inary accuracy: 0.9153
Epoch 1349/2000
inary accuracy: 0.9140
Epoch 1350/2000
inary accuracy: 0.9160
Epoch 1351/2000
inary accuracy: 0.9140
Epoch 1352/2000
inary accuracy: 0.9180
Epoch 1353/2000
inary accuracy: 0.9173
Epoch 1354/2000
inary accuracy: 0.9153
Epoch 1355/2000
inary accuracy: 0.9167
Epoch 1356/2000
1500/1500 [==============] - 0s - loss: 0.0726 - b
inary accuracy: 0.9167
Epoch 1357/2000
inary accuracy: 0.9160
Epoch 1358/2000
inary_accuracy: 0.9160
```

```
Epoch 1359/2000
1500/1500 [=============== ] - 0s - loss: 0.0726 - b
inary_accuracy: 0.9153
Epoch 1360/2000
inary accuracy: 0.9160
Epoch 1361/2000
inary_accuracy: 0.9160
Epoch 1362/2000
inary_accuracy: 0.9173
Epoch 1363/2000
inary accuracy: 0.9160
Epoch 1364/2000
1500/1500 [==============] - 0s - loss: 0.0726 - b
inary accuracy: 0.9153
Epoch 1365/2000
inary_accuracy: 0.9160
Epoch 1366/2000
1500/1500 [============== ] - 0s - loss: 0.0726 - b
inary accuracy: 0.9160
Epoch 1367/2000
inary accuracy: 0.9147
Epoch 1368/2000
inary accuracy: 0.9167
Epoch 1369/2000
1500/1500 [==============] - 0s - loss: 0.0725 - b
inary accuracy: 0.9173
Epoch 1370/2000
inary accuracy: 0.9167
Epoch 1371/2000
1500/1500 [=============== ] - 0s - loss: 0.0726 - b
inary accuracy: 0.9153
Epoch 1372/2000
1500/1500 [============== ] - 0s - loss: 0.0725 - b
inary accuracy: 0.9160
Epoch 1373/2000
inary accuracy: 0.9160
Epoch 1374/2000
inary accuracy: 0.9160
Epoch 1375/2000
1500/1500 [==============] - 0s - loss: 0.0726 - b
inary accuracy: 0.9160
Epoch 1376/2000
inary accuracy: 0.9147
Epoch 1377/2000
inary_accuracy: 0.9173
```

```
Epoch 1378/2000
1500/1500 [=============== ] - 0s - loss: 0.0725 - b
inary_accuracy: 0.9167
Epoch 1379/2000
inary accuracy: 0.9160
Epoch 1380/2000
inary_accuracy: 0.9167
Epoch 1381/2000
inary_accuracy: 0.9167
Epoch 1382/2000
inary accuracy: 0.9160
Epoch 1383/2000
1500/1500 [==============] - 0s - loss: 0.0725 - b
inary accuracy: 0.9167
Epoch 1384/2000
inary accuracy: 0.9147
Epoch 1385/2000
1500/1500 [==============] - 0s - loss: 0.0725 - b
inary accuracy: 0.9153
Epoch 1386/2000
inary accuracy: 0.9167
Epoch 1387/2000
inary accuracy: 0.9160
Epoch 1388/2000
1500/1500 [=============== ] - 0s - loss: 0.0725 - b
inary accuracy: 0.9167
Epoch 1389/2000
inary accuracy: 0.9180
Epoch 1390/2000
inary accuracy: 0.9173
Epoch 1391/2000
inary accuracy: 0.9153
Epoch 1392/2000
inary accuracy: 0.9147
Epoch 1393/2000
inary accuracy: 0.9167
Epoch 1394/2000
1500/1500 [==============] - 0s - loss: 0.0724 - b
inary accuracy: 0.9167
Epoch 1395/2000
inary accuracy: 0.9160
Epoch 1396/2000
inary_accuracy: 0.9180
```

```
Epoch 1397/2000
1500/1500 [============== ] - 0s - loss: 0.0723 - b
inary_accuracy: 0.9173
Epoch 1398/2000
inary accuracy: 0.9153
Epoch 1399/2000
inary accuracy: 0.9160
Epoch 1400/2000
inary_accuracy: 0.9187
Epoch 1401/2000
inary accuracy: 0.9173
Epoch 1402/2000
1500/1500 [==============] - 0s - loss: 0.0724 - b
inary accuracy: 0.9160
Epoch 1403/2000
inary accuracy: 0.9160
Epoch 1404/2000
1500/1500 [=============== ] - 0s - loss: 0.0724 - b
inary accuracy: 0.9153
Epoch 1405/2000
inary accuracy: 0.9167
Epoch 1406/2000
inary accuracy: 0.9147
Epoch 1407/2000
inary accuracy: 0.9167
Epoch 1408/2000
inary accuracy: 0.9173
Epoch 1409/2000
inary accuracy: 0.9153
Epoch 1410/2000
inary accuracy: 0.9153
Epoch 1411/2000
inary accuracy: 0.9173
Epoch 1412/2000
1500/1500 [=============== ] - 0s - loss: 0.0723 - b
inary accuracy: 0.9167
Epoch 1413/2000
1500/1500 [==============] - 0s - loss: 0.0723 - b
inary accuracy: 0.9173
Epoch 1414/2000
inary accuracy: 0.9160
Epoch 1415/2000
inary_accuracy: 0.9180
```

```
Epoch 1416/2000
1500/1500 [=============== ] - 0s - loss: 0.0724 - b
inary_accuracy: 0.9147
Epoch 1417/2000
inary accuracy: 0.9180
Epoch 1418/2000
inary accuracy: 0.9180
Epoch 1419/2000
inary_accuracy: 0.9140
Epoch 1420/2000
inary accuracy: 0.9153
Epoch 1421/2000
1500/1500 [==============] - 0s - loss: 0.0723 - b
inary accuracy: 0.9167
Epoch 1422/2000
inary accuracy: 0.9173
Epoch 1423/2000
1500/1500 [============== ] - 0s - loss: 0.0723 - b
inary accuracy: 0.9160
Epoch 1424/2000
inary accuracy: 0.9167
Epoch 1425/2000
inary accuracy: 0.9173
Epoch 1426/2000
inary accuracy: 0.9173
Epoch 1427/2000
inary accuracy: 0.9160
Epoch 1428/2000
inary accuracy: 0.9160
Epoch 1429/2000
inary accuracy: 0.9167
Epoch 1430/2000
inary accuracy: 0.9173
Epoch 1431/2000
1500/1500 [=============== ] - 0s - loss: 0.0722 - b
inary accuracy: 0.9160
Epoch 1432/2000
1500/1500 [==============] - 0s - loss: 0.0722 - b
inary accuracy: 0.9160
Epoch 1433/2000
inary accuracy: 0.9167
Epoch 1434/2000
inary_accuracy: 0.9173
```

```
Epoch 1435/2000
inary_accuracy: 0.9167
Epoch 1436/2000
inary accuracy: 0.9180
Epoch 1437/2000
inary_accuracy: 0.9167
Epoch 1438/2000
inary_accuracy: 0.9173
Epoch 1439/2000
inary accuracy: 0.9167
Epoch 1440/2000
1500/1500 [==============] - 0s - loss: 0.0722 - b
inary accuracy: 0.9160
Epoch 1441/2000
inary accuracy: 0.9167
Epoch 1442/2000
1500/1500 [==============] - 0s - loss: 0.0722 - b
inary accuracy: 0.9173
Epoch 1443/2000
inary accuracy: 0.9173
Epoch 1444/2000
inary accuracy: 0.9153
Epoch 1445/2000
inary accuracy: 0.9173
Epoch 1446/2000
inary accuracy: 0.9160
Epoch 1447/2000
1500/1500 [=============== ] - 0s - loss: 0.0722 - b
inary accuracy: 0.9167
Epoch 1448/2000
inary accuracy: 0.9193
Epoch 1449/2000
inary accuracy: 0.9173
Epoch 1450/2000
inary accuracy: 0.9173
Epoch 1451/2000
1500/1500 [==============] - 0s - loss: 0.0721 - b
inary accuracy: 0.9173
Epoch 1452/2000
inary accuracy: 0.9180
Epoch 1453/2000
inary_accuracy: 0.9173
```

```
Epoch 1454/2000
1500/1500 [============== ] - 0s - loss: 0.0723 - b
inary_accuracy: 0.9160
Epoch 1455/2000
inary accuracy: 0.9167
Epoch 1456/2000
inary_accuracy: 0.9187
Epoch 1457/2000
inary_accuracy: 0.9187
Epoch 1458/2000
inary accuracy: 0.9180
Epoch 1459/2000
1500/1500 [==============] - 0s - loss: 0.0722 - b
inary accuracy: 0.9147
Epoch 1460/2000
inary accuracy: 0.9153
Epoch 1461/2000
1500/1500 [=============== ] - 0s - loss: 0.0721 - b
inary accuracy: 0.9160
Epoch 1462/2000
inary accuracy: 0.9180
Epoch 1463/2000
inary accuracy: 0.9173
Epoch 1464/2000
inary accuracy: 0.9180
Epoch 1465/2000
inary accuracy: 0.9187
Epoch 1466/2000
inary accuracy: 0.9167
Epoch 1467/2000
inary accuracy: 0.9147
Epoch 1468/2000
inary accuracy: 0.9173
Epoch 1469/2000
1500/1500 [=============== ] - 0s - loss: 0.0720 - b
inary accuracy: 0.9187
Epoch 1470/2000
1500/1500 [==============] - 0s - loss: 0.0721 - b
inary accuracy: 0.9173
Epoch 1471/2000
inary accuracy: 0.9167
Epoch 1472/2000
inary_accuracy: 0.9193
```

```
Epoch 1473/2000
1500/1500 [=============== ] - 0s - loss: 0.0720 - b
inary_accuracy: 0.9167
Epoch 1474/2000
inary accuracy: 0.9153
Epoch 1475/2000
inary_accuracy: 0.9193
Epoch 1476/2000
inary_accuracy: 0.9180
Epoch 1477/2000
inary accuracy: 0.9160
Epoch 1478/2000
1500/1500 [==============] - 0s - loss: 0.0719 - b
inary accuracy: 0.9173
Epoch 1479/2000
inary accuracy: 0.9160
Epoch 1480/2000
inary accuracy: 0.9173
Epoch 1481/2000
inary accuracy: 0.9167
Epoch 1482/2000
inary accuracy: 0.9180
Epoch 1483/2000
inary accuracy: 0.9173
Epoch 1484/2000
inary accuracy: 0.9173
Epoch 1485/2000
inary accuracy: 0.9180
Epoch 1486/2000
inary accuracy: 0.9167
Epoch 1487/2000
inary accuracy: 0.9180
Epoch 1488/2000
inary accuracy: 0.9167
Epoch 1489/2000
1500/1500 [==============] - 0s - loss: 0.0720 - b
inary accuracy: 0.9173
Epoch 1490/2000
inary accuracy: 0.9167
Epoch 1491/2000
inary_accuracy: 0.9173
```

```
Epoch 1492/2000
inary_accuracy: 0.9173
Epoch 1493/2000
inary accuracy: 0.9180
Epoch 1494/2000
inary_accuracy: 0.9173
Epoch 1495/2000
inary_accuracy: 0.9173
Epoch 1496/2000
inary accuracy: 0.9180
Epoch 1497/2000
4 - binary_accuracy: 0.916 - 0s - loss: 0.0719 - binary_accuracy:
0.9153
Epoch 1498/2000
inary accuracy: 0.9180
Epoch 1499/2000
1500/1500 [============== ] - 0s - loss: 0.0718 - b
inary_accuracy: 0.9167
Epoch 1500/2000
1500/1500 [=============== ] - 0s - loss: 0.0719 - b
inary_accuracy: 0.9180
Epoch 1501/2000
inary accuracy: 0.9180
Epoch 1502/2000
1500/1500 [============== ] - 0s - loss: 0.0718 - b
inary accuracy: 0.9167
Epoch 1503/2000
inary accuracy: 0.9173
Epoch 1504/2000
inary accuracy: 0.9180
Epoch 1505/2000
inary accuracy: 0.9180
Epoch 1506/2000
inary_accuracy: 0.9187
Epoch 1507/2000
inary accuracy: 0.9173
Epoch 1508/2000
inary_accuracy: 0.9173
Epoch 1509/2000
inary accuracy: 0.9173
Epoch 1510/2000
```

```
inary_accuracy: 0.9173
Epoch 1511/2000
inary_accuracy: 0.9187
Epoch 1512/2000
1500/1500 [==============] - 0s - loss: 0.0718 - b
inary accuracy: 0.9167
Epoch 1513/2000
1500/1500 [==============] - 0s - loss: 0.0718 - b
inary accuracy: 0.9173
Epoch 1514/2000
inary accuracy: 0.9173
Epoch 1515/2000
inary_accuracy: 0.9167
Epoch 1516/2000
inary accuracy: 0.9180
Epoch 1517/2000
inary accuracy: 0.9173
Epoch 1518/2000
1500/1500 [============== ] - 0s - loss: 0.0717 - b
inary_accuracy: 0.9193
Epoch 1519/2000
1500/1500 [=============== ] - 0s - loss: 0.0718 - b
inary_accuracy: 0.9187
Epoch 1520/2000
inary accuracy: 0.9167
Epoch 1521/2000
inary accuracy: 0.9193
Epoch 1522/2000
inary accuracy: 0.9173
Epoch 1523/2000
inary accuracy: 0.9193
Epoch 1524/2000
inary accuracy: 0.9173
Epoch 1525/2000
inary_accuracy: 0.9173
Epoch 1526/2000
inary accuracy: 0.9180
Epoch 1527/2000
inary_accuracy: 0.9173
Epoch 1528/2000
inary accuracy: 0.9193
Epoch 1529/2000
```

```
inary_accuracy: 0.9187
Epoch 1530/2000
inary_accuracy: 0.9187
Epoch 1531/2000
inary accuracy: 0.9173
Epoch 1532/2000
inary accuracy: 0.9180
Epoch 1533/2000
inary accuracy: 0.9167
Epoch 1534/2000
inary_accuracy: 0.9193
Epoch 1535/2000
1500/1500 [=============== ] - 0s - loss: 0.0718 - b
inary accuracy: 0.9187
Epoch 1536/2000
inary accuracy: 0.9173
Epoch 1537/2000
1500/1500 [============== ] - 0s - loss: 0.0716 - b
inary_accuracy: 0.9180
Epoch 1538/2000
1500/1500 [==============] - 0s - loss: 0.0716 - b
inary_accuracy: 0.9193
Epoch 1539/2000
inary accuracy: 0.9167
Epoch 1540/2000
1500/1500 [============== ] - 0s - loss: 0.0716 - b
inary accuracy: 0.9180
Epoch 1541/2000
inary accuracy: 0.9187
Epoch 1542/2000
inary accuracy: 0.9193
Epoch 1543/2000
inary accuracy: 0.9180
Epoch 1544/2000
inary_accuracy: 0.9173
Epoch 1545/2000
inary accuracy: 0.9180
Epoch 1546/2000
inary_accuracy: 0.9167
Epoch 1547/2000
inary accuracy: 0.9180
Epoch 1548/2000
```

```
inary_accuracy: 0.9173
Epoch 1549/2000
1500/1500 [=============== ] - 0s - loss: 0.0715 - b
inary_accuracy: 0.9167
Epoch 1550/2000
inary accuracy: 0.9187
Epoch 1551/2000
inary accuracy: 0.9180
Epoch 1552/2000
inary accuracy: 0.9193
Epoch 1553/2000
inary_accuracy: 0.9167
Epoch 1554/2000
inary accuracy: 0.9173
Epoch 1555/2000
inary accuracy: 0.9180
Epoch 1556/2000
1500/1500 [============== ] - 0s - loss: 0.0715 - b
inary_accuracy: 0.9167
Epoch 1557/2000
1500/1500 [==============] - 0s - loss: 0.0716 - b
inary_accuracy: 0.9173
Epoch 1558/2000
inary accuracy: 0.9187
Epoch 1559/2000
1500/1500 [============== ] - 0s - loss: 0.0716 - b
inary accuracy: 0.9173
Epoch 1560/2000
inary accuracy: 0.9180
Epoch 1561/2000
inary accuracy: 0.9187
Epoch 1562/2000
1500/1500 [=============== ] - 0s - loss: 0.0716 - b
inary accuracy: 0.9180
Epoch 1563/2000
inary_accuracy: 0.9167
Epoch 1564/2000
inary accuracy: 0.9193
Epoch 1565/2000
inary_accuracy: 0.9167
Epoch 1566/2000
inary accuracy: 0.9167
Epoch 1567/2000
```

```
inary accuracy: 0.9180
Epoch 1568/2000
1500/1500 [=============== ] - 0s - loss: 0.0715 - b
inary_accuracy: 0.9173
Epoch 1569/2000
inary accuracy: 0.9180
Epoch 1570/2000
inary accuracy: 0.9187
Epoch 1571/2000
inary accuracy: 0.9187
Epoch 1572/2000
inary_accuracy: 0.9187
Epoch 1573/2000
inary accuracy: 0.9180
Epoch 1574/2000
inary accuracy: 0.9180
Epoch 1575/2000
1500/1500 [============== ] - 0s - loss: 0.0716 - b
inary_accuracy: 0.9193
Epoch 1576/2000
inary_accuracy: 0.9187
Epoch 1577/2000
inary accuracy: 0.9187
Epoch 1578/2000
1500/1500 [============== ] - 0s - loss: 0.0714 - b
inary accuracy: 0.9173
Epoch 1579/2000
inary accuracy: 0.9180
Epoch 1580/2000
inary accuracy: 0.9187
Epoch 1581/2000
inary accuracy: 0.9187
Epoch 1582/2000
inary_accuracy: 0.9180
Epoch 1583/2000
inary accuracy: 0.9173
Epoch 1584/2000
inary_accuracy: 0.9180
Epoch 1585/2000
inary accuracy: 0.9180
Epoch 1586/2000
```

```
inary_accuracy: 0.9187
Epoch 1587/2000
inary_accuracy: 0.9173
Epoch 1588/2000
inary accuracy: 0.9187
Epoch 1589/2000
1500/1500 [=============== ] - 0s - loss: 0.0713 - b
inary accuracy: 0.9187
Epoch 1590/2000
inary accuracy: 0.9180
Epoch 1591/2000
inary_accuracy: 0.9193
Epoch 1592/2000
inary accuracy: 0.9187
Epoch 1593/2000
inary accuracy: 0.9180
Epoch 1594/2000
1500/1500 [============== ] - 0s - loss: 0.0714 - b
inary_accuracy: 0.9187
Epoch 1595/2000
1500/1500 [==============] - 0s - loss: 0.0713 - b
inary_accuracy: 0.9187
Epoch 1596/2000
inary accuracy: 0.9187
Epoch 1597/2000
1500/1500 [============== ] - 0s - loss: 0.0713 - b
inary accuracy: 0.9193
Epoch 1598/2000
inary accuracy: 0.9187
Epoch 1599/2000
inary accuracy: 0.9187
Epoch 1600/2000
inary accuracy: 0.9180
Epoch 1601/2000
inary_accuracy: 0.9193
Epoch 1602/2000
inary accuracy: 0.9180
Epoch 1603/2000
inary_accuracy: 0.9180
Epoch 1604/2000
inary accuracy: 0.9180
Epoch 1605/2000
```

```
inary accuracy: 0.9180
Epoch 1606/2000
inary_accuracy: 0.9187
Epoch 1607/2000
1500/1500 [=============== ] - 0s - loss: 0.0713 - b
inary accuracy: 0.9180
Epoch 1608/2000
inary_accuracy: 0.9193
Epoch 1609/2000
inary accuracy: 0.9193
Epoch 1610/2000
inary_accuracy: 0.9187
Epoch 1611/2000
inary accuracy: 0.9187
Epoch 1612/2000
inary accuracy: 0.9200
Epoch 1613/2000
1500/1500 [============== ] - 0s - loss: 0.0712 - b
inary_accuracy: 0.9187
Epoch 1614/2000
1500/1500 [=============== ] - 0s - loss: 0.0711 - b
inary_accuracy: 0.9187
Epoch 1615/2000
inary accuracy: 0.9193
Epoch 1616/2000
1500/1500 [============== ] - 0s - loss: 0.0712 - b
inary accuracy: 0.9187
Epoch 1617/2000
inary accuracy: 0.9173
Epoch 1618/2000
inary accuracy: 0.9180
Epoch 1619/2000
inary accuracy: 0.9187
Epoch 1620/2000
inary_accuracy: 0.9193
Epoch 1621/2000
inary accuracy: 0.9187
Epoch 1622/2000
inary_accuracy: 0.9180
Epoch 1623/2000
inary accuracy: 0.9187
Epoch 1624/2000
```

```
inary_accuracy: 0.9187
Epoch 1625/2000
inary_accuracy: 0.9180
Epoch 1626/2000
inary accuracy: 0.9173
Epoch 1627/2000
inary accuracy: 0.9180
Epoch 1628/2000
inary accuracy: 0.9180
Epoch 1629/2000
inary_accuracy: 0.9180
Epoch 1630/2000
inary accuracy: 0.9180
Epoch 1631/2000
inary accuracy: 0.9187
Epoch 1632/2000
1500/1500 [============== ] - 0s - loss: 0.0710 - b
inary_accuracy: 0.9180
Epoch 1633/2000
1500/1500 [=============== ] - 0s - loss: 0.0711 - b
inary_accuracy: 0.9173
Epoch 1634/2000
inary accuracy: 0.9180
Epoch 1635/2000
1500/1500 [=============== ] - 0s - loss: 0.0711 - b
inary accuracy: 0.9187
Epoch 1636/2000
inary accuracy: 0.9187
Epoch 1637/2000
inary accuracy: 0.9193
Epoch 1638/2000
inary accuracy: 0.9187
Epoch 1639/2000
inary_accuracy: 0.9187
Epoch 1640/2000
inary accuracy: 0.9180
Epoch 1641/2000
inary_accuracy: 0.9187
Epoch 1642/2000
inary accuracy: 0.9180
Epoch 1643/2000
```

```
inary_accuracy: 0.9187
Epoch 1644/2000
inary_accuracy: 0.9180
Epoch 1645/2000
inary accuracy: 0.9180
Epoch 1646/2000
inary accuracy: 0.9180
Epoch 1647/2000
inary accuracy: 0.9173
Epoch 1648/2000
inary_accuracy: 0.9180
Epoch 1649/2000
inary accuracy: 0.9180
Epoch 1650/2000
inary accuracy: 0.9173
Epoch 1651/2000
1500/1500 [============== ] - 0s - loss: 0.0709 - b
inary_accuracy: 0.9173
Epoch 1652/2000
1500/1500 [=============== ] - 0s - loss: 0.0709 - b
inary_accuracy: 0.9187
Epoch 1653/2000
inary accuracy: 0.9180
Epoch 1654/2000
inary accuracy: 0.9187
Epoch 1655/2000
inary accuracy: 0.9187
Epoch 1656/2000
inary accuracy: 0.9187
Epoch 1657/2000
inary accuracy: 0.9173
Epoch 1658/2000
inary_accuracy: 0.9180
Epoch 1659/2000
inary accuracy: 0.9173
Epoch 1660/2000
inary_accuracy: 0.9193
Epoch 1661/2000
inary accuracy: 0.9180
Epoch 1662/2000
```

```
inary accuracy: 0.9180
Epoch 1663/2000
inary_accuracy: 0.9180
Epoch 1664/2000
inary accuracy: 0.9180
Epoch 1665/2000
inary accuracy: 0.9180
Epoch 1666/2000
inary accuracy: 0.9180
Epoch 1667/2000
inary_accuracy: 0.9180
Epoch 1668/2000
inary accuracy: 0.9180
Epoch 1669/2000
inary accuracy: 0.9187
Epoch 1670/2000
1500/1500 [=============== ] - 0s - loss: 0.0708 - b
inary_accuracy: 0.9193
Epoch 1671/2000
1500/1500 [=============== ] - 0s - loss: 0.0709 - b
inary_accuracy: 0.9173
Epoch 1672/2000
inary accuracy: 0.9187
Epoch 1673/2000
inary accuracy: 0.9180
Epoch 1674/2000
inary accuracy: 0.9187
Epoch 1675/2000
inary accuracy: 0.9173
Epoch 1676/2000
1500/1500 [=============== ] - 0s - loss: 0.0709 - b
inary accuracy: 0.9187
Epoch 1677/2000
inary_accuracy: 0.9180
Epoch 1678/2000
inary accuracy: 0.9187
Epoch 1679/2000
inary_accuracy: 0.9180
Epoch 1680/2000
inary accuracy: 0.9173
Epoch 1681/2000
```

```
inary_accuracy: 0.9187
Epoch 1682/2000
inary_accuracy: 0.9187
Epoch 1683/2000
inary accuracy: 0.9167
Epoch 1684/2000
inary accuracy: 0.9160
Epoch 1685/2000
inary accuracy: 0.9167
Epoch 1686/2000
inary_accuracy: 0.9180
Epoch 1687/2000
inary accuracy: 0.9180
Epoch 1688/2000
inary accuracy: 0.9173
Epoch 1689/2000
1500/1500 [=============== ] - 0s - loss: 0.0708 - b
inary_accuracy: 0.9187
Epoch 1690/2000
1500/1500 [=============== ] - 0s - loss: 0.0708 - b
inary_accuracy: 0.9173
Epoch 1691/2000
inary accuracy: 0.9193
Epoch 1692/2000
inary accuracy: 0.9180
Epoch 1693/2000
inary accuracy: 0.9180
Epoch 1694/2000
inary accuracy: 0.9167
Epoch 1695/2000
inary accuracy: 0.9167
Epoch 1696/2000
inary_accuracy: 0.9187
Epoch 1697/2000
inary accuracy: 0.9180
Epoch 1698/2000
inary_accuracy: 0.9180
Epoch 1699/2000
inary accuracy: 0.9180
Epoch 1700/2000
```

```
inary_accuracy: 0.9187
Epoch 1701/2000
inary_accuracy: 0.9187
Epoch 1702/2000
inary accuracy: 0.9180
Epoch 1703/2000
inary accuracy: 0.9173
Epoch 1704/2000
inary accuracy: 0.9167
Epoch 1705/2000
inary_accuracy: 0.9167
Epoch 1706/2000
inary accuracy: 0.9167
Epoch 1707/2000
inary accuracy: 0.9173
Epoch 1708/2000
1500/1500 [============== ] - 0s - loss: 0.0707 - b
inary_accuracy: 0.9180
Epoch 1709/2000
inary_accuracy: 0.9167
Epoch 1710/2000
inary accuracy: 0.9173
Epoch 1711/2000
inary accuracy: 0.9173
Epoch 1712/2000
inary accuracy: 0.9167
Epoch 1713/2000
inary accuracy: 0.9173
Epoch 1714/2000
1500/1500 [=============== ] - 0s - loss: 0.0706 - b
inary accuracy: 0.9180
Epoch 1715/2000
inary accuracy: 0.9173
Epoch 1716/2000
inary accuracy: 0.9180
Epoch 1717/2000
inary_accuracy: 0.9173
Epoch 1718/2000
inary accuracy: 0.9167
Epoch 1719/2000
```

```
inary_accuracy: 0.9187
Epoch 1720/2000
inary_accuracy: 0.9173
Epoch 1721/2000
inary accuracy: 0.9180
Epoch 1722/2000
1500/1500 [==============] - 0s - loss: 0.0706 - b
inary accuracy: 0.9173
Epoch 1723/2000
inary accuracy: 0.9187
Epoch 1724/2000
inary_accuracy: 0.9180
Epoch 1725/2000
1500/1500 [=============== ] - 0s - loss: 0.0705 - b
inary accuracy: 0.9187
Epoch 1726/2000
inary accuracy: 0.9193
Epoch 1727/2000
1500/1500 [=============== ] - 0s - loss: 0.0708 - b
inary_accuracy: 0.9167
Epoch 1728/2000
1500/1500 [==============] - 0s - loss: 0.0706 - b
inary_accuracy: 0.9173
Epoch 1729/2000
inary accuracy: 0.9173
Epoch 1730/2000
inary accuracy: 0.9180
Epoch 1731/2000
inary accuracy: 0.9187
Epoch 1732/2000
inary accuracy: 0.9180
Epoch 1733/2000
inary accuracy: 0.9173
Epoch 1734/2000
inary accuracy: 0.9180
Epoch 1735/2000
inary accuracy: 0.9180
Epoch 1736/2000
inary_accuracy: 0.9187
Epoch 1737/2000
inary accuracy: 0.9187
Epoch 1738/2000
```

```
inary accuracy: 0.9173
Epoch 1739/2000
inary_accuracy: 0.9180
Epoch 1740/2000
inary accuracy: 0.9167
Epoch 1741/2000
1500/1500 [==============] - 0s - loss: 0.0706 - b
inary accuracy: 0.9173
Epoch 1742/2000
inary accuracy: 0.9173
Epoch 1743/2000
inary_accuracy: 0.9167
Epoch 1744/2000
inary accuracy: 0.9187
Epoch 1745/2000
inary accuracy: 0.9173
Epoch 1746/2000
1500/1500 [============== ] - 0s - loss: 0.0706 - b
inary_accuracy: 0.9180
Epoch 1747/2000
1500/1500 [==============] - 0s - loss: 0.0705 - b
inary_accuracy: 0.9160
Epoch 1748/2000
inary accuracy: 0.9160
Epoch 1749/2000
inary accuracy: 0.9180
Epoch 1750/2000
inary accuracy: 0.9193
Epoch 1751/2000
inary accuracy: 0.9180
Epoch 1752/2000
1500/1500 [=============== ] - 0s - loss: 0.0706 - b
inary accuracy: 0.9180
Epoch 1753/2000
inary accuracy: 0.9167
Epoch 1754/2000
inary accuracy: 0.9180
Epoch 1755/2000
inary_accuracy: 0.9173
Epoch 1756/2000
inary accuracy: 0.9180
Epoch 1757/2000
```

```
inary_accuracy: 0.9167
Epoch 1758/2000
1500/1500 [=============== ] - 0s - loss: 0.0706 - b
inary_accuracy: 0.9173
Epoch 1759/2000
1500/1500 [==============] - 0s - loss: 0.0706 - b
inary accuracy: 0.9180
Epoch 1760/2000
inary accuracy: 0.9160
Epoch 1761/2000
1500/1500 [=============== ] - 0s - loss: 0.0706 - b
inary accuracy: 0.9180
Epoch 1762/2000
inary_accuracy: 0.9173
Epoch 1763/2000
1500/1500 [=============== ] - 0s - loss: 0.0705 - b
inary accuracy: 0.9173
Epoch 1764/2000
inary accuracy: 0.9173
Epoch 1765/2000
1500/1500 [============== ] - 0s - loss: 0.0705 - b
inary_accuracy: 0.9173
Epoch 1766/2000
1500/1500 [==============] - 0s - loss: 0.0705 - b
inary_accuracy: 0.9180
Epoch 1767/2000
inary accuracy: 0.9173
Epoch 1768/2000
inary accuracy: 0.9187
Epoch 1769/2000
inary accuracy: 0.9187
Epoch 1770/2000
inary accuracy: 0.9180
Epoch 1771/2000
inary accuracy: 0.9180
Epoch 1772/2000
inary accuracy: 0.9180
Epoch 1773/2000
inary accuracy: 0.9180
Epoch 1774/2000
inary_accuracy: 0.9180
Epoch 1775/2000
inary accuracy: 0.9167
Epoch 1776/2000
```

```
inary_accuracy: 0.9187
Epoch 1777/2000
inary_accuracy: 0.9187
Epoch 1778/2000
inary accuracy: 0.9173
Epoch 1779/2000
inary accuracy: 0.9153
Epoch 1780/2000
inary accuracy: 0.9173
Epoch 1781/2000
inary_accuracy: 0.9173
Epoch 1782/2000
1500/1500 [=============== ] - 0s - loss: 0.0705 - b
inary accuracy: 0.9187
Epoch 1783/2000
inary accuracy: 0.9180
Epoch 1784/2000
1500/1500 [============== ] - 0s - loss: 0.0705 - b
inary_accuracy: 0.9167
Epoch 1785/2000
1500/1500 [==============] - 0s - loss: 0.0704 - b
inary_accuracy: 0.9167
Epoch 1786/2000
inary accuracy: 0.9167
Epoch 1787/2000
inary accuracy: 0.9173
Epoch 1788/2000
inary accuracy: 0.9173
Epoch 1789/2000
inary accuracy: 0.9180
Epoch 1790/2000
1500/1500 [=============== ] - 0s - loss: 0.0703 - b
inary accuracy: 0.9180
Epoch 1791/2000
inary accuracy: 0.9167
Epoch 1792/2000
inary accuracy: 0.9180
Epoch 1793/2000
inary_accuracy: 0.9187
Epoch 1794/2000
inary accuracy: 0.9173
Epoch 1795/2000
```

```
inary accuracy: 0.9167
Epoch 1796/2000
inary_accuracy: 0.9173
Epoch 1797/2000
inary accuracy: 0.9173
Epoch 1798/2000
inary accuracy: 0.9180
Epoch 1799/2000
inary accuracy: 0.9167
Epoch 1800/2000
inary_accuracy: 0.9173
Epoch 1801/2000
1500/1500 [=============== ] - 0s - loss: 0.0704 - b
inary accuracy: 0.9180
Epoch 1802/2000
inary accuracy: 0.9173
Epoch 1803/2000
1500/1500 [==============] - 0s - loss: 0.0704 - b
inary_accuracy: 0.9173
Epoch 1804/2000
1500/1500 [============== ] - 0s - loss: 0.0703 - b
inary_accuracy: 0.9173
Epoch 1805/2000
inary accuracy: 0.9180
Epoch 1806/2000
inary accuracy: 0.9180
Epoch 1807/2000
inary accuracy: 0.9187
Epoch 1808/2000
inary accuracy: 0.9180
Epoch 1809/2000
inary accuracy: 0.9167
Epoch 1810/2000
inary accuracy: 0.9180
Epoch 1811/2000
inary accuracy: 0.9167
Epoch 1812/2000
inary_accuracy: 0.9160
Epoch 1813/2000
inary accuracy: 0.9180
Epoch 1814/2000
```

```
inary_accuracy: 0.9167
Epoch 1815/2000
inary_accuracy: 0.9180
Epoch 1816/2000
inary accuracy: 0.9173
Epoch 1817/2000
inary accuracy: 0.9160
Epoch 1818/2000
inary accuracy: 0.9167
Epoch 1819/2000
inary_accuracy: 0.9180
Epoch 1820/2000
1500/1500 [=============== ] - 0s - loss: 0.0703 - b
inary accuracy: 0.9173
Epoch 1821/2000
inary accuracy: 0.9167
Epoch 1822/2000
1500/1500 [============== ] - 0s - loss: 0.0703 - b
inary_accuracy: 0.9167
Epoch 1823/2000
1500/1500 [==============] - 0s - loss: 0.0704 - b
inary_accuracy: 0.9180
Epoch 1824/2000
inary accuracy: 0.9167
Epoch 1825/2000
inary accuracy: 0.9173
Epoch 1826/2000
inary accuracy: 0.9180
Epoch 1827/2000
inary accuracy: 0.9160
Epoch 1828/2000
1500/1500 [=============== ] - 0s - loss: 0.0703 - b
inary accuracy: 0.9173
Epoch 1829/2000
inary_accuracy: 0.9180
Epoch 1830/2000
inary accuracy: 0.9167
Epoch 1831/2000
inary_accuracy: 0.9153
Epoch 1832/2000
inary accuracy: 0.9180
Epoch 1833/2000
```

```
inary accuracy: 0.9180
Epoch 1834/2000
inary_accuracy: 0.9180
Epoch 1835/2000
inary accuracy: 0.9187
Epoch 1836/2000
inary accuracy: 0.9167
Epoch 1837/2000
inary accuracy: 0.9160
Epoch 1838/2000
inary_accuracy: 0.9173
Epoch 1839/2000
1500/1500 [=============== ] - 0s - loss: 0.0703 - b
inary accuracy: 0.9167
Epoch 1840/2000
inary accuracy: 0.9187
Epoch 1841/2000
1500/1500 [============== ] - 0s - loss: 0.0703 - b
inary_accuracy: 0.9173
Epoch 1842/2000
1500/1500 [==============] - 0s - loss: 0.0703 - b
inary_accuracy: 0.9167
Epoch 1843/2000
inary accuracy: 0.9173
Epoch 1844/2000
inary accuracy: 0.9167
Epoch 1845/2000
inary accuracy: 0.9180
Epoch 1846/2000
inary accuracy: 0.9167
Epoch 1847/2000
1500/1500 [=============== ] - 0s - loss: 0.0703 - b
inary accuracy: 0.9173
Epoch 1848/2000
inary_accuracy: 0.9173
Epoch 1849/2000
inary accuracy: 0.9173
Epoch 1850/2000
inary_accuracy: 0.9173
Epoch 1851/2000
inary accuracy: 0.9180
Epoch 1852/2000
```

```
inary_accuracy: 0.9173
Epoch 1853/2000
inary_accuracy: 0.9180
Epoch 1854/2000
inary accuracy: 0.9153
Epoch 1855/2000
1500/1500 [==============] - 0s - loss: 0.0702 - b
inary accuracy: 0.9167
Epoch 1856/2000
inary accuracy: 0.9160
Epoch 1857/2000
inary_accuracy: 0.9173
Epoch 1858/2000
inary accuracy: 0.9167
Epoch 1859/2000
inary accuracy: 0.9180
Epoch 1860/2000
1500/1500 [============== ] - 0s - loss: 0.0702 - b
inary_accuracy: 0.9167
Epoch 1861/2000
1500/1500 [==============] - 0s - loss: 0.0703 - b
inary_accuracy: 0.9173
Epoch 1862/2000
inary accuracy: 0.9167
Epoch 1863/2000
inary accuracy: 0.9173
Epoch 1864/2000
inary accuracy: 0.9180
Epoch 1865/2000
inary accuracy: 0.9173
Epoch 1866/2000
1500/1500 [=============== ] - 0s - loss: 0.0702 - b
inary accuracy: 0.9173
Epoch 1867/2000
inary_accuracy: 0.9180
Epoch 1868/2000
inary accuracy: 0.9180
Epoch 1869/2000
inary_accuracy: 0.9173
Epoch 1870/2000
inary accuracy: 0.9160
Epoch 1871/2000
```

```
inary_accuracy: 0.9173
Epoch 1872/2000
inary_accuracy: 0.9167
Epoch 1873/2000
1500/1500 [==============] - 0s - loss: 0.0702 - b
inary accuracy: 0.9180
Epoch 1874/2000
1500/1500 [==============] - 0s - loss: 0.0702 - b
inary accuracy: 0.9167
Epoch 1875/2000
inary accuracy: 0.9180
Epoch 1876/2000
inary_accuracy: 0.9153
Epoch 1877/2000
1500/1500 [=============== ] - 0s - loss: 0.0703 - b
inary accuracy: 0.9173
Epoch 1878/2000
inary accuracy: 0.9167
Epoch 1879/2000
1500/1500 [============== ] - 0s - loss: 0.0702 - b
inary_accuracy: 0.9173
Epoch 1880/2000
1500/1500 [==============] - 0s - loss: 0.0702 - b
inary_accuracy: 0.9180
Epoch 1881/2000
inary accuracy: 0.9167
Epoch 1882/2000
inary accuracy: 0.9167
Epoch 1883/2000
inary accuracy: 0.9180
Epoch 1884/2000
inary accuracy: 0.9173
Epoch 1885/2000
1500/1500 [=============== ] - 0s - loss: 0.0701 - b
inary accuracy: 0.9173
Epoch 1886/2000
inary_accuracy: 0.9167
Epoch 1887/2000
inary accuracy: 0.9180
Epoch 1888/2000
inary_accuracy: 0.9167
Epoch 1889/2000
inary accuracy: 0.9167
Epoch 1890/2000
```

```
inary accuracy: 0.9160
Epoch 1891/2000
inary_accuracy: 0.9173
Epoch 1892/2000
1500/1500 [==============] - 0s - loss: 0.0702 - b
inary accuracy: 0.9167
Epoch 1893/2000
1500/1500 [==============] - 0s - loss: 0.0702 - b
inary accuracy: 0.9173
Epoch 1894/2000
inary accuracy: 0.9173
Epoch 1895/2000
inary_accuracy: 0.9167
Epoch 1896/2000
inary accuracy: 0.9173
Epoch 1897/2000
inary accuracy: 0.9180
Epoch 1898/2000
1500/1500 [============== ] - 0s - loss: 0.0702 - b
inary_accuracy: 0.9167
Epoch 1899/2000
1500/1500 [==============] - 0s - loss: 0.0702 - b
inary_accuracy: 0.9160
Epoch 1900/2000
inary accuracy: 0.9173
Epoch 1901/2000
inary accuracy: 0.9167
Epoch 1902/2000
inary accuracy: 0.9173
Epoch 1903/2000
inary accuracy: 0.9167
Epoch 1904/2000
1500/1500 [=============== ] - 0s - loss: 0.0702 - b
inary accuracy: 0.9180
Epoch 1905/2000
inary accuracy: 0.9187
Epoch 1906/2000
inary accuracy: 0.9153
Epoch 1907/2000
inary_accuracy: 0.9173
Epoch 1908/2000
inary accuracy: 0.9140
Epoch 1909/2000
```

```
inary accuracy: 0.9160
Epoch 1910/2000
inary_accuracy: 0.9173
Epoch 1911/2000
inary accuracy: 0.9167
Epoch 1912/2000
inary accuracy: 0.9167
Epoch 1913/2000
inary accuracy: 0.9167
Epoch 1914/2000
inary_accuracy: 0.9173
Epoch 1915/2000
inary accuracy: 0.9180
Epoch 1916/2000
inary accuracy: 0.9160
Epoch 1917/2000
1500/1500 [============== ] - 0s - loss: 0.0701 - b
inary_accuracy: 0.9180
Epoch 1918/2000
1500/1500 [==============] - 0s - loss: 0.0701 - b
inary_accuracy: 0.9160
Epoch 1919/2000
inary accuracy: 0.9187
Epoch 1920/2000
inary accuracy: 0.9167
Epoch 1921/2000
inary accuracy: 0.9173
Epoch 1922/2000
inary accuracy: 0.9160
Epoch 1923/2000
1500/1500 [=============== ] - 0s - loss: 0.0701 - b
inary accuracy: 0.9173
Epoch 1924/2000
inary_accuracy: 0.9167
Epoch 1925/2000
inary accuracy: 0.9187
Epoch 1926/2000
inary_accuracy: 0.9173
Epoch 1927/2000
inary accuracy: 0.9173
Epoch 1928/2000
```

```
inary accuracy: 0.9160
Epoch 1929/2000
inary_accuracy: 0.9173
Epoch 1930/2000
1500/1500 [==============] - 0s - loss: 0.0702 - b
inary accuracy: 0.9167
Epoch 1931/2000
inary accuracy: 0.9173
Epoch 1932/2000
inary accuracy: 0.9167
Epoch 1933/2000
inary_accuracy: 0.9173
Epoch 1934/2000
inary accuracy: 0.9160
Epoch 1935/2000
inary accuracy: 0.9153
Epoch 1936/2000
1500/1500 [=============== ] - 0s - loss: 0.0700 - b
inary_accuracy: 0.9160
Epoch 1937/2000
1500/1500 [==============] - 0s - loss: 0.0702 - b
inary_accuracy: 0.9153
Epoch 1938/2000
inary accuracy: 0.9160
Epoch 1939/2000
inary accuracy: 0.9173
Epoch 1940/2000
inary accuracy: 0.9180
Epoch 1941/2000
inary accuracy: 0.9147
Epoch 1942/2000
inary accuracy: 0.9167
Epoch 1943/2000
inary_accuracy: 0.9160
Epoch 1944/2000
inary accuracy: 0.9160
Epoch 1945/2000
inary_accuracy: 0.9153
Epoch 1946/2000
inary accuracy: 0.9160
Epoch 1947/2000
```

```
inary_accuracy: 0.9167
Epoch 1948/2000
inary_accuracy: 0.9153
Epoch 1949/2000
inary accuracy: 0.9173
Epoch 1950/2000
1500/1500 [==============] - 0s - loss: 0.0700 - b
inary accuracy: 0.9167
Epoch 1951/2000
inary accuracy: 0.9160
Epoch 1952/2000
inary_accuracy: 0.9180
Epoch 1953/2000
inary accuracy: 0.9153
Epoch 1954/2000
inary accuracy: 0.9147
Epoch 1955/2000
1500/1500 [============== ] - 0s - loss: 0.0699 - b
inary_accuracy: 0.9173
Epoch 1956/2000
inary_accuracy: 0.9153
Epoch 1957/2000
inary accuracy: 0.9173
Epoch 1958/2000
inary accuracy: 0.9160
Epoch 1959/2000
inary accuracy: 0.9160
Epoch 1960/2000
inary accuracy: 0.9167
Epoch 1961/2000
1500/1500 [=============== ] - 0s - loss: 0.0701 - b
inary accuracy: 0.9153
Epoch 1962/2000
inary_accuracy: 0.9173
Epoch 1963/2000
inary accuracy: 0.9173
Epoch 1964/2000
inary_accuracy: 0.9153
Epoch 1965/2000
inary accuracy: 0.9160
Epoch 1966/2000
```

```
inary_accuracy: 0.9167
Epoch 1967/2000
inary_accuracy: 0.9167
Epoch 1968/2000
inary accuracy: 0.9160
Epoch 1969/2000
inary accuracy: 0.9167
Epoch 1970/2000
inary accuracy: 0.9160
Epoch 1971/2000
inary_accuracy: 0.9167
Epoch 1972/2000
inary accuracy: 0.9160
Epoch 1973/2000
inary accuracy: 0.9160
Epoch 1974/2000
1500/1500 [=============== ] - 0s - loss: 0.0700 - b
inary_accuracy: 0.9147
Epoch 1975/2000
inary_accuracy: 0.9167
Epoch 1976/2000
inary accuracy: 0.9173
Epoch 1977/2000
inary accuracy: 0.9160
Epoch 1978/2000
inary accuracy: 0.9153
Epoch 1979/2000
inary accuracy: 0.9173
Epoch 1980/2000
inary accuracy: 0.9147
Epoch 1981/2000
inary_accuracy: 0.9160
Epoch 1982/2000
inary accuracy: 0.9153
Epoch 1983/2000
inary_accuracy: 0.9167
Epoch 1984/2000
inary accuracy: 0.9153
Epoch 1985/2000
```

```
inary accuracy: 0.9147
Epoch 1986/2000
inary accuracy: 0.9153
Epoch 1987/2000
inary accuracy: 0.9147
Epoch 1988/2000
inary_accuracy: 0.9160
Epoch 1989/2000
inary accuracy: 0.9160
Epoch 1990/2000
inary accuracy: 0.9153
Epoch 1991/2000
1500/1500 [=============== ] - 0s - loss: 0.0700 - b
inary accuracy: 0.9167
Epoch 1992/2000
inary accuracy: 0.9153
Epoch 1993/2000
1500/1500 [============== ] - 0s - loss: 0.0699 - b
inary_accuracy: 0.9147
Epoch 1994/2000
inary accuracy: 0.9160
Epoch 1995/2000
inary accuracy: 0.9160
Epoch 1996/2000
inary accuracy: 0.9153
Epoch 1997/2000
inary accuracy: 0.9160
Epoch 1998/2000
inary accuracy: 0.9147
Epoch 1999/2000
inary accuracy: 0.9153
Epoch 2000/2000
```

inary accuracy: 0.9173

# In [179]:

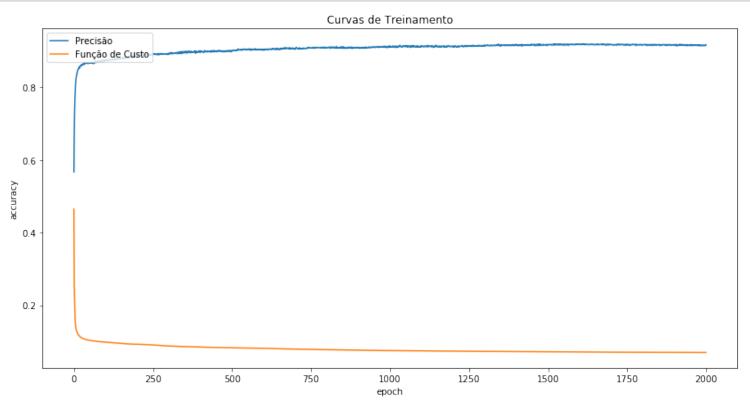
```
# Obtendo as métricas para exibir o Gráfico
metrics = history.history
metrics.keys()
```

## Out[179]:

dict\_keys(['loss', 'binary\_accuracy'])

### In [180]:

```
plt.figure(figsize=(14,7))
plt.plot(metrics['binary_accuracy'])
plt.plot(metrics['loss'])
plt.title('Curvas de Treinamento')
plt.ylabel('accuracy')
plt.xlabel('epoch')
plt.legend(['Precisão', 'Função de Custo'], loc='upper left')
plt.show();
```



# Modelo de Classificação TESTE

```
In [181]:
```

```
dataTest = pd.read_csv("am-T3-dados/credtest.txt", sep='\t',header=None)
dataTest.head()
```

Out[181]:

	0	1	2	3	4	5	6	7	8	9	10	11
0	0	2	500	1	618	10	85	0	36	6	0	0
1	1	0	813	0	552	4	119	0	43	48	119	1
2	3	0	350	0	488	12	66	0	43	0	0	1
3	1	0	1530	0	381	1	398	0	28	48	0	1
4	0	0	688	1	396	10	60	0	49	72	0	1

### Criando as matrizes P e T

```
In [182]:
```

```
P = dataTest.iloc[:,:11].as_matrix()
Test = dataTest.iloc[:, 11:].as_matrix()
P.shape , Test.shape
```

```
Out[182]:
((577, 11), (577, 1))
```

## In [183]:

```
PTest = normalizaFeatures(P)
PTest
```

### Out[183]:

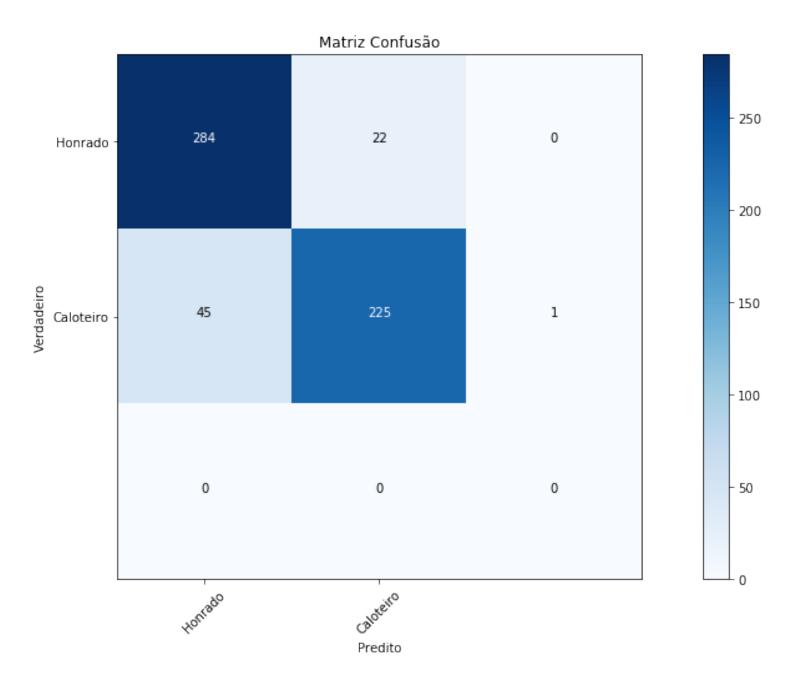
```
array([[-0.77125493, 3.69396032, -0.49166148, ..., -0.38533555, -0.46487844, -0.29246359],
[ 0.63701752, -0.21689308, -0.13429618, ..., 0.13449421, 0.37416707, 1.01944778],
[ 3.4535624, -0.21689308, -0.66292281, ..., 0.13449421, -0.58474208, -0.29246359],
...,
[ -0.77125493, 5.64938702, 0.30755803, ..., -0.16255137, -0.46487844, -0.29246359],
[ 0.63701752, -0.21689308, -0.37748727, ..., -0.60811973, -0.46487844, -0.29246359],
[ -0.77125493, -0.21689308, -0.14913883, ..., -0.90516531, -0.46487844, -0.29246359]])
```

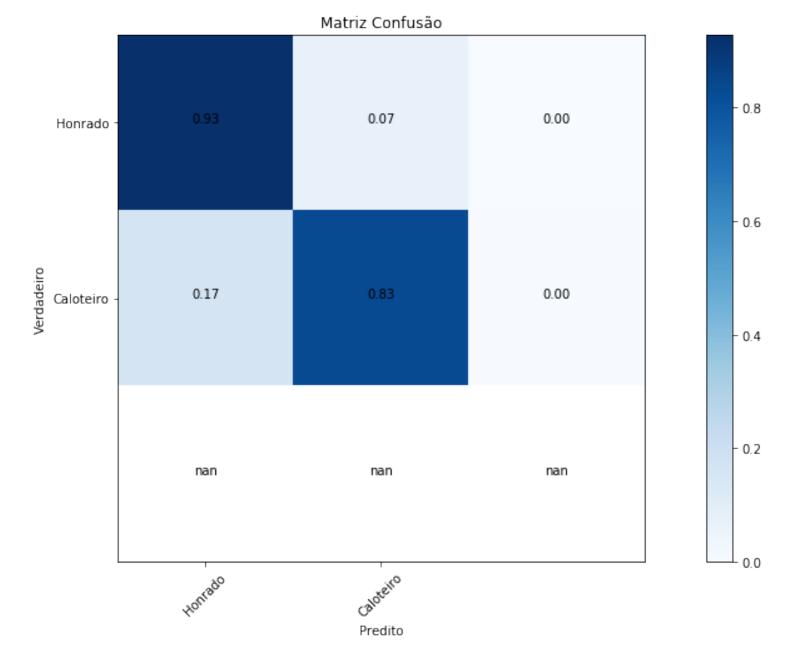
### Avaliação de Predição

```
In [184]:
PTest.shape , Test.shape
Out[184]:
((577, 11), (577, 1))
In [185]:
PredicTest = model.predict(PTest).round()
print('Acurácia: ', accuracy_score(Test, PredicTest))
Acurácia:
           0.882149046794
Matriz de Confusão
In [186]:
PredicTest.shape
Out[186]:
(577, 1)
In [196]:
# Obtendo a Matriz Confusão
matrizConfusao = confusion matrix(Test, PredicTest)
np.set printoptions(precision=2)
matrizConfusao, Test.shape , PredicTest.shape
matrizConfusao.shape
Out[196]:
(3, 3)
In [197]:
# Plot non-normalized confusion matrix
plt.figure(figsize=(14,7))
plot confusion matrix(matrizConfusao, classes=['Honrado', 'Caloteiro'])
# Plot normalized confusion matrix
plt.figure(figsize=(14,7))
plot_confusion_matrix(matrizConfusao, classes=['Honrado', 'Caloteiro'], normal
ize=True)
plt.show()
```

```
Matriz Confusão
[[284
       22
            01
 [ 45 225
             1]
    0
            0]]
 [
        0
Matriz Confusão Normalizada
[[ 0.93
         0.07
                0.
                    ]
 [ 0.17
         0.83
                0.
                    ]
                nan]]
 [
    nan
          nan
```

/anaconda/lib/python3.6/site-packages/ipykernel\_launcher.py:14: Ru ntimeWarning: invalid value encountered in true\_divide





# **Redes Convolucionais**

Nesta parte, você irá treinar modelos de redes neurais artificiais para classificar imagens. Em particular, dada uma imagem, seus modelos deverão indicar se a imagem contém um gato ou não. São fornecidos os conjuntos de imagens para treinamento e para teste (arquivos **train\_catvnoncat.h5** e **test\_catvnoncat.h5**). É também fornecido o código para a leitura dos arquivos correspondentes (veja listagem a seguir; veja também a seção de créditos no fim deste documento).

### In [198]:

import numpy as np
import h5py

```
In [199]:
```

```
def load_dataset():
    train_dataset = h5py.File('am-T3-dados/train_catvnoncat.h5', "r")
    train_set_x_orig = np.array(train_dataset["train_set_x"][:])
    train_set_y_orig = np.array(train_dataset["train_set_y"][:])

    test_dataset = h5py.File('am-T3-dados/test_catvnoncat.h5', "r")
    test_set_x_orig = np.array(test_dataset["test_set_x"][:])
    test_set_y_orig = np.array(test_dataset["test_set_y"][:])

    classes = np.array(test_dataset["list_classes"][:])
    train_set_y_orig = train_set_y_orig.reshape((1, train_set_y_orig.shape[0]))

    test_set_y_orig = test_set_y_orig.reshape((1, test_set_y_orig.shape[0]))

    return train_set_x_orig, train_set_y_orig, test_set_x_orig, test_set_y_orig, classes
```

Após ler os conjuntos de dados, você deve treinar dois modelos utilizando o **Keras**, conforme descrito a seguir:

- Uma rede completamente conectada de uma única camada oculta e com uma camada de saída de duas unidades com softmax.
- Uma rede convolucional.

Em ambos os casos acima, você deverá selecionar os hiperparâmetros e arquitetura de rede. Procure se basear nos exemplos de código e nas arquiteturas de rede apresentadas em aula. Em seu relatório, apresente os detalhes acerca da definição de cada uma dessas redes, assim como o desempenho encontrado em cada um dos casos.

```
In [200]:
treino_X, treino_Y, teste_X, teste_Y, classes = load_dataset()

In [201]:
treino_X.shape, treino_Y.shape, teste_X.shape, teste_Y.shape, classes.shape

Out[201]:
((209, 64, 64, 3), (1, 209), (50, 64, 64, 3), (1, 50), (2,))

In [210]:
# Identificando as imagens do Dataset
for idx in range(5):
    imagem = treino X[idx]
```

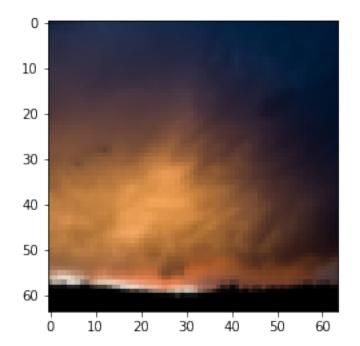
print ("Amostra["+str(idx)+"]: "+classes[np.squeeze(treino Y[:, idx])].dec

Amostra[0]: non-cat

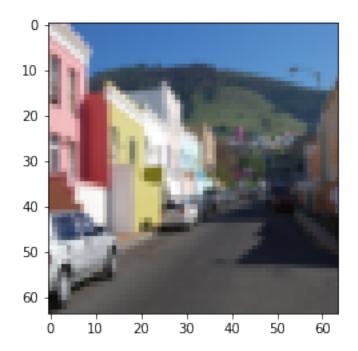
plt.show()

ode("utf-8"))

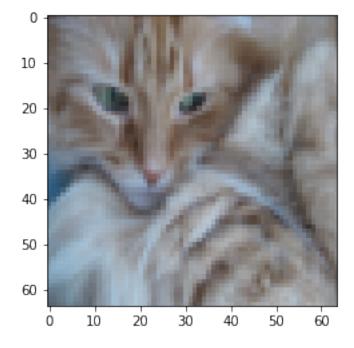
plt.imshow(imagem)



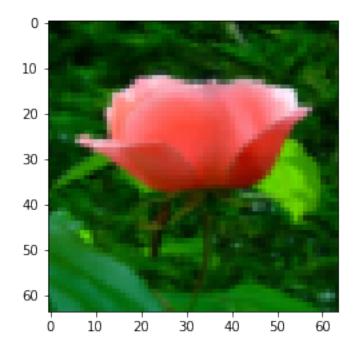
Amostra[1]: non-cat



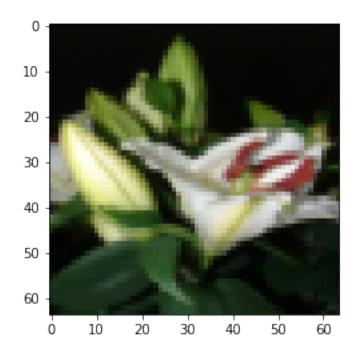
Amostra[2]: cat



Amostra[3]: non-cat



Amostra[4]: non-cat



# Caso 1: Rede Completamente Conectada: única camada oculta e saída com softmax

```
In [211]:
```

```
flatten_x_train = treino_X.reshape((treino_X.shape[0], -1))
flatten_x_test = teste_X.reshape((teste_X.shape[0], -1))

# Convertendo os alvos em matriz com dimensão de número de classes
train_set_y = keras.utils.to_categorical(treino_Y, classes.size)
test_set_y = keras.utils.to_categorical(teste_Y, classes.size)
flatten_x_train.shape , flatten_x_test.shape , train_set_y.shape , test_set_y.shape
```

```
Out[211]:
```

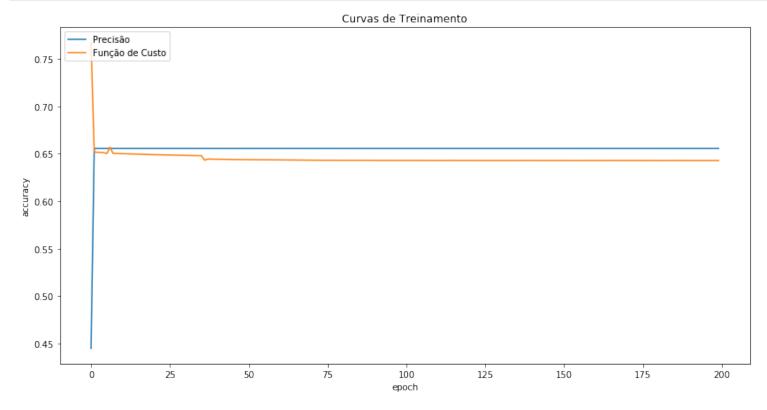
```
((209, 12288), (50, 12288), (209, 2), (50, 2))
```

```
In [212]:
RANDOM = keras.initializers.RandomNormal(seed = 656)
ADADELTA = keras.optimizers.Adadelta()
ERRO = keras.losses.categorical crossentropy
model = Sequential()
model.add(Dense(3, input shape=flatten x train.shape[1:], kernel initializer=R
ANDOM, activation='relu'))
model.add(Dense(5, activation='sigmoid'))
model.add(Dense(2, activation='softmax'))
t1 = time.process time()
model.compile(loss=ERRO, optimizer=ADADELTA, metrics=['binary accuracy'])
history = model.fit(flatten x train, train set y, epochs=200, verbose=0)
t2 = time.process time()
score = model.evaluate(flatten x test, test set y, verbose=0)
print('Custo do Teste:', score[0])
print('Precisão do Teste:', score[1])
Custo do Teste: 0.846456818581
Precisão do Teste: 0.34
In [213]:
print("\n ######## Tempo de Treinamento da Rede Completamente Conectada (Cat
vsNocat) ########\n")
print ("\n\t ---- Computation time = " + str(t2 - t1) + "s ----")
print("\n
#######\n")
######## Tempo de Treinamento da Rede Completamente Conectada (
CatvsNocat) #########
        ---- Computation time = 10.947392999998556s ----
#########################
In [214]:
# Obtendo as métricas para exibir o Gráfico
metrics = history.history
metrics.keys()
Out[214]:
```

dict\_keys(['loss', 'binary\_accuracy'])

```
In [215]:
```

```
plt.figure(figsize=(14,7))
plt.plot(metrics['binary_accuracy'])
plt.plot(metrics['loss'])
plt.title('Curvas de Treinamento')
plt.ylabel('accuracy')
plt.xlabel('epoch')
plt.legend(['Precisão', 'Função de Custo'], loc='upper left')
plt.show();
```



## In [216]:

```
PredicTest = model.predict(flatten_x_test).round()
print('Acurácia: ', accuracy_score(test_set_y, PredicTest))
```

Acurácia: 0.34

# **Caso 2: Rede Convolucional**

Reutilização da Metologia utilizada no MNIST (<a href="https://github.com/fchollet/keras/blob/master/examples/mnist\_cnn.py">https://github.com/fchollet/keras/blob/master/examples/mnist\_cnn.py</a>) para o dataset CATVSNON-CAT

```
In [141]:
# Carregando o dataset
x train , y train , x test , y test, classes = load dataset()
x_train.shape , y_train.shape , x_test.shape , y_test.shape , classes
Out[141]:
((209, 64, 64, 3),
 (1, 209),
 (50, 64, 64, 3),
 (1, 50),
 array([b'non-cat', b'cat'],
      dtype='|S7'))
In [142]:
NCLASS = classes.size # Quantidade de Classes
DIMY = x_train.shape[1] # Dimensão X da Imagem
DIMX = x_train.shape[2] # Dimensão Y da Imagem
if K.image data format() == 'channels first':
    x train = x train.reshape(x train.shape[0], 3, DIMX, DIMY)
    x_test = x_test.reshape(x_test.shape[0], 3, DIMX, DIMY)
    input shape = (3, DIMX, DIMY)
else:
    x train = x train.reshape(x train.shape[0], DIMX, DIMY, 3)
    x test = x test.reshape(x test.shape[0], DIMX, DIMY, 3)
    input_shape = (DIMX, DIMY, 3)
x train = x train.astype('float32')
x test = x test.astype('float32')
x train /= 255
x test /= 255
print('x_train shape:', x_train.shape)
print(x_train.shape[0], 'train samples')
print(x_test.shape[0], 'test samples')
# Converte os vetores alvo em matrizes de dimensão equivalente ao número de cl
y train = keras.utils.to_categorical(y_train, NCLASS)
y_test = keras.utils.to_categorical(y_test, NCLASS)
x_train.shape , y_train.shape , x_test.shape , y test.shape
x_train shape: (209, 64, 64, 3)
209 train samples
50 test samples
Out[142]:
((209, 64, 64, 3), (209, 2), (50, 64, 64, 3), (50, 2))
```

# **Iniciando Treinamento**

```
In [146]:
BTHSIZE = 64
                                                # Definindo um valor de ba
tch size
CROSSENTROPY = keras.losses.categorical crossentropy # Função de custo
ADADELTA = keras.optimizers.Adadelta()
                                                # Função de minimização
model = Sequential()
model.add(Conv2D(32, kernel size=(4, 4), activation='relu',input shape=input s
hape))
model.add(Conv2D(64, (4, 4), activation='relu'))
model.add(MaxPooling2D(pool size=(2, 2)))
model.add(Dropout(0.25))
model.add(Flatten())
model.add(Dense(128, activation='relu'))
model.add(Dropout(0.5))
model.add(Dense(2, activation='softmax'))
t1 = time.process time()
model.compile(loss=CROSSENTROPY, optimizer=ADADELTA, metrics=['accuracy'])
history = model.fit(x train, y train, batch size=BTHSIZE, epochs=80, verbose=1
, validation_data=(x_test, y_test))
t2 = time.process_time()
score = model.evaluate(x test, y test, verbose=0)
print('Custo do Teste:', score[0])
print('Precisão do Teste:', score[1])
print("\n ######## Tempo de Treinamento da Rede Convolucional (CatvsNocat) #
#######\n")
print ("\n\t ---- Computation time = " + str(t2 - t1) + "s ----")
print("\n
#######\n")
Train on 209 samples, validate on 50 samples
Epoch 1/80
209/209 [============== ] - 4s - loss: 0.7577 - acc
: 0.5789 - val loss: 0.7462 - val acc: 0.3400
Epoch 2/80
209/209 [============= ] - 3s - loss: 0.6185 - acc
: 0.6507 - val loss: 0.7748 - val acc: 0.3400
Epoch 3/80
209/209 [============= ] - 3s - loss: 0.5790 - acc
: 0.6651 - val loss: 0.6604 - val acc: 0.4200
Epoch 4/80
209/209 [============ ] - 3s - loss: 0.5400 - acc
: 0.7321 - val_loss: 0.6198 - val_acc: 0.6000
Epoch 5/80
209/209 [============== ] - 3s - loss: 0.5816 - acc
: 0.6890 - val loss: 0.6468 - val acc: 0.5000
Epoch 6/80
209/209 [============= ] - 3s - loss: 0.4950 - acc
```

```
: 0.7512 - val_loss: 0.9131 - val_acc: 0.3400
Epoch 7/80
209/209 [============= ] - 3s - loss: 0.5661 - acc
: 0.6268 - val_loss: 0.6473 - val_acc: 0.4800
Epoch 8/80
209/209 [============= ] - 3s - loss: 0.4549 - acc
: 0.7560 - val_loss: 0.6620 - val_acc: 0.5400
Epoch 9/80
209/209 [============= ] - 3s - loss: 0.4091 - acc
: 0.7847 - val loss: 1.2469 - val acc: 0.3400
Epoch 10/80
209/209 [============= ] - 3s - loss: 0.4651 - acc
: 0.7560 - val_loss: 0.5158 - val_acc: 0.8200
Epoch 11/80
209/209 [============= ] - 3s - loss: 0.5567 - acc
: 0.6746 - val loss: 0.8342 - val acc: 0.3400
Epoch 12/80
209/209 [============= ] - 3s - loss: 0.3956 - acc
: 0.7895 - val loss: 0.5115 - val_acc: 0.8800
Epoch 13/80
209/209 [============= ] - 4s - loss: 0.3518 - acc
: 0.8660 - val_loss: 1.4162 - val_acc: 0.3400
Epoch 14/80
209/209 [============= ] - 4s - loss: 0.4479 - acc
: 0.7416 - val_loss: 0.6025 - val_acc: 0.6800
Epoch 15/80
209/209 [============= ] - 4s - loss: 0.3332 - acc
: 0.8660 - val_loss: 0.3814 - val_acc: 0.8600
Epoch 16/80
209/209 [============= ] - 4s - loss: 0.3700 - acc
: 0.7990 - val_loss: 0.4205 - val_acc: 0.9400
Epoch 17/80
209/209 [============= ] - 4s - loss: 0.2892 - acc
: 0.9282 - val loss: 0.3799 - val acc: 0.9400
Epoch 18/80
209/209 [============= ] - 4s - loss: 0.2831 - acc
: 0.8900 - val_loss: 0.4214 - val_acc: 0.8200
Epoch 19/80
209/209 [============= ] - 4s - loss: 0.6286 - acc
: 0.7703 - val_loss: 1.0829 - val_acc: 0.3400
Epoch 20/80
209/209 [============= ] - 3s - loss: 0.3659 - acc
: 0.8421 - val loss: 0.6733 - val acc: 0.6000
Epoch 21/80
209/209 [============= ] - 3s - loss: 0.2865 - acc
: 0.8852 - val_loss: 0.3429 - val_acc: 0.9400
Epoch 22/80
209/209 [============= ] - 3s - loss: 0.2542 - acc
: 0.9091 - val loss: 0.6406 - val acc: 0.7000
Epoch 23/80
209/209 [============= ] - 3s - loss: 0.2237 - acc
: 0.9139 - val_loss: 0.3822 - val_acc: 0.8200
Epoch 24/80
209/209 [============= ] - 3s - loss: 0.4290 - acc
: 0.7943 - val_loss: 0.6677 - val_acc: 0.6200
Epoch 25/80
209/209 [============= ] - 3s - loss: 0.2198 - acc
```

```
: 0.9522 - val_loss: 0.3825 - val_acc: 0.8800
Epoch 26/80
209/209 [============= ] - 3s - loss: 0.1711 - acc
: 0.9665 - val_loss: 0.8144 - val_acc: 0.5400
Epoch 27/80
209/209 [============= ] - 3s - loss: 0.1963 - acc
: 0.9330 - val_loss: 0.4790 - val_acc: 0.8000
Epoch 28/80
209/209 [============= ] - 3s - loss: 0.1767 - acc
: 0.9330 - val loss: 0.4509 - val acc: 0.7800
Epoch 29/80
209/209 [============= ] - 3s - loss: 0.2187 - acc
: 0.9043 - val_loss: 0.8545 - val_acc: 0.5800
Epoch 30/80
209/209 [============= ] - 3s - loss: 0.2280 - acc
: 0.8900 - val loss: 0.4324 - val acc: 0.8200
Epoch 31/80
209/209 [============= ] - 3s - loss: 0.1138 - acc
: 0.9856 - val loss: 0.4470 - val_acc: 0.8400
Epoch 32/80
209/209 [============= ] - 3s - loss: 0.0961 - acc
: 0.9809 - val_loss: 0.5286 - val_acc: 0.8000
Epoch 33/80
209/209 [============= ] - 3s - loss: 0.1266 - acc
: 0.9665 - val_loss: 0.4757 - val_acc: 0.8800
Epoch 34/80
209/209 [============= ] - 3s - loss: 0.1347 - acc
: 0.9761 - val_loss: 0.5845 - val_acc: 0.7800
Epoch 35/80
209/209 [============= ] - 3s - loss: 0.0815 - acc
: 0.9904 - val_loss: 0.4055 - val_acc: 0.8800
Epoch 36/80
209/209 [============= ] - 3s - loss: 0.0659 - acc
: 0.9952 - val loss: 0.4330 - val acc: 0.8800
Epoch 37/80
209/209 [============= ] - 3s - loss: 0.0532 - acc
: 0.9952 - val_loss: 0.7794 - val_acc: 0.7400
Epoch 38/80
209/209 [============= ] - 3s - loss: 0.1128 - acc
: 0.9665 - val_loss: 0.4017 - val_acc: 0.9000
Epoch 39/80
209/209 [============= ] - 3s - loss: 0.0455 - acc
: 1.0000 - val loss: 0.7341 - val acc: 0.7800
Epoch 40/80
209/209 [============= ] - 3s - loss: 0.0350 - acc
: 1.0000 - val_loss: 0.7489 - val_acc: 0.7600
Epoch 41/80
209/209 [============= ] - 3s - loss: 0.3799 - acc
: 0.8373 - val loss: 0.5017 - val acc: 0.8200
Epoch 42/80
209/209 [============= ] - 3s - loss: 0.0794 - acc
: 1.0000 - val_loss: 0.4584 - val acc: 0.8200
Epoch 43/80
209/209 [=============] - 3s - loss: 0.0566 - acc
: 0.9904 - val loss: 0.4740 - val acc: 0.8200
Epoch 44/80
209/209 [============= ] - 3s - loss: 0.0412 - acc
```

```
: 1.0000 - val loss: 0.4378 - val acc: 0.8600
Epoch 45/80
209/209 [============= ] - 3s - loss: 0.0361 - acc
: 0.9952 - val_loss: 0.5970 - val_acc: 0.7800
Epoch 46/80
209/209 [============= ] - 3s - loss: 0.0301 - acc
: 1.0000 - val_loss: 0.6201 - val_acc: 0.7800
Epoch 47/80
209/209 [============= ] - 3s - loss: 0.0347 - acc
: 0.9952 - val loss: 0.6131 - val acc: 0.8000
Epoch 48/80
209/209 [============= ] - 3s - loss: 0.0367 - acc
: 0.9952 - val_loss: 0.4509 - val_acc: 0.8600
Epoch 49/80
209/209 [============= ] - 3s - loss: 0.0256 - acc
: 1.0000 - val loss: 0.5600 - val acc: 0.8200
Epoch 50/80
209/209 [============= ] - 3s - loss: 0.0236 - acc
: 1.0000 - val loss: 0.5676 - val_acc: 0.8400
Epoch 51/80
209/209 [============= ] - 3s - loss: 0.0176 - acc
: 1.0000 - val_loss: 0.4613 - val_acc: 0.8600
Epoch 52/80
209/209 [============= ] - 3s - loss: 0.0237 - acc
: 1.0000 - val_loss: 0.5891 - val_acc: 0.8200
Epoch 53/80
209/209 [============= ] - 3s - loss: 0.0140 - acc
: 1.0000 - val_loss: 0.5225 - val_acc: 0.8600
Epoch 54/80
209/209 [============= ] - 3s - loss: 0.0122 - acc
: 1.0000 - val_loss: 0.5587 - val_acc: 0.8800
Epoch 55/80
209/209 [============= ] - 3s - loss: 0.0134 - acc
: 1.0000 - val loss: 0.5213 - val acc: 0.8200
Epoch 56/80
209/209 [============= ] - 3s - loss: 0.0313 - acc
: 0.9952 - val_loss: 0.5680 - val_acc: 0.8800
Epoch 57/80
209/209 [============= ] - 3s - loss: 0.0109 - acc
: 1.0000 - val loss: 0.5698 - val acc: 0.8800
Epoch 58/80
209/209 [============= ] - 3s - loss: 0.0099 - acc
: 1.0000 - val loss: 0.4884 - val acc: 0.8800
Epoch 59/80
209/209 [============= ] - 3s - loss: 0.0254 - acc
: 0.9952 - val_loss: 0.5625 - val_acc: 0.8400
Epoch 60/80
209/209 [============= ] - 3s - loss: 0.0092 - acc
: 1.0000 - val loss: 0.7118 - val acc: 0.7800
Epoch 61/80
209/209 [============= ] - 3s - loss: 0.0096 - acc
: 1.0000 - val_loss: 0.5022 - val acc: 0.8600
Epoch 62/80
209/209 [=============] - 3s - loss: 0.0094 - acc
: 1.0000 - val_loss: 0.5719 - val_acc: 0.8600
Epoch 63/80
209/209 [============= ] - 3s - loss: 0.0070 - acc
```

```
: 1.0000 - val_loss: 0.5503 - val_acc: 0.8800
Epoch 64/80
209/209 [============= ] - 3s - loss: 0.0064 - acc
: 1.0000 - val_loss: 0.5227 - val_acc: 0.8600
Epoch 65/80
209/209 [============= ] - 4s - loss: 0.0095 - acc
: 1.0000 - val_loss: 0.6060 - val_acc: 0.8600
Epoch 66/80
209/209 [============== ] - 4s - loss: 0.0068 - acc
: 1.0000 - val loss: 0.6708 - val acc: 0.8400
Epoch 67/80
209/209 [============= ] - 3s - loss: 0.0089 - acc
: 0.9952 - val_loss: 0.8469 - val_acc: 0.7800
Epoch 68/80
209/209 [============= ] - 3s - loss: 0.0095 - acc
: 1.0000 - val loss: 0.5504 - val acc: 0.8600
Epoch 69/80
209/209 [============= ] - 3s - loss: 0.0078 - acc
: 1.0000 - val loss: 0.8137 - val_acc: 0.7800
209/209 [============== ] - 3s - loss: 0.0061 - acc
: 1.0000 - val_loss: 0.6778 - val_acc: 0.8600
Epoch 71/80
209/209 [============ ] - 3s - loss: 0.0053 - acc
: 1.0000 - val_loss: 0.7447 - val_acc: 0.8000
Epoch 72/80
209/209 [============= ] - 3s - loss: 0.0040 - acc
: 1.0000 - val_loss: 0.5760 - val_acc: 0.8600
Epoch 73/80
209/209 [============= ] - 3s - loss: 0.0055 - acc
: 1.0000 - val_loss: 1.5056 - val_acc: 0.6600
Epoch 74/80
209/209 [============ ] - 3s - loss: 0.1073 - acc
: 0.9426 - val loss: 0.5223 - val acc: 0.8600
Epoch 75/80
209/209 [============= ] - 4s - loss: 0.0126 - acc
: 1.0000 - val_loss: 0.5692 - val_acc: 0.8400
Epoch 76/80
209/209 [============= ] - 4s - loss: 0.0083 - acc
: 1.0000 - val loss: 0.5514 - val acc: 0.8400
Epoch 77/80
209/209 [============ ] - 3s - loss: 0.0073 - acc
: 1.0000 - val loss: 0.6046 - val acc: 0.8400
Epoch 78/80
209/209 [============= ] - 3s - loss: 0.0062 - acc
: 1.0000 - val_loss: 0.6417 - val_acc: 0.8600
Epoch 79/80
209/209 [============= ] - 3s - loss: 0.0048 - acc
: 1.0000 - val loss: 0.6284 - val acc: 0.8600
Epoch 80/80
209/209 [============= ] - 3s - loss: 0.0042 - acc
: 1.0000 - val_loss: 0.6469 - val_acc: 0.8600
Custo do Teste: 0.646850271225
Precisão do Teste: 0.860000002384
```

######## Tempo de Treinamento da Rede Convolucional (CatvsNocat

) #########

# In [147]:

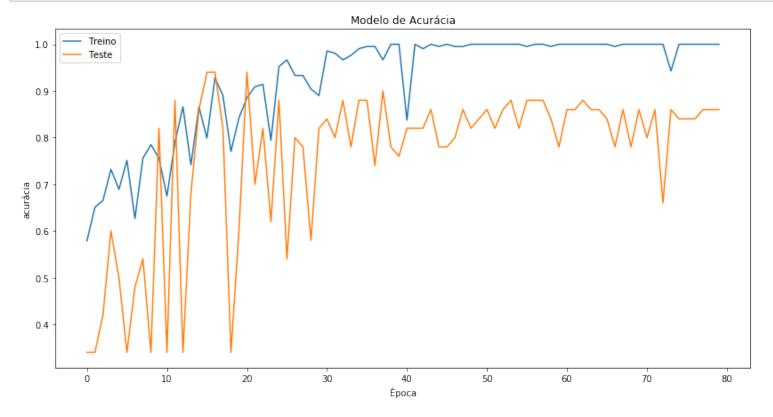
```
# Obtendo as métricas para exibir o Gráfico
metrics = history.history
metrics.keys()
```

## Out[147]:

dict\_keys(['val\_loss', 'val\_acc', 'loss', 'acc'])

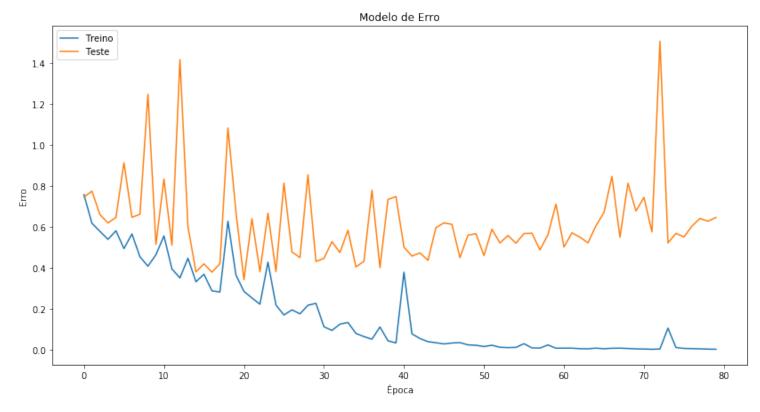
# In [150]:

```
plt.figure(figsize=(14,7))
plt.plot(metrics['acc'])
plt.plot(metrics['val_acc'])
plt.title('Modelo de Acurácia')
plt.ylabel('acurácia')
plt.xlabel('Época')
plt.legend(['Treino', 'Teste'], loc='upper left')
plt.show();
```



# In [151]:

```
plt.figure(figsize=(14,7))
plt.plot(metrics['loss'])
plt.plot(metrics['val_loss'])
plt.title('Modelo de Erro')
plt.ylabel('Erro')
plt.xlabel('Época')
plt.legend(['Treino', 'Teste'], loc='upper left')
plt.show();
```



# In [ ]: