# Improvise a Jazz Solo with an LSTM Network

Welcome to your final programming assignment of this week! In this notebook, you will implement a model that uses an LSTM to generate music. You will even be able to listen to your own music at the end of the assignment.

#### You will learn to:

- · Apply an LSTM to music generation.
- · Generate your own jazz music with deep learning.

# **Updates**

# If you were working on the notebook before this update...

- · The current notebook is version "3a".
- You can find your original work saved in the notebook with the previous version name ("v3")
- To view the file directory, go to the menu "File->Open", and this will open a new tab that shows the file directory.

# List of updates

- djmodel
  - Explains Input layer and its parameter shape.
  - Explains Lambda layer and replaces the given solution with hints and sample code (to improve the learning experience).
  - Adds hints for using the Keras Model.
- music\_inference\_model
  - Explains each line of code in the one\_hot function.
  - Explains how to apply one\_hot with a Lambda layer instead of giving the code solution (to improve the learning experience).
  - Adds instructions on defining the Model.
- predict\_and\_sample
  - Provides detailed instructions for each step.
  - Clarifies which variable/function to use for inference.
- · Spelling, grammar and wording corrections.

Please run the following cell to load all the packages required in this assignment. This may take a few minutes.

```
In [1]:
        from future import print function
        import IPython
        import sys
        from music21 import *
        import numpy as np
        from grammar import *
        from qa import *
        from preprocess import *
        from music utils import *
        from data_utils import *
        from keras.models import load model, Model
        from keras.layers import Dense, Activation, Dropout, Input, LSTM, Reshape, Lam
        bda, RepeatVector
        from keras.initializers import glorot uniform
        from keras.utils import to categorical
        from keras.optimizers import Adam
        from keras import backend as K
```

Using TensorFlow backend.

# 1 - Problem statement

You would like to create a jazz music piece specially for a friend's birthday. However, you don't know any instruments or music composition. Fortunately, you know deep learning and will solve this problem using an LSTM network.

You will train a network to generate novel jazz solos in a style representative of a body of performed work.



#### 1.1 - Dataset

You will train your algorithm on a corpus of Jazz music. Run the cell below to listen to a snippet of the audio from the training set:

```
In [2]:
        IPython.display.Audio('./data/30s seq.mp3')
Out[2]:
               0:00 / 0:29
```

We have taken care of the preprocessing of the musical data to render it in terms of musical "values."

#### **Details about music (optional)**

You can informally think of each "value" as a note, which comprises a pitch and duration. For example, if you press down a specific piano key for 0.5 seconds, then you have just played a note. In music theory, a "value" is actually more complicated than this--specifically, it also captures the information needed to play multiple notes at the same time. For example, when playing a music piece, you might press down two piano keys at the same time (playing multiple notes at the same time generates what's called a "chord"). But we don't need to worry about the details of music theory for this assignment.

#### Music as a sequence of values

- For the purpose of this assignment, all you need to know is that we will obtain a dataset of values, and will learn an RNN model to generate sequences of values.
- Our music generation system will use 78 unique values.

Run the following code to load the raw music data and preprocess it into values. This might take a few minutes.

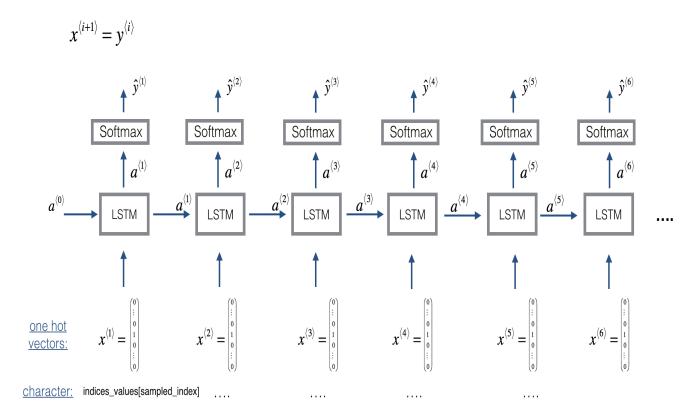
```
In [3]: | X, Y, n_values, indices_values = load_music_utils()
        print('number of training examples:', X.shape[0])
        print('Tx (length of sequence):', X.shape[1])
        print('total # of unique values:', n_values)
        print('shape of X:', X.shape)
        print('Shape of Y:', Y.shape)
        number of training examples: 60
        Tx (length of sequence): 30
        total # of unique values: 78
        shape of X: (60, 30, 78)
        Shape of Y: (30, 60, 78)
```

# You have just loaded the following:

- X: This is an (m,  $T_x$ , 78) dimensional array.
  - ullet We have m training examples, each of which is a snippet of  $T_x=30$  musical values.
  - At each time step, the input is one of 78 different possible values, represented as a one-hot vector.
    - For example, X[i,t,:] is a one-hot vector representing the value of the i-th example at time t.
- Y: a  $(T_v, m, 78)$  dimensional array
  - This is essentially the same as X, but shifted one step to the left (to the past).
  - Notice that the data in Y is **reordered** to be dimension  $(T_y, m, 78)$ , where  $T_y = T_x$ . This format makes it more convenient to feed into the LSTM later.
  - Similar to the dinosaur assignment, we're using the previous values to predict the next value.
    - ullet So our sequence model will try to predict  $y^{\langle t \rangle}$  given  $x^{\langle 1 \rangle}, \dots, x^{\langle t \rangle}$ .
- n values: The number of unique values in this dataset. This should be 78.
- indices\_values: python dictionary mapping integers 0 through 77 to musical values.

# 1.2 - Overview of our model

Here is the architecture of the model we will use. This is similar to the Dinosaurus model, except that you will implement it in Keras.



- $X=(x^{\langle 1 \rangle},x^{\langle 2 \rangle},\cdots,x^{\langle T_x \rangle})$  is a window of size  $T_x$  scanned over the musical corpus.
- Each  $x^{\langle t \rangle}$  is an index corresponding to a value.
- $\hat{y}^t$  is the prediction for the next value.
- We will be training the model on random snippets of 30 values taken from a much longer piece of music.
  - Thus, we won't bother to set the first input  $x^{\langle 1 \rangle} = \vec{0}$ , since most of these snippets of audio start somewhere in the middle of a piece of music.
  - ullet We are setting each of the snippets to have the same length  $T_x=30$  to make vectorization easier.

# Overview of parts 2 and 3

- We're going to train a model that predicts the next note in a style that is similar to the jazz music that it's trained on. The training is contained in the weights and biases of the model.
- In Part 3, we're then going to use those weights and biases in a new model which predicts a series of notes, using the previous note to predict the next note.
- The weights and biases are transferred to the new model using 'global shared layers' described below"

# 2 - Building the model

- In this part you will build and train a model that will learn musical patterns.
- The model takes input X of shape  $(m, T_x, 78)$  and labels Y of shape  $(T_y, m, 78)$ .
- We will use an LSTM with hidden states that have  $n_a=64$  dimensions.

```
In [4]: # number of dimensions for the hidden state of each LSTM cell.
        n = 64
```

## Sequence generation uses a for-loop

- If you're building an RNN where, at test time, the entire input sequence  $x^{\langle 1 \rangle}, x^{\langle 2 \rangle}, \dots, x^{\langle T_x \rangle}$  is given in advance, then Keras has simple built-in functions to build the model.
- However, for sequence generation, at test time we don't know all the values of  $x^{\langle t \rangle}$  in advance.
- Instead we generate them one at a time using  $x^{\langle t \rangle} = v^{\langle t-1 \rangle}$  .
  - The input at time "t" is the prediction at the previous time step "t-1".
- So you'll need to implement your own for-loop to iterate over the time steps.

# Shareable weights

- The function djmodel() will call the LSTM layer  $T_x$  times using a for-loop.
- It is important that all  $T_{x}$  copies have the same weights.
  - ullet The  $T_x$  steps should have shared weights that aren't re-initialized.
- · Referencing a globally defined shared layer will utilize the same layer-object instance at each time step.
- The key steps for implementing layers with shareable weights in Keras are:
- Define the layer objects (we will use global variables for this).
- Call these objects when propagating the input.

#### 3 types of layers

- · We have defined the layers objects you need as global variables.
- Please run the next cell to create them.
- Please read the Keras documentation and understand these layers:
  - Reshape() (https://keras.io/layers/core/#reshape): Reshapes an output to a certain shape.
  - LSTM() (https://keras.io/layers/recurrent/#lstm): Long Short-Term Memory layer
  - <u>Dense() (https://keras.io/layers/core/#dense)</u>: A regular fully-connected neural network layer.

```
In [5]: n_values = 78 # number of music values
                                                                # Used in Step 2.B of
        reshapor = Reshape((1, n_values))
        djmodel(), below
        LSTM_cell = LSTM(n_a, return_state = True)
                                                          # Used in Step 2.C
        densor = Dense(n_values, activation='softmax')
                                                          # Used in Step 2.D
```

- reshapor, LSTM\_cell and densor are globally defined layer objects, that you'll use to implement djmodel().
- In order to propagate a Keras tensor object X through one of these layers, use layer\_object().
  - For one input, use layer\_object(X)
  - For more than one input, put the inputs in a list: layer object([X1,X2])

Exercise: Implement djmodel().

## Inputs (given)

- The Input() layer is used for defining the input X as well as the initial hidden state 'a0' and cell state
   c0.
- The shape parameter takes a tuple that does not include the batch dimension (m).
  - For example,

```
X = Input(shape=(Tx, n_values)) \# X \ has 3 \ dimensions \ and \ not 2: (m, T x, n_values)
```

#### Step 1: Outputs (TODO)

• Create an empty list "outputs" to save the outputs of the LSTM Cell at every time step.

### Step 2: Loop through time steps (TODO)

• Loop for  $t \in {1,\ldots,T_x}$ :

### 2A. Select the 't' time-step vector from X.

- X has the shape (m, Tx, n\_values).
- The shape of the 't' selection should be (n\_values,).
- Recall that if you were implementing in numpy instead of Keras, you would extract a slice from a 3D numpy array like this:

```
var1 = array1[:,1,:]
```

#### Lambda layer

- · Since we're using Keras, we need to define this step inside a custom layer.
- In Keras, this is a Lambda layer Lambda (https://keras.io/layers/core/#lambda)
- As an example, a Lambda layer that takes the previous layer and adds '1' looks like this

- · The previous layer in this case is X.
- · z is a local variable of the lambda function.
  - The previous layer gets passed into the parameter z in the lowercase lambda function.
  - You can choose the name of the variable to be something else if you want.
- The operation after the colon ':' should be the operation to extract a slice from the previous layer.
- **Hint**: You'll be using the variable t within the definition of the lambda layer even though it isn't passed in as an argument to Lambda.

#### 2B. Reshape x to be (1,n\_values).

Use the reshapor() layer. It is a function that takes the previous layer as its input argument.

# 2C. Run x through one step of LSTM\_cell.

- Initialize the LSTM cell with the previous step's hidden state a and cell state c.
- · Use the following formatting:

```
next_hidden_state, _, next_cell_state = LSTM_cell(inputs=input_x, initial_st
ate=[previous hidden state, previous cell state])
```

Choose appropriate variables for inputs, hidden state and cell state.

#### 2D. Dense layer

Propagate the LSTM's hidden state through a dense+softmax layer using densor.

# 2E. Append output

· Append the output to the list of "outputs".

### Step 3: After the loop, create the model

- Use the Keras Model object to create a model.
- · specify the inputs and outputs:

```
model = Model(inputs=[input_x, initial_hidden_state, initial_cell_state], ou
tputs=the outputs)
```

- Choose the appropriate variables for the input tensor, hidden state, cell state, and output.
- See the documentation for <u>Model (https://keras.io/models/model/)</u>

```
In [7]: # GRADED FUNCTION: djmodel
        def djmodel(Tx, n_a, n_values):
            Implement the model
            Arguments:
            Tx -- length of the sequence in a corpus
            n a -- the number of activations used in our model
            n_values -- number of unique values in the music data
            Returns:
            model -- a keras instance model with n_a activations
            # Define the input layer and specify the shape
            X = Input(shape=(Tx, n values))
            # Define the initial hidden state a0 and initial cell state c0
            # using `Input`
            a0 = Input(shape=(n a,), name='a0')
            c0 = Input(shape=(n_a,), name='c0')
            a = a0
            c = c0
            ### START CODE HERE ###
            # Step 1: Create empty list to append the outputs while you iterate (≈1 li
        ne)
            outputs = []
            # Step 2: Loop
            for t in range(Tx):
                # Step 2.A: select the "t"th time step vector from X.
                x = Lambda(lambda x : X[:,t,:])(X)
                # Step 2.B: Use reshapor to reshape x to be (1, n values) (\approx1 line)
                x = reshapor(x)
                # Step 2.C: Perform one step of the LSTM cell
                 a, , c = LSTM cell(inputs=x, initial state=[a, c])
                # Step 2.D: Apply densor to the hidden state output of LSTM_Cell
                out = densor(inputs=a)
                # Step 2.E: add the output to "outputs"
                outputs.append(out)
            # Step 3: Create model instance
            model = Model(inputs=[X, a0, c0], outputs=outputs)
            ### END CODE HERE ###
            return model
```

# Create the model object

- Run the following cell to define your model.
- We will use Tx=30, n\_a=64 (the dimension of the LSTM activations), and n\_values=78.
- This cell may take a few seconds to run.

```
In [8]: | model = djmodel(Tx = 30 , n_a = 64, n_values = 78)
```

In [9]: # Check your model
model.summary()

Layer (type) to	Output Shape	Param #	Connected
input_1 (InputLayer)	(None, 30, 78)	0	
lambda_1 (Lambda) [0]	(None, 78)	0	input_1[0
reshape_1 (Reshape) [0][0]	(None, 1, 78)	0	lambda_1
[0][0]			lambda_2
[0][0]			lambda_3
[0][0]			lambda_4
[0][0]			lambda_5
[0][0]			lambda_6
[0][0]			lambda_7
[0][0]			lambda_8
[0][0]			lambda_9
[0][0]			lambda_10
[0][0]			lambda_11
[0][0]			lambda_12
[0][0]			lambda_13
[0][0]			lambda_14
[0][0]			lambda_15
[0][0]			lambda_16
[0][0]			lambda_17
[0][0]			lambda_18
[0][0]			lambda_19
[0][0]			lambda_20
[0][0]			lambda_21
[0][0]			lambda_22
[-][-]			

	improvise_a_bazz_bolo_witi_an_convi_ivetw	OIK_VJa	
[0][0]			lambda_23
[0][0]			lambda_24
[0][0]			lambda_25
[0][0]			lambda_26
[0][0]			lambda_27
[0][0]			lambda_28
[0][0]			lambda_29
[0][0]			lambda_30
a0 (InputLayer)	(None, 64)	0	
c0 (InputLayer)	(None, 64)	0	
lambda_2 (Lambda) [0]	(None, 78)	0	input_1[0]
lstm_1 (LSTM)	[(None, 64), (None	e, 6 36608	reshape_1
[0][0]			a0[0][0] c0[0][0] reshape_1
[1][0]			lstm_1[0]
[0]			lstm_1[0]
[2]			reshape_1
[2][0]			lstm_1[1]
[0]			lstm_1[1]
[2]			reshape_1
[3][0]			lstm_1[2]
[0]			lstm_1[2]
[2]			reshape_1
[4][0]			
[0]			lstm_1[3]
[2]			lstm_1[3]
			reshape_1

[[]	·	
[5][0]		lstm_1[4]
[0]		lstm_1[4]
[2]		reshape_1
[6][0]		lstm_1[5]
[0]		lstm_1[5]
[2]		reshape_1
[7][0]		lstm_1[6]
[0]		lstm_1[6]
[2]		reshape_1
[8][0]		lstm_1[7]
[0]		lstm_1[7]
[2]		reshape_1
[9][0]		lstm_1[8]
[0]		lstm_1[8]
[2]		reshape_1
[10][0]		lstm_1[9]
[0]		lstm_1[9]
[2]		reshape_1
[11][0]		lstm_1[10]
[0]		lstm_1[10]
[2]		reshape_1
[12][0]		lstm_1[11]
[0]		lstm_1[11]
[2]		reshape_1
[13][0]		lstm_1[12]
[0]		lstm_1[12]
[2]		reshape_1
[14][0]		lstm_1[13]
[0]		

	lstm_1[13]
[2]	reshape_1
[15][0]	lstm_1[14]
[0]	lstm_1[14]
[2]	reshape_1
[16][0]	lstm_1[15]
[0]	lstm_1[15]
[2]	reshape_1
[17][0]	lstm_1[16]
[0]	lstm_1[16]
[2]	reshape_1
[18][0]	lstm_1[17]
[0]	lstm_1[17]
[2]	reshape_1
[19][0]	
[0]	lstm_1[18]
[2]	lstm_1[18]
[20][0]	reshape_1
[0]	lstm_1[19]
[2]	lstm_1[19]
[21][0]	reshape_1
[0]	lstm_1[20]
[2]	lstm_1[20]
[22][0]	reshape_1
[0]	lstm_1[21]
[2]	lstm_1[21]
[23][0]	reshape_1
[0]	lstm_1[22]
[2]	lstm_1[22]
r <del>-</del> 1	reshape_1

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[24][0]			lstm_1[23]
[0]			lstm_1[23]
[2]			reshape_1
[25][0]			lstm_1[24]
[0]			lstm_1[24]
[2]			
[26][0]			reshape_1
[0]			lstm_1[25]
[2]			lstm_1[25]
[27][0]			reshape_1
[0]			lstm_1[26]
[2]			lstm_1[26]
[28][0]			reshape_1
[0]			lstm_1[27]
[2]			lstm_1[27]
[29][0]			reshape_1
[0]			lstm_1[28]
[2]			lstm_1[28]
lambda_3 (Lambda) [0]	(None, 78)	0	input_1[0]
lambda_4 (Lambda) [0]	- (None, 78)	0	input_1[0]
lambda_5 (Lambda) [0]	(None, 78)	0	input_1[0]
lambda_6 (Lambda) [0]	(None, 78)	0	input_1[0]
lambda_7 (Lambda) [0]	(None, 78)	0	input_1[0]
	_		

lambda_8 (Lambda) [0]	(None,		input_1[0]
lambda_9 (Lambda) [0]	(None,	78)	input_1[0]
lambda_10 (Lambda) [0]	(None,	78) 6	input_1[0]
lambda_11 (Lambda) [0]	(None,	78) 6	input_1[0]
lambda_12 (Lambda) [0]	(None,	78) 6	) input_1[0]
lambda_13 (Lambda) [0]	(None,	78)	) input_1[0]
lambda_14 (Lambda) [0]	(None,	78)	) input_1[0]
lambda_15 (Lambda) [0]	(None,	78)	input_1[0]
lambda_16 (Lambda) [0]	(None,	78) 6	) input_1[0]
lambda_17 (Lambda) [0]	(None,	78) 6	) input_1[0]
lambda_18 (Lambda) [0]	(None,	78)	) input_1[0]
lambda_19 (Lambda) [0]	(None,	78)	) input_1[0]
lambda_20 (Lambda) [0]	(None,	78)	) input_1[0]
lambda_21 (Lambda) [0]	(None,	78)	) input_1[0]
lambda_22 (Lambda)	(None,	78) 6	input_1[0]

[0]

lambda_23 (Lambda) [0]	(None, 78)	0	input_1[0]
lambda_24 (Lambda) [0]	(None, 78)	0	input_1[0]
lambda_25 (Lambda) [0]	(None, 78)	0	input_1[0]
lambda_26 (Lambda) [0]	(None, 78)	0	input_1[0]
lambda_27 (Lambda) [0]	(None, 78)	0	input_1[0]
lambda_28 (Lambda) [0]	(None, 78)	0	input_1[0]
lambda_29 (Lambda) [0]	(None, 78)	0	input_1[0]
lambda_30 (Lambda) [0]	(None, 78)	0	input_1[0]
dense_1 (Dense) [0]	(None, 78)	5070	lstm_1[0]
[0]			lstm_1[1]
[0]			lstm_1[2]
[0]			lstm_1[3]
[0]			lstm_1[4]
[0]			lstm_1[5]
[0]			lstm_1[6]
[0]			lstm_1[7]
[0]			lstm_1[8]
[0]			lstm_1[9]
[0]			lstm_1[10]

Impr	ovise_a_Jazz_Solo_with_an_LSTM_Network_v3a
ומן	lstm_1[11]
[0]	lstm_1[12]
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[0]	lstm_1[15]
[0]	lstm_1[16]
[0]	lstm_1[17]
[0]	lstm_1[18]
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[0]	lstm_1[20]
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[0]	lstm_1[21]
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[0]	lstm_1[24]
[0]	lstm_1[25]
[0]	lstm_1[26]
[0]	lstm_1[27]
	lstm_1[28]
[0]	lstm_1[29]
[0]	
Total params: 41,678 Trainable params: 41,678 Non-trainable params: 0	

# **Expected Output**

Scroll to the bottom of the output, and you'll see the following:

Total params: 41,678 Trainable params: 41,678 Non-trainable params: 0

#### Compile the model for training

- You now need to compile your model to be trained.
- · We will use:
  - optimizer: Adam optimizer
  - Loss function: categorical cross-entropy (for multi-class classification)

```
In [10]: opt = Adam(lr=0.01, beta_1=0.9, beta_2=0.999, decay=0.01)
    model.compile(optimizer=opt, loss='categorical_crossentropy', metrics=['accura cy'])
```

#### Initialize hidden state and cell state

Finally, let's initialize a0 and c0 for the LSTM's initial state to be zero.

#### Train the model

- · Lets now fit the model!
- We will turn Y into a list, since the cost function expects Y to be provided in this format
  - list(Y) is a list with 30 items, where each of the list items is of shape (60,78).
  - Lets train for 100 epochs. This will take a few minutes.

In [12]: model.fit([X, a0, c0], list(Y), epochs=100)

```
Epoch 1/100
1: 4.3550 - dense 1 loss 2: 4.3505 - dense 1 loss 3: 4.3415 - dense 1 loss 4:
4.3443 - dense 1 loss 5: 4.3433 - dense 1 loss 6: 4.3397 - dense 1 loss 7: 4.
3413 - dense_1_loss_8: 4.3350 - dense_1_loss_9: 4.3338 - dense_1_loss_10: 4.3
403 - dense_1_loss_11: 4.3422 - dense_1_loss_12: 4.3407 - dense_1_loss_13: 4.
3351 - dense_1_loss_14: 4.3253 - dense_1_loss_15: 4.3342 - dense_1_loss_16:
4.3308 - dense 1 loss 17: 4.3422 - dense 1 loss 18: 4.3301 - dense 1 loss 19:
4.3327 - dense_1_loss_20: 4.3399 - dense_1_loss_21: 4.3351 - dense_1_loss_22:
4.3364 - dense 1 loss 23: 4.3372 - dense 1 loss 24: 4.3306 - dense 1 loss 25:
4.3401 - dense_1_loss_26: 4.3335 - dense_1_loss_27: 4.3362 - dense_1_loss_28:
4.3380 - dense_1_loss_29: 4.3351 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.0000e+00 - dense 1 acc 2: 0.0500 - dense 1 acc 3: 0.1000 - dense 1 acc
4: 0.0833 - dense_1_acc_5: 0.0500 - dense_1_acc_6: 0.0167 - dense_1_acc_7: 0.
0833 - dense 1 acc 8: 0.0667 - dense 1 acc 9: 0.0500 - dense 1 acc 10: 0.0833
- dense_1_acc_11: 0.0667 - dense_1_acc_12: 0.0833 - dense_1_acc_13: 0.0833 -
dense_1_acc_14: 0.1333 - dense_1_acc_15: 0.0500 - dense_1_acc_16: 0.0833 - de
nse_1_acc_17: 0.0667 - dense_1_acc_18: 0.0833 - dense_1_acc_19: 0.0333 - dens
e_1_acc_20: 0.0000e+00 - dense_1_acc_21: 0.0833 - dense_1_acc_22: 0.0333 - de
nse 1 acc 23: 0.0500 - dense 1 acc 24: 0.1000 - dense 1 acc 25: 0.0667 - dens
e_1_acc_26: 0.1000 - dense_1_acc_27: 0.0667 - dense_1_acc_28: 0.0667 - dense_
1_acc_29: 0.1000 - dense_1_acc_30: 0.0000e+00
Epoch 2/100
1: 4.3353 - dense_1_loss_2: 4.3115 - dense_1_loss_3: 4.2836 - dense_1_loss_4:
4.2866 - dense_1_loss_5: 4.2690 - dense_1_loss_6: 4.2659 - dense_1_loss_7: 4.
2621 - dense 1 loss 8: 4.2378 - dense 1 loss 9: 4.2513 - dense 1 loss 10: 4.2
479 - dense_1_loss_11: 4.2437 - dense_1_loss_12: 4.2572 - dense_1_loss_13: 4.
2270 - dense 1 loss 14: 4.2050 - dense 1 loss 15: 4.2221 - dense 1 loss 16:
4.2203 - dense_1_loss_17: 4.2339 - dense_1_loss_18: 4.2311 - dense_1_loss_19:
4.2139 - dense_1_loss_20: 4.2365 - dense_1_loss_21: 4.2122 - dense_1_loss_22:
4.2088 - dense 1 loss 23: 4.2314 - dense 1 loss 24: 4.2273 - dense 1 loss 25:
4.2409 - dense_1_loss_26: 4.1821 - dense_1_loss_27: 4.2112 - dense_1_loss_28:
4.2135 - dense_1_loss_29: 4.2192 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.1000 - dense_1_acc_2: 0.1667 - dense_1_acc_3: 0.2000 - dense_1_acc_4: 0.
1000 - dense_1_acc_5: 0.2333 - dense_1_acc_6: 0.1000 - dense_1_acc_7: 0.0833
- dense_1_acc_8: 0.2333 - dense_1_acc_9: 0.1500 - dense_1_acc_10: 0.1833 - de
nse_1_acc_11: 0.2167 - dense_1_acc_12: 0.1500 - dense_1_acc_13: 0.3167 - dens
e 1 acc 14: 0.2833 - dense 1 acc 15: 0.1833 - dense 1 acc 16: 0.1500 - dense
1_acc_17: 0.2000 - dense_1_acc_18: 0.1833 - dense_1_acc_19: 0.2000 - dense_1_
acc_20: 0.0833 - dense_1_acc_21: 0.1500 - dense_1_acc_22: 0.1333 - dense_1_ac
c_23: 0.0833 - dense_1_acc_24: 0.0833 - dense_1_acc_25: 0.1500 - dense_1_acc_
26: 0.2000 - dense_1_acc_27: 0.1000 - dense_1_acc_28: 0.2000 - dense_1_acc_2
9: 0.1333 - dense_1_acc_30: 0.0000e+00
Epoch 3/100
1: 4.3148 - dense_1_loss_2: 4.2639 - dense_1_loss_3: 4.2044 - dense_1_loss_4:
4.1946 - dense_1_loss_5: 4.1513 - dense_1_loss_6: 4.1503 - dense_1_loss_7: 4.
1318 - dense_1_loss_8: 4.0400 - dense_1_loss_9: 4.0388 - dense_1_loss_10: 4.0
024 - dense_1_loss_11: 3.9971 - dense_1_loss_12: 4.1153 - dense_1_loss_13: 3.
9722 - dense 1 loss 14: 3.9035 - dense 1 loss 15: 4.0132 - dense 1 loss 16:
3.9911 - dense_1_loss_17: 4.0067 - dense_1_loss_18: 4.0385 - dense_1_loss_19:
3.8915 - dense_1_loss_20: 4.0074 - dense_1_loss_21: 3.9149 - dense_1_loss_22:
3.8929 - dense 1 loss 23: 4.0232 - dense 1 loss 24: 3.9834 - dense 1 loss 25:
4.1484 - dense_1_loss_26: 3.7872 - dense_1_loss_27: 3.9410 - dense_1_loss_28:
3.9477 - dense 1 loss 29: 4.1115 - dense 1 loss 30: 0.0000e+00 - dense 1 acc
1: 0.1000 - dense_1_acc_2: 0.2333 - dense_1_acc_3: 0.3000 - dense_1_acc_4: 0.
```

```
2333 - dense 1 acc 5: 0.3000 - dense 1 acc 6: 0.1667 - dense 1 acc 7: 0.1000
- dense_1_acc_8: 0.3167 - dense_1_acc_9: 0.1333 - dense_1_acc_10: 0.1167 - de
nse_1_acc_11: 0.1167 - dense_1_acc_12: 0.1000 - dense_1_acc_13: 0.1833 - dens
e_1_acc_14: 0.1833 - dense_1_acc_15: 0.1500 - dense_1_acc_16: 0.1167 - dense_
1 acc 17: 0.1500 - dense 1 acc 18: 0.1167 - dense 1 acc 19: 0.1167 - dense 1
acc_20: 0.1000 - dense_1_acc_21: 0.0667 - dense_1_acc_22: 0.1333 - dense_1_ac
c_23: 0.0833 - dense_1_acc_24: 0.0500 - dense_1_acc_25: 0.1167 - dense_1_acc_
26: 0.1000 - dense_1_acc_27: 0.1167 - dense_1_acc_28: 0.0833 - dense_1_acc_2
9: 0.0667 - dense_1_acc_30: 0.0000e+00
Epoch 4/100
1: 4.2933 - dense_1_loss_2: 4.2156 - dense_1_loss_3: 4.1133 - dense_1_loss_4:
4.0953 - dense 1 loss 5: 3.9997 - dense 1 loss 6: 3.9893 - dense 1 loss 7: 3.
9578 - dense_1_loss_8: 3.7337 - dense_1_loss_9: 3.8315 - dense_1_loss_10: 3.7
272 - dense_1_loss_11: 3.8500 - dense_1_loss_12: 4.0345 - dense_1_loss_13: 3.
8292 - dense 1 loss 14: 3.7057 - dense 1 loss 15: 3.8429 - dense 1 loss 16:
3.8307 - dense 1 loss 17: 3.9169 - dense 1 loss 18: 3.9196 - dense 1 loss 19:
3.7700 - dense_1_loss_20: 3.9999 - dense_1_loss_21: 3.9471 - dense_1_loss_22:
3.8862 - dense 1 loss 23: 3.9118 - dense 1 loss 24: 3.8174 - dense 1 loss 25:
4.1005 - dense_1_loss_26: 3.6415 - dense_1_loss_27: 3.7387 - dense_1_loss_28:
3.8986 - dense_1_loss_29: 3.9914 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.1000 - dense 1 acc 2: 0.1333 - dense 1 acc 3: 0.3000 - dense 1 acc 4: 0.
2000 - dense 1 acc 5: 0.2667 - dense 1 acc 6: 0.1333 - dense 1 acc 7: 0.1000
- dense_1_acc_8: 0.2000 - dense_1_acc_9: 0.0667 - dense_1_acc_10: 0.0833 - de
nse_1_acc_11: 0.0833 - dense_1_acc_12: 0.0667 - dense_1_acc_13: 0.0833 - dens
e_1_acc_14: 0.0833 - dense_1_acc_15: 0.0667 - dense_1_acc_16: 0.1000 - dense_
1_acc_17: 0.1167 - dense_1_acc_18: 0.0500 - dense_1_acc_19: 0.0500 - dense_1_
acc_20: 0.1000 - dense_1_acc_21: 0.0833 - dense_1_acc_22: 0.0500 - dense_1_ac
c 23: 0.0333 - dense 1 acc 24: 0.0167 - dense 1 acc 25: 0.0833 - dense 1 acc
26: 0.1167 - dense_1_acc_27: 0.0667 - dense_1_acc_28: 0.0667 - dense_1_acc_2
9: 0.1167 - dense_1_acc_30: 0.0000e+00
Epoch 5/100
1: 4.2777 - dense 1 loss 2: 4.1752 - dense 1 loss 3: 4.0463 - dense 1 loss 4:
4.0253 - dense 1 loss 5: 3.9058 - dense 1 loss 6: 3.9159 - dense 1 loss 7: 3.
8553 - dense_1_loss_8: 3.6393 - dense_1_loss_9: 3.7460 - dense_1_loss_10: 3.5
996 - dense_1_loss_11: 3.7224 - dense_1_loss_12: 3.9381 - dense_1_loss_13: 3.
7123 - dense_1_loss_14: 3.6180 - dense_1_loss_15: 3.7221 - dense_1_loss_16:
3.7354 - dense 1 loss 17: 3.8055 - dense 1 loss 18: 3.8023 - dense 1 loss 19:
3.6501 - dense_1_loss_20: 3.8299 - dense_1_loss_21: 3.8244 - dense_1_loss_22:
3.7239 - dense 1 loss 23: 3.7177 - dense 1 loss 24: 3.6756 - dense 1 loss 25:
3.8837 - dense_1_loss_26: 3.5803 - dense_1_loss_27: 3.6914 - dense_1_loss_28:
3.7354 - dense_1_loss_29: 3.9519 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.1000 - dense 1 acc 2: 0.1500 - dense 1 acc 3: 0.1667 - dense 1 acc 4: 0.
1667 - dense_1_acc_5: 0.1333 - dense_1_acc_6: 0.0500 - dense_1_acc_7: 0.1000
- dense 1 acc 8: 0.1167 - dense 1 acc 9: 0.1333 - dense 1 acc 10: 0.1167 - de
nse_1_acc_11: 0.1333 - dense_1_acc_12: 0.0833 - dense_1_acc_13: 0.1667 - dens
e_1_acc_14: 0.1667 - dense_1_acc_15: 0.1333 - dense_1_acc_16: 0.0833 - dense_
1_acc_17: 0.1167 - dense_1_acc_18: 0.1167 - dense_1_acc_19: 0.1500 - dense_1_
acc_20: 0.0333 - dense_1_acc_21: 0.0667 - dense_1_acc_22: 0.1167 - dense_1_ac
c 23: 0.1000 - dense 1 acc 24: 0.0667 - dense 1 acc 25: 0.0667 - dense 1 acc
26: 0.0833 - dense_1_acc_27: 0.0833 - dense_1_acc_28: 0.0833 - dense_1_acc_2
9: 0.0500 - dense_1_acc_30: 0.0000e+00
Epoch 6/100
1: 4.2623 - dense_1_loss_2: 4.1378 - dense_1_loss_3: 3.9800 - dense_1_loss_4:
3.9652 - dense_1_loss_5: 3.8447 - dense_1_loss_6: 3.8569 - dense_1_loss_7: 3.
```

```
7717 - dense 1 loss 8: 3.5806 - dense 1 loss 9: 3.6579 - dense 1 loss 10: 3.5
074 - dense_1_loss_11: 3.6369 - dense_1_loss_12: 3.8306 - dense_1_loss_13: 3.
5922 - dense 1 loss 14: 3.5595 - dense 1 loss 15: 3.6018 - dense 1 loss 16:
3.6032 - dense_1_loss_17: 3.6595 - dense_1_loss_18: 3.6746 - dense_1_loss_19:
3.5748 - dense 1 loss 20: 3.7540 - dense 1 loss 21: 3.7816 - dense 1 loss 22:
3.6273 - dense_1_loss_23: 3.5806 - dense_1_loss_24: 3.5104 - dense_1_loss_25:
3.7559 - dense_1_loss_26: 3.4708 - dense_1_loss_27: 3.5423 - dense_1_loss_28:
3.5951 - dense_1_loss_29: 3.7184 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.1000 - dense_1_acc_2: 0.1000 - dense_1_acc_3: 0.1167 - dense_1_acc_4: 0.
1667 - dense 1 acc 5: 0.1167 - dense 1 acc 6: 0.0500 - dense 1 acc 7: 0.0833
- dense_1_acc_8: 0.0833 - dense_1_acc_9: 0.1333 - dense_1_acc_10: 0.1000 - de
nse_1_acc_11: 0.0833 - dense_1_acc_12: 0.0333 - dense_1_acc_13: 0.1000 - dens
e 1 acc 14: 0.1167 - dense 1 acc 15: 0.1333 - dense 1 acc 16: 0.1333 - dense
1_acc_17: 0.1333 - dense_1_acc_18: 0.0667 - dense_1_acc_19: 0.1667 - dense_1_
acc_20: 0.0833 - dense_1_acc_21: 0.0833 - dense_1_acc_22: 0.1333 - dense_1_ac
c_23: 0.1333 - dense_1_acc_24: 0.1333 - dense_1_acc_25: 0.0333 - dense_1_acc_
26: 0.1833 - dense_1_acc_27: 0.1333 - dense_1_acc_28: 0.1333 - dense_1_acc_2
9: 0.0500 - dense_1_acc_30: 0.0000e+00
Epoch 7/100
1: 4.2481 - dense_1_loss_2: 4.1021 - dense_1_loss_3: 3.9111 - dense_1_loss_4:
3.8913 - dense 1 loss 5: 3.7593 - dense 1 loss 6: 3.7843 - dense 1 loss 7: 3.
6930 - dense_1_loss_8: 3.4738 - dense_1_loss_9: 3.5523 - dense_1_loss_10: 3.3
881 - dense_1_loss_11: 3.4991 - dense_1_loss_12: 3.7033 - dense_1_loss_13: 3.
4376 - dense_1_loss_14: 3.3692 - dense_1_loss_15: 3.4638 - dense_1_loss_16:
3.4417 - dense_1_loss_17: 3.5129 - dense_1_loss_18: 3.5499 - dense_1_loss_19:
3.3715 - dense_1_loss_20:    3.5536 - dense_1_loss_21:    3.6625 - dense_1_loss_22:
3.4538 - dense_1_loss_23: 3.4741 - dense_1_loss_24: 3.4344 - dense_1_loss_25:
3.5815 - dense 1 loss 26: 3.3042 - dense 1 loss 27: 3.4184 - dense 1 loss 28:
3.4084 - dense_1_loss_29: 3.6206 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.1000 - dense_1_acc_2: 0.0833 - dense_1_acc_3: 0.1167 - dense_1_acc_4: 0.
1667 - dense_1_acc_5: 0.1167 - dense_1_acc_6: 0.0500 - dense_1_acc_7: 0.1167
- dense_1_acc_8: 0.1333 - dense_1_acc_9: 0.1667 - dense_1_acc_10: 0.1500 - de
nse_1_acc_11: 0.1167 - dense_1_acc_12: 0.0333 - dense_1_acc_13: 0.1667 - dens
e 1 acc 14: 0.1667 - dense 1 acc 15: 0.2167 - dense 1 acc 16: 0.1667 - dense
1_acc_17: 0.1167 - dense_1_acc_18: 0.1167 - dense_1_acc_19: 0.1667 - dense_1_
acc_20: 0.1000 - dense_1_acc_21: 0.1000 - dense_1_acc_22: 0.1667 - dense_1_ac
c_23: 0.2000 - dense_1_acc_24: 0.1167 - dense_1_acc_25: 0.0333 - dense_1_acc_
26: 0.2333 - dense_1_acc_27: 0.1333 - dense_1_acc_28: 0.1500 - dense_1_acc_2
9: 0.0667 - dense_1_acc_30: 0.0000e+00
Epoch 8/100
1: 4.2338 - dense_1_loss_2: 4.0595 - dense_1_loss_3: 3.8361 - dense_1_loss_4:
3.7986 - dense 1 loss 5: 3.6524 - dense 1 loss 6: 3.6771 - dense 1 loss 7: 3.
5889 - dense_1_loss_8: 3.3358 - dense_1_loss_9: 3.3973 - dense_1_loss_10: 3.2
477 - dense 1 loss 11: 3.3641 - dense 1 loss 12: 3.5477 - dense 1 loss 13: 3.
2678 - dense_1_loss_14: 3.2139 - dense_1_loss_15: 3.3523 - dense_1_loss_16:
3.3094 - dense 1 loss 17: 3.3340 - dense 1 loss 18: 3.3661 - dense 1 loss 19:
3.2778 - dense_1_loss_20: 3.4314 - dense_1_loss_21: 3.4990 - dense_1_loss_22:
3.3007 - dense_1_loss_23: 3.3800 - dense_1_loss_24: 3.2438 - dense_1_loss_25:
3.4435 - dense 1 loss 26: 3.2016 - dense 1 loss 27: 3.2611 - dense 1 loss 28:
3.2960 - dense_1_loss_29: 3.4970 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.1000 - dense_1_acc_2: 0.1000 - dense_1_acc_3: 0.1500 - dense_1_acc_4: 0.
1667 - dense 1 acc 5: 0.1167 - dense 1 acc 6: 0.0500 - dense 1 acc 7: 0.1167
- dense_1_acc_8: 0.2333 - dense_1_acc_9: 0.1833 - dense_1_acc_10: 0.1500 - de
nse_1_acc_11: 0.1500 - dense_1_acc_12: 0.0667 - dense_1_acc_13: 0.1667 - dens
e_1_acc_14: 0.2000 - dense_1_acc_15: 0.2167 - dense_1_acc_16: 0.1500 - dense_
```

```
1 acc 17: 0.1333 - dense 1 acc 18: 0.1167 - dense 1 acc 19: 0.2000 - dense 1
acc_20: 0.1000 - dense_1_acc_21: 0.1000 - dense_1_acc_22: 0.2167 - dense_1_ac
c_23: 0.1500 - dense_1_acc_24: 0.1500 - dense_1_acc_25: 0.1000 - dense_1_acc_
26: 0.2167 - dense_1_acc_27: 0.1500 - dense_1_acc_28: 0.1333 - dense_1_acc_2
9: 0.1000 - dense 1 acc 30: 0.0000e+00
Epoch 9/100
60/60 [=================== ] - 0s - loss: 96.3898 - dense 1 loss 1:
4.2212 - dense_1_loss_2: 4.0203 - dense_1_loss_3: 3.7572 - dense_1_loss_4: 3.
7160 - dense_1_loss_5: 3.5477 - dense_1_loss_6: 3.5599 - dense_1_loss_7: 3.47
93 - dense 1 loss 8: 3.2026 - dense 1 loss 9: 3.2595 - dense 1 loss 10: 3.116
5 - dense_1_loss_11: 3.2265 - dense_1_loss_12: 3.3305 - dense_1_loss_13: 3.10
03 - dense_1_loss_14: 3.0522 - dense_1_loss_15: 3.2131 - dense_1_loss_16: 3.2
189 - dense_1_loss_17: 3.2356 - dense_1_loss_18: 3.1584 - dense_1_loss_19: 3.
1201 - dense_1_loss_20: 3.2877 - dense_1_loss_21: 3.3202 - dense_1_loss_22:
3.0482 - dense_1_loss_23: 3.2122 - dense_1_loss_24: 3.0990 - dense_1_loss_25:
3.3230 - dense_1_loss_26: 3.0233 - dense_1_loss_27: 3.1221 - dense_1_loss_28:
3.1388 - dense 1 loss 29: 3.2795 - dense 1 loss 30: 0.0000e+00 - dense 1 acc
1: 0.1000 - dense_1_acc_2: 0.1333 - dense_1_acc_3: 0.2000 - dense_1_acc_4: 0.
1833 - dense 1 acc 5: 0.2167 - dense 1 acc 6: 0.1000 - dense 1 acc 7: 0.1167
- dense_1_acc_8: 0.2667 - dense_1_acc_9: 0.1667 - dense_1_acc_10: 0.2000 - de
nse_1_acc_11: 0.2000 - dense_1_acc_12: 0.1167 - dense_1_acc_13: 0.2167 - dens
e 1 acc 14: 0.2500 - dense 1 acc 15: 0.2333 - dense 1 acc 16: 0.1167 - dense
1 acc 17: 0.1333 - dense 1 acc 18: 0.2000 - dense 1 acc 19: 0.2500 - dense 1
acc_20: 0.1000 - dense_1_acc_21: 0.1333 - dense_1_acc_22: 0.2333 - dense_1_ac
c_23: 0.1500 - dense_1_acc_24: 0.1500 - dense_1_acc_25: 0.1167 - dense_1_acc_
26: 0.2167 - dense_1_acc_27: 0.1333 - dense_1_acc_28: 0.1500 - dense_1_acc_2
9: 0.1333 - dense_1_acc_30: 0.0000e+00
Epoch 10/100
4.2088 - dense_1_loss_2: 3.9804 - dense_1_loss_3: 3.6819 - dense_1_loss_4: 3.
6260 - dense_1_loss_5: 3.4260 - dense_1_loss_6: 3.4295 - dense_1_loss_7: 3.36
41 - dense 1 loss 8: 3.0644 - dense 1 loss 9: 3.1102 - dense 1 loss 10: 2.993
8 - dense_1_loss_11: 3.0993 - dense_1_loss_12: 3.1710 - dense_1_loss_13: 2.94
77 - dense 1 loss 14: 2.8889 - dense 1 loss 15: 3.0776 - dense 1 loss 16: 3.1
083 - dense_1_loss_17: 2.9841 - dense_1_loss_18: 2.9886 - dense_1_loss_19: 2.
9670 - dense 1 loss 20: 3.0925 - dense 1 loss 21: 3.1788 - dense 1 loss 22:
2.9313 - dense_1_loss_23: 3.0844 - dense_1_loss_24: 2.9784 - dense_1_loss_25:
3.1734 - dense_1_loss_26: 2.8080 - dense_1_loss_27: 2.9992 - dense_1_loss_28:
2.9766 - dense_1_loss_29: 3.0861 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.1000 - dense_1_acc_2: 0.1500 - dense_1_acc_3: 0.2667 - dense_1_acc_4: 0.
2000 - dense 1 acc 5: 0.2500 - dense 1 acc 6: 0.1167 - dense 1 acc 7: 0.1333
- dense_1_acc_8: 0.2500 - dense_1_acc_9: 0.1500 - dense_1_acc_10: 0.1667 - de
nse_1_acc_11: 0.2000 - dense_1_acc_12: 0.1333 - dense_1_acc_13: 0.1833 - dens
e_1_acc_14: 0.2333 - dense_1_acc_15: 0.2333 - dense_1_acc_16: 0.1833 - dense_
1_acc_17: 0.2000 - dense_1_acc_18: 0.1500 - dense_1_acc_19: 0.2333 - dense_1_
acc_20: 0.2000 - dense_1_acc_21: 0.1667 - dense_1_acc_22: 0.1500 - dense_1_ac
c_23: 0.1667 - dense_1_acc_24: 0.1667 - dense_1_acc_25: 0.1500 - dense_1_acc_
26: 0.2667 - dense_1_acc_27: 0.1167 - dense_1_acc_28: 0.2000 - dense_1_acc_2
9: 0.2000 - dense_1_acc_30: 0.0000e+00
Epoch 11/100
60/60 [========================== ] - 0s - loss: 88.0452 - dense 1 loss 1:
4.1960 - dense_1_loss_2: 3.9379 - dense_1_loss_3: 3.6031 - dense_1_loss_4: 3.
5294 - dense_1_loss_5: 3.3034 - dense_1_loss_6: 3.2930 - dense_1_loss_7: 3.22
86 - dense 1 loss 8: 2.9007 - dense 1 loss 9: 2.9664 - dense 1 loss 10: 2.817
4 - dense_1_loss_11: 2.9562 - dense_1_loss_12: 2.9921 - dense_1_loss_13: 2.80
57 - dense_1_loss_14: 2.7085 - dense_1_loss_15: 2.8931 - dense_1_loss_16: 2.9
244 - dense_1_loss_17: 2.7835 - dense_1_loss_18: 2.8193 - dense_1_loss_19: 2.
```

```
7724 - dense 1 loss 20: 2.9217 - dense 1 loss 21: 3.0353 - dense 1 loss 22:
2.7009 - dense_1_loss_23: 2.9431 - dense_1_loss_24: 2.8840 - dense_1_loss_25:
2.9735 - dense 1 loss 26: 2.6568 - dense 1 loss 27: 2.8066 - dense 1 loss 28:
2.7752 - dense_1_loss_29: 2.9169 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.1000 - dense 1 acc 2: 0.1333 - dense 1 acc 3: 0.2667 - dense 1 acc 4: 0.
2000 - dense_1_acc_5: 0.2667 - dense_1_acc_6: 0.1167 - dense_1_acc_7: 0.1167
- dense_1_acc_8: 0.2333 - dense_1_acc_9: 0.1667 - dense_1_acc_10: 0.1833 - de
nse_1_acc_11: 0.2167 - dense_1_acc_12: 0.1667 - dense_1_acc_13: 0.2500 - dens
e_1_acc_14: 0.2500 - dense_1_acc_15: 0.2167 - dense_1_acc_16: 0.2167 - dense_
1 acc 17: 0.2333 - dense 1 acc 18: 0.2833 - dense 1 acc 19: 0.2500 - dense 1
acc 20: 0.2667 - dense 1 acc 21: 0.2500 - dense 1 acc 22: 0.1833 - dense 1 ac
c_23: 0.2167 - dense_1_acc_24: 0.1833 - dense_1_acc_25: 0.1833 - dense_1_acc_
26: 0.3000 - dense 1 acc 27: 0.2167 - dense 1 acc 28: 0.3000 - dense 1 acc 2
9: 0.2000 - dense_1_acc_30: 0.0000e+00
Epoch 12/100
60/60 [========================== ] - 0s - loss: 83.7037 - dense_1_loss_1:
4.1841 - dense 1 loss 2: 3.8939 - dense 1 loss 3: 3.5231 - dense 1 loss 4: 3.
4391 - dense_1_loss_5: 3.1695 - dense_1_loss_6: 3.1402 - dense_1_loss_7: 3.09
44 - dense 1 loss 8: 2.7579 - dense 1 loss 9: 2.8015 - dense 1 loss 10: 2.665
0 - dense_1_loss_11: 2.8289 - dense_1_loss_12: 2.7766 - dense_1_loss_13: 2.59
61 - dense_1_loss_14: 2.5581 - dense_1_loss_15: 2.7746 - dense_1_loss_16: 2.7
515 - dense 1 loss 17: 2.6152 - dense 1 loss 18: 2.6657 - dense 1 loss 19: 2.
5686 - dense_1_loss_20: 2.7154 - dense_1_loss_21: 2.8143 - dense_1_loss_22:
2.5605 - dense_1_loss_23: 2.7717 - dense_1_loss_24: 2.7162 - dense_1_loss_25:
2.8451 - dense_1_loss_26: 2.4404 - dense_1_loss_27: 2.6589 - dense_1_loss_28:
2.6012 - dense_1_loss_29: 2.7760 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.1000 - dense_1_acc_2: 0.1333 - dense_1_acc_3: 0.2833 - dense_1_acc_4: 0.
2167 - dense_1_acc_5: 0.3333 - dense_1_acc_6: 0.1833 - dense_1_acc_7: 0.1500
- dense 1 acc 8: 0.2667 - dense 1 acc 9: 0.2500 - dense 1 acc 10: 0.2333 - de
nse_1_acc_11: 0.2667 - dense_1_acc_12: 0.2167 - dense_1_acc_13: 0.3667 - dens
e_1_acc_14: 0.2833 - dense_1_acc_15: 0.2333 - dense_1_acc_16: 0.2167 - dense_
1_acc_17: 0.3167 - dense_1_acc_18: 0.3000 - dense_1_acc_19: 0.2000 - dense_1_
acc_20: 0.3333 - dense_1_acc_21: 0.2833 - dense_1_acc_22: 0.2500 - dense_1_ac
c_23: 0.2167 - dense_1_acc_24: 0.2167 - dense_1_acc_25: 0.1833 - dense_1_acc_
26: 0.3667 - dense 1 acc 27: 0.1667 - dense 1 acc 28: 0.3000 - dense 1 acc 2
9: 0.2000 - dense_1_acc_30: 0.0000e+00
Epoch 13/100
60/60 [================= ] - 0s - loss: 80.0840 - dense 1 loss 1:
4.1699 - dense 1 loss 2: 3.8506 - dense 1 loss 3: 3.4436 - dense 1 loss 4: 3.
3428 - dense_1_loss_5: 3.0520 - dense_1_loss_6: 2.9908 - dense_1_loss_7: 2.94
19 - dense 1 loss 8: 2.6264 - dense 1 loss 9: 2.6738 - dense 1 loss 10: 2.506
3 - dense_1_loss_11: 2.6982 - dense_1_loss_12: 2.6397 - dense_1_loss_13: 2.41
81 - dense_1_loss_14: 2.4712 - dense_1_loss_15: 2.6456 - dense_1_loss_16: 2.5
721 - dense 1 loss 17: 2.4881 - dense 1 loss 18: 2.5720 - dense 1 loss 19: 2.
5278 - dense_1_loss_20: 2.5542 - dense_1_loss_21: 2.6520 - dense_1_loss_22:
2.4297 - dense 1 loss 23: 2.6056 - dense 1 loss 24: 2.5074 - dense 1 loss 25:
2.7063 - dense_1_loss_26: 2.3729 - dense_1_loss_27: 2.4746 - dense_1_loss_28:
2.5151 - dense_1_loss_29: 2.6353 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.1000 - dense_1_acc_2: 0.1333 - dense_1_acc_3: 0.2833 - dense_1_acc_4: 0.
2333 - dense_1_acc_5: 0.3333 - dense_1_acc_6: 0.1833 - dense_1_acc_7: 0.2333
- dense 1 acc 8: 0.3000 - dense 1 acc 9: 0.3000 - dense 1 acc 10: 0.3167 - de
nse_1_acc_11: 0.2500 - dense_1_acc_12: 0.2333 - dense_1_acc_13: 0.4333 - dens
e_1_acc_14: 0.3500 - dense_1_acc_15: 0.2667 - dense_1_acc_16: 0.2167 - dense_
1 acc 17: 0.2833 - dense 1 acc 18: 0.3167 - dense 1 acc 19: 0.1833 - dense 1
acc_20: 0.3333 - dense_1_acc_21: 0.3000 - dense_1_acc_22: 0.2333 - dense_1_ac
c_23: 0.3000 - dense_1_acc_24: 0.2500 - dense_1_acc_25: 0.2167 - dense_1_acc_
26: 0.3667 - dense_1_acc_27: 0.3000 - dense_1_acc_28: 0.3333 - dense_1_acc_2
```

```
9: 0.2500 - dense 1 acc 30: 0.0000e+00
Epoch 14/100
60/60 [========================= ] - 0s - loss: 76.0077 - dense_1_loss_1:
4.1595 - dense_1_loss_2: 3.8060 - dense_1_loss_3: 3.3595 - dense_1_loss_4: 3.
2316 - dense 1 loss 5: 2.9240 - dense 1 loss 6: 2.8441 - dense 1 loss 7: 2.83
21 - dense_1_loss_8: 2.4771 - dense_1_loss_9: 2.5307 - dense_1_loss_10: 2.351
7 - dense_1_loss_11: 2.5622 - dense_1_loss_12: 2.4664 - dense_1_loss_13: 2.22
42 - dense_1_loss_14: 2.2842 - dense_1_loss_15: 2.4608 - dense_1_loss_16: 2.4
190 - dense_1_loss_17: 2.3428 - dense_1_loss_18: 2.4016 - dense_1_loss_19: 2.
3872 - dense 1 loss 20: 2.4182 - dense 1 loss 21: 2.4519 - dense 1 loss 22:
2.2703 - dense_1_loss_23: 2.3972 - dense_1_loss_24: 2.3429 - dense_1_loss_25:
2.6392 - dense_1_loss_26: 2.2143 - dense_1_loss_27: 2.3920 - dense_1_loss_28:
2.3618 - dense 1 loss 29: 2.4553 - dense 1 loss 30: 0.0000e+00 - dense 1 acc
1: 0.1000 - dense_1_acc_2: 0.1833 - dense_1_acc_3: 0.3000 - dense_1_acc_4: 0.
2500 - dense_1_acc_5: 0.3167 - dense_1_acc_6: 0.2500 - dense_1_acc_7: 0.2500
- dense_1_acc_8: 0.3000 - dense_1_acc_9: 0.3833 - dense_1_acc_10: 0.4000 - de
nse 1 acc 11: 0.2833 - dense 1 acc 12: 0.3000 - dense 1 acc 13: 0.4500 - dens
e_1_acc_14: 0.3833 - dense_1_acc_15: 0.3000 - dense_1_acc_16: 0.3333 - dense_
1 acc 17: 0.3167 - dense 1 acc 18: 0.2833 - dense 1 acc 19: 0.2667 - dense 1
acc_20: 0.3167 - dense_1_acc_21: 0.3333 - dense_1_acc_22: 0.2000 - dense_1_ac
c_23: 0.3167 - dense_1_acc_24: 0.2667 - dense_1_acc_25: 0.1000 - dense_1_acc_
26: 0.3167 - dense 1 acc 27: 0.3333 - dense 1 acc 28: 0.3333 - dense 1 acc 2
9: 0.2500 - dense 1 acc 30: 0.0000e+00
Epoch 15/100
60/60 [========================== ] - 0s - loss: 72.4661 - dense_1_loss_1:
4.1497 - dense_1_loss_2: 3.7589 - dense_1_loss_3: 3.2742 - dense_1_loss_4: 3.
1247 - dense 1 loss 5: 2.7938 - dense 1 loss 6: 2.7050 - dense 1 loss 7: 2.68
85 - dense_1_loss_8: 2.3404 - dense_1_loss_9: 2.4147 - dense_1_loss_10: 2.263
3 - dense 1 loss 11: 2.4747 - dense 1 loss 12: 2.2919 - dense 1 loss 13: 2.09
54 - dense_1_loss_14: 2.0935 - dense_1_loss_15: 2.3405 - dense_1_loss_16: 2.3
492 - dense_1_loss_17: 2.1699 - dense_1_loss_18: 2.2416 - dense_1_loss_19: 2.
1983 - dense_1_loss_20: 2.2957 - dense_1_loss_21: 2.3119 - dense_1_loss_22:
2.1703 - dense_1_loss_23: 2.2763 - dense_1_loss_24: 2.2569 - dense_1_loss_25:
2.4898 - dense 1 loss 26: 2.1169 - dense 1 loss 27: 2.2727 - dense 1 loss 28:
2.2292 - dense_1_loss_29: 2.2781 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.1000 - dense_1_acc_2: 0.2167 - dense_1_acc_3: 0.3333 - dense_1_acc_4: 0.
2500 - dense_1_acc_5: 0.3167 - dense_1_acc_6: 0.2667 - dense_1_acc_7: 0.2500
- dense_1_acc_8: 0.3500 - dense_1_acc_9: 0.3833 - dense_1_acc_10: 0.3833 - de
nse_1_acc_11: 0.2833 - dense_1_acc_12: 0.3833 - dense_1_acc_13: 0.4333 - dens
e_1_acc_14: 0.4167 - dense_1_acc_15: 0.3000 - dense_1_acc_16: 0.3167 - dense_
1 acc 17: 0.3500 - dense 1 acc 18: 0.2833 - dense 1 acc 19: 0.3500 - dense 1
acc_20: 0.3667 - dense_1_acc_21: 0.3667 - dense_1_acc_22: 0.1833 - dense_1_ac
c_23: 0.2833 - dense_1_acc_24: 0.3000 - dense_1_acc_25: 0.2167 - dense_1_acc_
26: 0.3833 - dense 1 acc 27: 0.3167 - dense 1 acc 28: 0.3333 - dense 1 acc 2
9: 0.3500 - dense_1_acc_30: 0.0000e+00
Epoch 16/100
60/60 [========================== ] - 0s - loss: 68.5616 - dense_1_loss_1:
4.1406 - dense 1 loss 2: 3.7127 - dense 1 loss 3: 3.1898 - dense 1 loss 4: 3.
0062 - dense_1_loss_5: 2.6630 - dense_1_loss_6: 2.5759 - dense_1_loss_7: 2.55
16 - dense_1_loss_8: 2.1954 - dense_1_loss_9: 2.2985 - dense_1_loss_10: 2.146
8 - dense 1 loss 11: 2.2723 - dense 1 loss 12: 2.1576 - dense 1 loss 13: 1.94
52 - dense_1_loss_14: 1.9455 - dense_1_loss_15: 2.2193 - dense_1_loss_16: 2.2
199 - dense_1_loss_17: 2.1024 - dense_1_loss_18: 2.1286 - dense_1_loss_19: 2.
0259 - dense 1 loss 20: 2.1094 - dense 1 loss 21: 2.1667 - dense 1 loss 22:
2.0239 - dense_1_loss_23: 2.0709 - dense_1_loss_24: 2.0782 - dense_1_loss_25:
2.2995 - dense_1_loss_26: 2.0006 - dense_1_loss_27: 2.1174 - dense_1_loss_28:
2.0614 - dense_1_loss_29: 2.1365 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
```

```
1: 0.0667 - dense 1 acc 2: 0.2333 - dense 1 acc 3: 0.3667 - dense 1 acc 4: 0.
2667 - dense_1_acc_5: 0.3833 - dense_1_acc_6: 0.3000 - dense_1_acc_7: 0.2667
- dense 1 acc 8: 0.3333 - dense 1 acc 9: 0.3833 - dense 1 acc 10: 0.4167 - de
nse_1_acc_11: 0.3167 - dense_1_acc_12: 0.3833 - dense_1_acc_13: 0.4667 - dens
e_1_acc_14: 0.5000 - dense_1_acc_15: 0.2833 - dense_1_acc_16: 0.3333 - dense_
1_acc_17: 0.3500 - dense_1_acc_18: 0.3333 - dense_1_acc_19: 0.4167 - dense_1_
acc_20: 0.4167 - dense_1_acc_21: 0.3333 - dense_1_acc_22: 0.2667 - dense_1_ac
c_23: 0.4000 - dense_1_acc_24: 0.3000 - dense_1_acc_25: 0.2667 - dense_1_acc_
26: 0.5167 - dense_1_acc_27: 0.4333 - dense_1_acc_28: 0.4167 - dense_1_acc_2
9: 0.3833 - dense 1 acc 30: 0.0000e+00
Epoch 17/100
4.1335 - dense 1 loss 2: 3.6630 - dense 1 loss 3: 3.1027 - dense 1 loss 4: 2.
8943 - dense_1_loss_5: 2.5344 - dense_1_loss_6: 2.4306 - dense_1_loss_7: 2.39
19 - dense_1_loss_8: 2.0744 - dense_1_loss_9: 2.1910 - dense_1_loss_10: 2.014
7 - dense_1_loss_11: 2.1702 - dense_1_loss_12: 2.0041 - dense_1_loss_13: 1.82
97 - dense 1 loss 14: 1.8178 - dense 1 loss 15: 2.1143 - dense 1 loss 16: 2.0
548 - dense_1_loss_17: 1.9630 - dense_1_loss_18: 1.9577 - dense_1_loss_19: 1.
8875 - dense 1 loss 20: 1.9125 - dense 1 loss 21: 1.9879 - dense 1 loss 22:
1.9077 - dense_1_loss_23: 1.9630 - dense_1_loss_24: 1.9141 - dense_1_loss_25:
2.1558 - dense_1_loss_26: 1.8439 - dense_1_loss_27: 2.0062 - dense_1_loss_28:
1.9076 - dense 1 loss 29: 2.0461 - dense 1 loss 30: 0.0000e+00 - dense 1 acc
1: 0.0667 - dense 1 acc 2: 0.2167 - dense 1 acc 3: 0.3667 - dense 1 acc 4: 0.
2667 - dense_1_acc_5: 0.4333 - dense_1_acc_6: 0.3167 - dense_1_acc_7: 0.3167
- dense_1_acc_8: 0.4333 - dense_1_acc_9: 0.4000 - dense_1_acc_10: 0.4167 - de
nse_1_acc_11: 0.3500 - dense_1_acc_12: 0.5000 - dense_1_acc_13: 0.5000 - dens
e_1_acc_14: 0.4833 - dense_1_acc_15: 0.3333 - dense_1_acc_16: 0.3167 - dense_
1_acc_17: 0.3833 - dense_1_acc_18: 0.3500 - dense_1_acc_19: 0.4667 - dense_1_
acc 20: 0.5167 - dense 1 acc 21: 0.3500 - dense 1 acc 22: 0.3500 - dense 1 ac
c_23: 0.3333 - dense_1_acc_24: 0.4167 - dense_1_acc_25: 0.3167 - dense_1_acc_
26: 0.5167 - dense_1_acc_27: 0.4333 - dense_1_acc_28: 0.4833 - dense_1_acc_2
9: 0.4000 - dense 1 acc 30: 0.0000e+00
Epoch 18/100
60/60 [================= ] - 0s - loss: 61.2310 - dense 1 loss 1:
4.1258 - dense 1 loss 2: 3.6114 - dense 1 loss 3: 3.0226 - dense 1 loss 4: 2.
7634 - dense_1_loss_5: 2.4097 - dense_1_loss_6: 2.2965 - dense_1_loss_7: 2.23
64 - dense_1_loss_8: 1.9414 - dense_1_loss_9: 2.0630 - dense_1_loss_10: 1.874
3 - dense_1_loss_11: 2.0705 - dense_1_loss_12: 1.8544 - dense_1_loss_13: 1.70
45 - dense_1_loss_14: 1.6752 - dense_1_loss_15: 1.9636 - dense_1_loss_16: 1.9
040 - dense_1_loss_17: 1.8361 - dense_1_loss_18: 1.8014 - dense_1_loss_19: 1.
7458 - dense 1 loss 20: 1.7856 - dense 1 loss 21: 1.8406 - dense 1 loss 22:
1.7996 - dense_1_loss_23: 1.8402 - dense_1_loss_24: 1.7975 - dense_1_loss_25:
2.0001 - dense_1_loss_26: 1.7316 - dense_1_loss_27: 1.8671 - dense_1_loss_28:
1.7649 - dense_1_loss_29: 1.9033 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.0667 - dense_1_acc_2: 0.2167 - dense_1_acc_3: 0.3667 - dense_1_acc_4: 0.
2667 - dense 1 acc 5: 0.4333 - dense 1 acc 6: 0.3667 - dense 1 acc 7: 0.3500
- dense_1_acc_8: 0.4667 - dense_1_acc_9: 0.4667 - dense_1_acc_10: 0.4833 - de
nse 1 acc 11: 0.3333 - dense 1 acc 12: 0.6000 - dense 1 acc 13: 0.5333 - dens
e_1_acc_14: 0.5000 - dense_1_acc_15: 0.4000 - dense_1_acc_16: 0.3833 - dense_
1_acc_17: 0.4333 - dense_1_acc_18: 0.4667 - dense_1_acc_19: 0.5333 - dense_1_
acc 20: 0.5500 - dense 1 acc 21: 0.4833 - dense 1 acc 22: 0.4333 - dense 1 ac
c_23: 0.4833 - dense_1_acc_24: 0.4667 - dense_1_acc_25: 0.3667 - dense_1_acc_
26: 0.5167 - dense_1_acc_27: 0.4167 - dense_1_acc_28: 0.5333 - dense_1_acc_2
9: 0.4833 - dense 1 acc 30: 0.0000e+00
Epoch 19/100
60/60 [========================== ] - 0s - loss: 58.0126 - dense_1_loss_1:
4.1171 - dense_1_loss_2: 3.5625 - dense_1_loss_3: 2.9339 - dense_1_loss_4: 2.
```

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6346 - dense 1 loss 5: 2.2950 - dense 1 loss 6: 2.1766 - dense 1 loss 7: 2.10
69 - dense_1_loss_8: 1.8077 - dense_1_loss_9: 1.9164 - dense_1_loss_10: 1.754
8 - dense_1_loss_11: 1.8973 - dense_1_loss_12: 1.7197 - dense_1_loss_13: 1.58
93 - dense_1_loss_14: 1.5811 - dense_1_loss_15: 1.8368 - dense_1_loss_16: 1.7
963 - dense 1 loss 17: 1.7443 - dense 1 loss 18: 1.7415 - dense 1 loss 19: 1.
6627 - dense_1_loss_20: 1.6626 - dense_1_loss_21: 1.7058 - dense_1_loss_22:
1.7043 - dense 1 loss 23: 1.6644 - dense 1 loss 24: 1.6410 - dense 1 loss 25:
1.8921 - dense_1_loss_26: 1.6814 - dense_1_loss_27: 1.7332 - dense_1_loss_28:
1.6528 - dense_1_loss_29: 1.8007 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.0667 - dense 1 acc 2: 0.2167 - dense 1 acc 3: 0.3833 - dense 1 acc 4: 0.
2833 - dense 1 acc 5: 0.4500 - dense 1 acc 6: 0.4667 - dense 1 acc 7: 0.4667
- dense_1_acc_8: 0.4500 - dense_1_acc_9: 0.5000 - dense_1_acc_10: 0.5333 - de
nse_1_acc_11: 0.3333 - dense_1_acc_12: 0.6500 - dense_1_acc_13: 0.5833 - dens
e_1_acc_14: 0.5500 - dense_1_acc_15: 0.4167 - dense_1_acc_16: 0.4167 - dense_
1_acc_17: 0.5667 - dense_1_acc_18: 0.5167 - dense_1_acc_19: 0.6500 - dense_1_
acc 20: 0.6333 - dense 1 acc 21: 0.5167 - dense 1 acc 22: 0.5167 - dense 1 ac
c 23: 0.5500 - dense 1 acc 24: 0.5500 - dense 1 acc 25: 0.4167 - dense 1 acc
26: 0.6000 - dense_1_acc_27: 0.4833 - dense_1_acc_28: 0.5333 - dense_1_acc_2
9: 0.5167 - dense 1 acc 30: 0.0000e+00
Epoch 20/100
60/60 [========================== ] - 0s - loss: 55.0470 - dense_1_loss_1:
4.1092 - dense 1 loss 2: 3.5120 - dense 1 loss 3: 2.8467 - dense 1 loss 4: 2.
5124 - dense_1_loss_5: 2.1740 - dense_1_loss_6: 2.0536 - dense_1_loss_7: 1.96
70 - dense_1_loss_8: 1.6742 - dense_1_loss_9: 1.8251 - dense_1_loss_10: 1.607
1 - dense_1_loss_11: 1.7911 - dense_1_loss_12: 1.5924 - dense_1_loss_13: 1.47
90 - dense_1_loss_14: 1.4230 - dense_1_loss_15: 1.7036 - dense_1_loss_16: 1.6
603 - dense_1_loss_17: 1.5805 - dense_1_loss_18: 1.6103 - dense_1_loss_19: 1.
5434 - dense_1_loss_20: 1.5813 - dense_1_loss_21: 1.6663 - dense_1_loss_22:
1.5652 - dense 1 loss 23: 1.5867 - dense 1 loss 24: 1.5969 - dense 1 loss 25:
1.7913 - dense_1_loss_26: 1.5798 - dense_1_loss_27: 1.7008 - dense_1_loss_28:
1.6515 - dense_1_loss_29: 1.6621 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.0667 - dense_1_acc_2: 0.2000 - dense_1_acc_3: 0.3833 - dense_1_acc_4: 0.
3000 - dense_1_acc_5: 0.4500 - dense_1_acc_6: 0.4667 - dense_1_acc_7: 0.4667
- dense 1 acc 8: 0.5333 - dense 1 acc 9: 0.5500 - dense 1 acc 10: 0.5833 - de
nse 1 acc 11: 0.4500 - dense 1 acc 12: 0.6167 - dense 1 acc 13: 0.6667 - dens
e_1_acc_14: 0.6333 - dense_1_acc_15: 0.4833 - dense_1_acc_16: 0.4667 - dense_
1_acc_17: 0.5833 - dense_1_acc_18: 0.5500 - dense_1_acc_19: 0.6167 - dense_1_
acc_20: 0.6333 - dense_1_acc_21: 0.5167 - dense_1_acc_22: 0.5667 - dense_1_ac
c_23: 0.5500 - dense_1_acc_24: 0.5500 - dense_1_acc_25: 0.4500 - dense_1_acc_
26: 0.6333 - dense_1_acc_27: 0.5167 - dense_1_acc_28: 0.5500 - dense_1_acc_2
9: 0.6000 - dense 1 acc 30: 0.0000e+00
Epoch 21/100
4.1007 - dense 1 loss 2: 3.4616 - dense 1 loss 3: 2.7498 - dense 1 loss 4: 2.
4007 - dense_1_loss_5: 2.0617 - dense_1_loss_6: 1.9350 - dense_1_loss_7: 1.83
48 - dense 1 loss 8: 1.6134 - dense 1 loss 9: 1.6944 - dense 1 loss 10: 1.521
1 - dense_1_loss_11: 1.6731 - dense_1_loss_12: 1.4913 - dense_1_loss_13: 1.39
76 - dense_1_loss_14: 1.3537 - dense_1_loss_15: 1.5973 - dense_1_loss_16: 1.5
571 - dense_1_loss_17: 1.4632 - dense_1_loss_18: 1.5180 - dense_1_loss_19: 1.
5015 - dense_1_loss_20: 1.4419 - dense_1_loss_21: 1.5007 - dense_1_loss_22:
1.5187 - dense 1 loss 23: 1.4557 - dense 1 loss 24: 1.4549 - dense 1 loss 25:
1.6754 - dense_1_loss_26: 1.4852 - dense_1_loss_27: 1.5589 - dense_1_loss_28:
1.5260 - dense_1_loss_29: 1.5686 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.0667 - dense 1 acc 2: 0.3000 - dense 1 acc 3: 0.3833 - dense 1 acc 4: 0.
3000 - dense_1_acc_5: 0.4667 - dense_1_acc_6: 0.4833 - dense_1_acc_7: 0.5167
- dense_1_acc_8: 0.5667 - dense_1_acc_9: 0.5833 - dense_1_acc_10: 0.6333 - de
nse_1_acc_11: 0.5500 - dense_1_acc_12: 0.6833 - dense_1_acc_13: 0.7000 - dens
```

```
e 1 acc 14: 0.6667 - dense 1 acc 15: 0.4833 - dense 1 acc 16: 0.6167 - dense
1_acc_17: 0.6833 - dense_1_acc_18: 0.6000 - dense_1_acc_19: 0.6333 - dense_1_
acc_20: 0.6667 - dense_1_acc_21: 0.6500 - dense_1_acc_22: 0.5667 - dense_1_ac
c_23: 0.6167 - dense_1_acc_24: 0.6833 - dense_1_acc_25: 0.5333 - dense_1_acc_
26: 0.6333 - dense 1 acc 27: 0.6667 - dense 1 acc 28: 0.6500 - dense 1 acc 2
9: 0.6833 - dense_1_acc_30: 0.0000e+00
Epoch 22/100
60/60 [========================== ] - 0s - loss: 49.2905 - dense_1_loss_1:
4.0929 - dense_1_loss_2: 3.4129 - dense_1_loss_3: 2.6608 - dense_1_loss_4: 2.
2856 - dense 1 loss 5: 1.9572 - dense 1 loss 6: 1.8211 - dense 1 loss 7: 1.71
05 - dense_1_loss_8: 1.5031 - dense_1_loss_9: 1.5867 - dense_1_loss_10: 1.435
3 - dense_1_loss_11: 1.5495 - dense_1_loss_12: 1.3949 - dense_1_loss_13: 1.27
86 - dense 1 loss 14: 1.2624 - dense 1 loss 15: 1.4807 - dense 1 loss 16: 1.4
207 - dense_1_loss_17: 1.3896 - dense_1_loss_18: 1.4130 - dense_1_loss_19: 1.
3550 - dense_1_loss_20: 1.3249 - dense_1_loss_21: 1.4524 - dense_1_loss_22:
1.4457 - dense 1 loss 23: 1.4138 - dense 1 loss 24: 1.3755 - dense 1 loss 25:
1.5507 - dense 1 loss 26: 1.3759 - dense 1 loss 27: 1.4754 - dense 1 loss 28:
1.3773 - dense_1_loss_29: 1.4886 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.0667 - dense 1 acc 2: 0.3000 - dense 1 acc 3: 0.3833 - dense 1 acc 4: 0.
3167 - dense_1_acc_5: 0.4500 - dense_1_acc_6: 0.5333 - dense_1_acc_7: 0.4833
- dense_1_acc_8: 0.6000 - dense_1_acc_9: 0.6333 - dense_1_acc_10: 0.6333 - de
nse 1 acc 11: 0.5833 - dense 1 acc 12: 0.7000 - dense 1 acc 13: 0.7333 - dens
e 1 acc 14: 0.7333 - dense 1 acc 15: 0.5167 - dense 1 acc 16: 0.6667 - dense
1_acc_17: 0.6500 - dense_1_acc_18: 0.5667 - dense_1_acc_19: 0.6500 - dense_1_
acc_20: 0.7333 - dense_1_acc_21: 0.6500 - dense_1_acc_22: 0.6167 - dense_1_ac
c_23: 0.5833 - dense_1_acc_24: 0.6167 - dense_1_acc_25: 0.6000 - dense_1_acc_
26: 0.6333 - dense_1_acc_27: 0.6167 - dense_1_acc_28: 0.6833 - dense_1_acc_2
9: 0.6167 - dense_1_acc_30: 0.0000e+00
Epoch 23/100
4.0840 - dense_1_loss_2: 3.3629 - dense_1_loss_3: 2.5644 - dense_1_loss_4: 2.
1828 - dense 1 loss 5: 1.8421 - dense 1 loss 6: 1.7061 - dense 1 loss 7: 1.56
52 - dense_1_loss_8: 1.3911 - dense_1_loss_9: 1.5006 - dense_1_loss_10: 1.327
1 - dense_1_loss_11: 1.4446 - dense_1_loss_12: 1.2913 - dense_1_loss_13: 1.22
07 - dense 1 loss 14: 1.2027 - dense 1 loss 15: 1.3869 - dense 1 loss 16: 1.3
045 - dense_1_loss_17: 1.3132 - dense_1_loss_18: 1.3042 - dense_1_loss_19: 1.
2800 - dense_1_loss_20: 1.2332 - dense_1_loss_21: 1.3516 - dense_1_loss_22:
1.3255 - dense_1_loss_23: 1.3296 - dense_1_loss_24: 1.2848 - dense_1_loss_25:
1.4470 - dense 1 loss 26: 1.2649 - dense 1 loss 27: 1.3749 - dense 1 loss 28:
1.3089 - dense_1_loss_29: 1.4170 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.0667 - dense 1 acc 2: 0.3000 - dense 1 acc 3: 0.4167 - dense 1 acc 4: 0.
3167 - dense_1_acc_5: 0.4667 - dense_1_acc_6: 0.5500 - dense_1_acc_7: 0.5833
- dense_1_acc_8: 0.6167 - dense_1_acc_9: 0.6333 - dense_1_acc_10: 0.6833 - de
nse_1_acc_11: 0.6333 - dense_1_acc_12: 0.8500 - dense_1_acc_13: 0.7833 - dens
e_1_acc_14: 0.8000 - dense_1_acc_15: 0.6500 - dense_1_acc_16: 0.7667 - dense_
1 acc 17: 0.7333 - dense 1 acc 18: 0.7333 - dense 1 acc 19: 0.7500 - dense 1
acc_20: 0.8333 - dense_1_acc_21: 0.7000 - dense_1_acc_22: 0.6333 - dense_1_ac
c_23: 0.6667 - dense_1_acc_24: 0.7500 - dense_1_acc_25: 0.6000 - dense_1_acc_
26: 0.7167 - dense_1_acc_27: 0.6500 - dense_1_acc_28: 0.6667 - dense_1_acc_2
9: 0.6167 - dense_1_acc_30: 0.0000e+00
Epoch 24/100
60/60 [=========================== ] - 0s - loss: 44.2920 - dense 1 loss 1:
4.0760 - dense_1_loss_2: 3.3135 - dense_1_loss_3: 2.4788 - dense_1_loss_4: 2.
0697 - dense 1 loss 5: 1.7463 - dense 1 loss 6: 1.5666 - dense 1 loss 7: 1.45
15 - dense_1_loss_8: 1.3008 - dense_1_loss_9: 1.3685 - dense_1_loss_10: 1.262
5 - dense_1_loss_11: 1.3581 - dense_1_loss_12: 1.2246 - dense_1_loss_13: 1.15
76 - dense_1_loss_14: 1.1213 - dense_1_loss_15: 1.2933 - dense_1_loss_16: 1.2
```

```
320 - dense 1 loss 17: 1.2435 - dense 1 loss 18: 1.2041 - dense 1 loss 19: 1.
2135 - dense_1_loss_20: 1.1738 - dense_1_loss_21: 1.2701 - dense_1_loss_22:
1.2451 - dense_1_loss_23: 1.2139 - dense_1_loss_24: 1.1906 - dense_1_loss_25:
1.4038 - dense_1_loss_26: 1.2391 - dense_1_loss_27: 1.2913 - dense_1_loss_28:
1.2399 - dense 1 loss 29: 1.3423 - dense 1 loss 30: 0.0000e+00 - dense 1 acc
1: 0.0667 - dense_1_acc_2: 0.3000 - dense_1_acc_3: 0.4167 - dense_1_acc_4: 0.
3833 - dense 1 acc 5: 0.5500 - dense 1 acc 6: 0.5833 - dense 1 acc 7: 0.6333
- dense_1_acc_8: 0.7000 - dense_1_acc_9: 0.7000 - dense_1_acc_10: 0.7333 - de
nse_1_acc_11: 0.7333 - dense_1_acc_12: 0.8333 - dense_1_acc_13: 0.7667 - dens
e_1_acc_14: 0.8333 - dense_1_acc_15: 0.7000 - dense_1_acc_16: 0.8333 - dense_
1_acc_17: 0.7500 - dense_1_acc_18: 0.8000 - dense_1_acc_19: 0.7500 - dense_1_
acc_20: 0.8167 - dense_1_acc_21: 0.7500 - dense_1_acc_22: 0.7500 - dense_1_ac
c_23: 0.7500 - dense_1_acc_24: 0.8167 - dense_1_acc_25: 0.5333 - dense_1_acc_
26: 0.7167 - dense_1_acc_27: 0.7167 - dense_1_acc_28: 0.7167 - dense_1_acc_2
9: 0.6833 - dense_1_acc_30: 0.0000e+00
Epoch 25/100
60/60 [=========================== ] - 0s - loss: 41.6889 - dense 1 loss 1:
4.0667 - dense_1_loss_2: 3.2586 - dense_1_loss_3: 2.3932 - dense_1_loss_4: 1.
9648 - dense 1 loss 5: 1.6511 - dense 1 loss 6: 1.4929 - dense 1 loss 7: 1.34
97 - dense_1_loss_8: 1.1978 - dense_1_loss_9: 1.3133 - dense_1_loss_10: 1.139
8 - dense_1_loss_11: 1.2714 - dense_1_loss_12: 1.1488 - dense_1_loss_13: 1.05
05 - dense 1 loss 14: 1.0322 - dense 1 loss 15: 1.1525 - dense 1 loss 16: 1.1
587 - dense_1_loss_17: 1.1472 - dense_1_loss_18: 1.1098 - dense_1_loss_19: 1.
0993 - dense_1_loss_20: 1.1301 - dense_1_loss_21: 1.1548 - dense_1_loss_22:
1.1436 - dense_1_loss_23: 1.1166 - dense_1_loss_24: 1.1118 - dense_1_loss_25:
1.3114 - dense_1_loss_26: 1.1253 - dense_1_loss_27: 1.2042 - dense_1_loss_28:
1.1423 - dense_1_loss_29: 1.2507 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.0667 - dense_1_acc_2: 0.3000 - dense_1_acc_3: 0.4500 - dense_1_acc_4: 0.
4167 - dense 1 acc 5: 0.5167 - dense 1 acc 6: 0.6167 - dense 1 acc 7: 0.7000
- dense_1_acc_8: 0.7333 - dense_1_acc_9: 0.7000 - dense_1_acc_10: 0.7500 - de
nse_1_acc_11: 0.7833 - dense_1_acc_12: 0.7833 - dense_1_acc_13: 0.8667 - dens
e_1_acc_14: 0.8500 - dense_1_acc_15: 0.7667 - dense_1_acc_16: 0.8000 - dense_
1_acc_17: 0.7667 - dense_1_acc_18: 0.8000 - dense_1_acc_19: 0.8667 - dense_1_
acc_20: 0.8500 - dense_1_acc_21: 0.8333 - dense_1_acc_22: 0.8000 - dense_1_ac
c 23: 0.8500 - dense 1 acc 24: 0.8500 - dense 1 acc 25: 0.6833 - dense 1 acc
26: 0.8333 - dense_1_acc_27: 0.7833 - dense_1_acc_28: 0.8000 - dense_1_acc_2
9: 0.7667 - dense_1_acc_30: 0.0000e+00
Epoch 26/100
4.0583 - dense_1_loss_2: 3.2049 - dense_1_loss_3: 2.2992 - dense_1_loss_4: 1.
8636 - dense 1 loss 5: 1.5540 - dense 1 loss 6: 1.3977 - dense 1 loss 7: 1.25
76 - dense_1_loss_8: 1.1201 - dense_1_loss_9: 1.1879 - dense_1_loss_10: 1.054
2 - dense_1_loss_11: 1.1893 - dense_1_loss_12: 1.0650 - dense_1_loss_13: 0.94
90 - dense_1_loss_14: 0.9949 - dense_1_loss_15: 1.0668 - dense_1_loss_16: 1.0
772 - dense_1_loss_17: 1.0683 - dense_1_loss_18: 1.0426 - dense_1_loss_19: 1.
0445 - dense 1 loss 20: 1.0393 - dense 1 loss 21: 1.0715 - dense 1 loss 22:
1.0423 - dense_1_loss_23: 1.0678 - dense_1_loss_24: 1.0189 - dense_1_loss_25:
1.2226 - dense_1_loss_26: 1.0478 - dense_1_loss_27: 1.1116 - dense_1_loss_28:
1.1037 - dense_1_loss_29: 1.1456 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.0667 - dense_1_acc_2: 0.3167 - dense_1_acc_3: 0.4833 - dense_1_acc_4: 0.
4000 - dense 1 acc 5: 0.5333 - dense 1 acc 6: 0.6667 - dense 1 acc 7: 0.7333
- dense_1_acc_8: 0.7667 - dense_1_acc_9: 0.7833 - dense_1_acc_10: 0.8000 - de
nse_1_acc_11: 0.8167 - dense_1_acc_12: 0.8167 - dense_1_acc_13: 0.9167 - dens
e_1_acc_14: 0.8500 - dense_1_acc_15: 0.8000 - dense_1_acc_16: 0.8000 - dense_
1_acc_17: 0.7833 - dense_1_acc_18: 0.8500 - dense_1_acc_19: 0.9000 - dense_1_
acc_20: 0.9333 - dense_1_acc_21: 0.8333 - dense_1_acc_22: 0.8500 - dense_1_ac
c_23: 0.8667 - dense_1_acc_24: 0.8833 - dense_1_acc_25: 0.7333 - dense_1_acc_
```

```
26: 0.8500 - dense 1 acc 27: 0.8333 - dense 1 acc 28: 0.8500 - dense 1 acc 2
9: 0.8667 - dense_1_acc_30: 0.0000e+00
Epoch 27/100
60/60 [================== ] - 0s - loss: 37.1072 - dense 1 loss 1:
4.0503 - dense 1 loss 2: 3.1519 - dense 1 loss 3: 2.2207 - dense 1 loss 4: 1.
7612 - dense_1_loss_5: 1.4683 - dense_1_loss_6: 1.2854 - dense_1_loss_7: 1.15
49 - dense 1 loss 8: 1.0570 - dense 1 loss 9: 1.0818 - dense 1 loss 10: 0.986
7 - dense_1_loss_11: 1.0909 - dense_1_loss_12: 0.9958 - dense_1_loss_13: 0.89
03 - dense_1_loss_14: 0.9025 - dense_1_loss_15: 0.9887 - dense_1_loss_16: 1.0
025 - dense 1 loss 17: 0.9799 - dense 1 loss 18: 0.9804 - dense 1 loss 19: 0.
9528 - dense 1 loss 20: 0.9533 - dense 1 loss 21: 1.0045 - dense 1 loss 22:
0.9656 - dense_1_loss_23: 0.9912 - dense_1_loss_24: 0.9381 - dense_1_loss_25:
1.1237 - dense_1_loss_26: 0.9845 - dense_1_loss_27: 1.0538 - dense_1_loss_28:
1.0088 - dense_1_loss_29: 1.0822 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.0667 - dense_1_acc_2: 0.3333 - dense_1_acc_3: 0.4833 - dense_1_acc_4: 0.
4500 - dense_1_acc_5: 0.6333 - dense_1_acc_6: 0.7500 - dense_1_acc_7: 0.8000
- dense 1 acc 8: 0.7667 - dense 1 acc 9: 0.8000 - dense 1 acc 10: 0.8000 - de
nse_1_acc_11: 0.8000 - dense_1_acc_12: 0.8667 - dense_1_acc_13: 0.9333 - dens
e 1 acc 14: 0.9333 - dense 1 acc 15: 0.8833 - dense 1 acc 16: 0.8000 - dense
1_acc_17: 0.8500 - dense_1_acc_18: 0.9167 - dense_1_acc_19: 0.9500 - dense_1_
acc_20: 0.9333 - dense_1_acc_21: 0.8833 - dense_1_acc_22: 0.9000 - dense_1_ac
c 23: 0.8500 - dense 1 acc 24: 0.9000 - dense 1 acc 25: 0.7667 - dense 1 acc
26: 0.8667 - dense_1_acc_27: 0.8667 - dense_1_acc_28: 0.8667 - dense_1_acc_2
9: 0.8333 - dense_1_acc_30: 0.0000e+00
Epoch 28/100
4.0419 - dense_1_loss_2: 3.0980 - dense_1_loss_3: 2.1380 - dense_1_loss_4: 1.
6704 - dense_1_loss_5: 1.3832 - dense_1_loss_6: 1.1812 - dense_1_loss_7: 1.06
37 - dense 1 loss 8: 0.9564 - dense 1 loss 9: 1.0222 - dense 1 loss 10: 0.893
3 - dense_1_loss_11: 0.9975 - dense_1_loss_12: 0.9200 - dense_1_loss_13: 0.81
84 - dense_1_loss_14: 0.8428 - dense_1_loss_15: 0.8924 - dense_1_loss_16: 0.9
211 - dense_1_loss_17: 0.9025 - dense_1_loss_18: 0.9363 - dense_1_loss_19: 0.
8805 - dense_1_loss_20: 0.8782 - dense_1_loss_21: 0.9260 - dense_1_loss_22:
0.9125 - dense 1 loss 23: 0.9103 - dense 1 loss 24: 0.8794 - dense 1 loss 25:
1.0343 - dense_1_loss_26: 0.9173 - dense_1_loss_27: 0.9771 - dense_1_loss_28:
0.9595 - dense_1_loss_29: 1.0173 - dense_1_loss_30: 0.0000e+00 - dense_1_acc_
1: 0.0667 - dense_1_acc_2: 0.3500 - dense_1_acc_3: 0.4833 - dense_1_acc_4: 0.
4833 - dense_1_acc_5: 0.6500 - dense_1_acc_6: 0.7833 - dense_1_acc_7: 0.8167
- dense 1 acc 8: 0.8333 - dense 1 acc 9: 0.8333 - dense 1 acc 10: 0.8667 - de
nse_1_acc_11: 0.8500 - dense_1_acc_12: 0.8667 - dense_1_acc_13: 0.9167 - dens
e 1 acc 14: 0.9667 - dense 1 acc 15: 0.9333 - dense 1 acc 16: 0.9167 - dense
1_acc_17: 0.8667 - dense_1_acc_18: 0.9333 - dense_1_acc_19: 0.9333 - dense_1_
acc_20: 0.9500 - dense_1_acc_21: 0.9333 - dense_1_acc_22: 0.8667 - dense_1_ac
c_23: 0.8667 - dense_1_acc_24: 0.9167 - dense_1_acc_25: 0.8000 - dense_1_acc_
26: 0.9167 - dense_1_acc_27: 0.9000 - dense_1_acc_28: 0.8833 - dense_1_acc_2
9: 0.8667 - dense 1 acc 30: 0.0000e+00
Epoch 29/100
4.0342 - dense_1_loss_2: 3.0469 - dense_1_loss_3: 2.0582 - dense_1_loss_4: 1.
5785 - dense_1_loss_5: 1.3046 - dense_1_loss_6: 1.0774 - dense_1_loss_7: 0.97
14 - dense_1_loss_8: 0.8742 - dense_1_loss_9: 0.9447 - dense_1_loss_10: 0.821
7 - dense_1_loss_11: 0.8979 - dense_1_loss_12: 0.8274 - dense_1_loss_13: 0.73
69 - dense_1_loss_14: 0.7675 - dense_1_loss_15: 0.8222 - dense_1_loss_16: 0.8
271 - dense_1_loss_17: 0.8598 - dense_1_loss_18: 0.8331 - dense_1_loss_19: 0.
8123 - dense_1_loss_20: 0.8077 - dense_1_loss_21: 0.8568 - dense_1_loss_22:
0.8642 - dense_1_loss_23: 0.8678 - dense_1_loss_24: 0.8058 - dense_1_loss_25:
0.9438 - dense_1_loss_26: 0.8316 - dense_1_loss_27: 0.9125 - dense_1_loss_28:
```

```
0.8944 - dense 1 loss 29: 0.9514 - dense 1 loss 30: 0.0000e+00 - dense 1 acc
1: 0.0667 - dense_1_acc_2: 0.3500 - dense_1_acc_3: 0.5000 - dense_1_acc_4: 0.
5167 - dense_1_acc_5: 0.6833 - dense_1_acc_6: 0.7833 - dense_1_acc_7: 0.8500
- dense_1_acc_8: 0.9000 - dense_1_acc_9: 0.8833 - dense_1_acc_10: 0.9333 - de
nse 1 acc 11: 0.8500 - dense 1 acc 12: 0.9333 - dense 1 acc 13: 0.9500 - dens
e_1_acc_14: 0.9167 - dense_1_acc_15: 0.9333 - dense_1_acc_16: 0.9167 - dense_
1 acc 17: 0.9167 - dense 1 acc 18: 0.9667 - dense 1 acc 19: 0.9500 - dense 1
acc_20: 0.9667 - dense_1_acc_21: 0.9500 - dense_1_acc_22: 0.9000 - dense_1_ac
c_23: 0.9167 - dense_1_acc_24: 0.9333 - dense_1_acc_25: 0.8167 - dense_1_acc_
26: 0.9167 - dense 1 acc 27: 0.8833 - dense 1 acc 28: 0.8833 - dense 1 acc 2
9: 0.8833 - dense 1 acc 30: 0.0000e+00
Epoch 30/100
4.0265 - dense_1_loss_2: 2.9925 - dense_1_loss_3: 1.9800 - dense_1_loss_4: 1.
4951 - dense_1_loss_5: 1.2182 - dense_1_loss_6: 0.9937 - dense_1_loss_7: 0.90
34 - dense_1_loss_8: 0.8002 - dense_1_loss_9: 0.8760 - dense_1_loss_10: 0.772
9 - dense 1 loss 11: 0.8329 - dense 1 loss 12: 0.7766 - dense 1 loss 13: 0.67
49 - dense_1_loss_14: 0.7127 - dense_1_loss_15: 0.7734 - dense_1_loss_16: 0.7
562 - dense 1 loss 17: 0.7830 - dense 1 loss 18: 0.7546 - dense 1 loss 19: 0.
7697 - dense_1_loss_20: 0.7614 - dense_1_loss_21: 0.7795 - dense_1_loss_22:
0.7811 - dense_1_loss_23: 0.7943 - dense_1_loss_24: 0.7403 - dense_1_loss_2
5: 0.8710 - dense 1 loss 26: 0.7755 - dense 1 loss 27: 0.8509 - dense 1 loss
28: 0.8117 - dense_1_loss_29: 0.8784 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc_1: 0.0667 - dense_1_acc_2: 0.3500 - dense_1_acc_3: 0.5833 - dense_1_acc_
4: 0.5333 - dense_1_acc_5: 0.6833 - dense_1_acc_6: 0.8167 - dense_1_acc_7: 0.
8667 - dense_1_acc_8: 0.8833 - dense_1_acc_9: 0.8833 - dense_1_acc_10: 0.9333
- dense_1_acc_11: 0.8500 - dense_1_acc_12: 0.9333 - dense_1_acc_13: 0.9500 -
dense_1_acc_14: 0.9833 - dense_1_acc_15: 0.9667 - dense_1_acc_16: 0.9333 - d
ense 1 acc 17: 0.9333 - dense 1 acc 18: 0.9833 - dense 1 acc 19: 0.9667 - den
se_1_acc_20: 0.9667 - dense_1_acc_21: 0.9500 - dense_1_acc_22: 0.9167 - dense
_1_acc_23: 0.9333 - dense_1_acc_24: 0.9333 - dense_1_acc_25: 0.8333 - dense_1
_acc_26: 0.9333 - dense_1_acc_27: 0.9000 - dense_1_acc_28: 0.9167 - dense_1_a
cc_29: 0.8833 - dense_1_acc_30: 0.0000e+00
Epoch 31/100
60/60 [================== ] - 0s - loss: 29.0839 - dense 1 loss 1:
4.0183 - dense_1_loss_2: 2.9423 - dense_1_loss_3: 1.9015 - dense_1_loss_4: 1.
4088 - dense_1_loss_5: 1.1354 - dense_1_loss_6: 0.9211 - dense_1_loss_7: 0.82
47 - dense_1_loss_8: 0.7237 - dense_1_loss_9: 0.8106 - dense_1_loss_10: 0.709
5 - dense_1_loss_11: 0.7798 - dense_1_loss_12: 0.7099 - dense_1_loss_13: 0.62
15 - dense_1_loss_14: 0.6534 - dense_1_loss_15: 0.6908 - dense_1_loss_16: 0.6
810 - dense 1 loss 17: 0.7216 - dense 1 loss 18: 0.7067 - dense 1 loss 19: 0.
6760 - dense_1_loss_20: 0.6963 - dense_1_loss_21: 0.7424 - dense_1_loss_22:
0.7202 - dense_1_loss_23: 0.7340 - dense_1_loss_24: 0.6887 - dense_1_loss_2
5: 0.8092 - dense 1 loss 26: 0.7075 - dense 1 loss 27: 0.7930 - dense 1 loss
28: 0.7546 - dense_1_loss_29: 0.8015 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc_1: 0.0667 - dense_1_acc_2: 0.3667 - dense_1_acc_3: 0.5833 - dense_1_acc_
4: 0.5833 - dense_1_acc_5: 0.7333 - dense_1_acc_6: 0.8167 - dense_1_acc_7: 0.
9333 - dense_1_acc_8: 0.9167 - dense_1_acc_9: 0.8833 - dense_1_acc_10: 0.9500
- dense_1_acc_11: 0.8833 - dense_1_acc_12: 0.9333 - dense_1_acc_13: 0.9333 -
 dense_1_acc_14: 0.9833 - dense_1_acc_15: 0.9833 - dense_1_acc_16: 0.9500 - d
ense 1 acc 17: 0.9333 - dense 1 acc 18: 0.9500 - dense 1 acc 19: 0.9667 - den
se_1_acc_20: 0.9667 - dense_1_acc_21: 0.9500 - dense_1_acc_22: 0.9000 - dense
_1_acc_23: 0.9500 - dense_1_acc_24: 0.9333 - dense_1_acc_25: 0.8333 - dense_1
acc 26: 0.9333 - dense 1 acc 27: 0.9333 - dense 1 acc 28: 0.9500 - dense 1 a
cc_29: 0.9167 - dense_1_acc_30: 0.0000e+00
Epoch 32/100
60/60 [=========================== ] - 0s - loss: 27.2753 - dense 1 loss 1:
```

```
4.0114 - dense 1 loss 2: 2.8894 - dense 1 loss 3: 1.8250 - dense 1 loss 4: 1.
3182 - dense_1_loss_5: 1.0567 - dense_1_loss_6: 0.8535 - dense_1_loss_7: 0.75
15 - dense_1_loss_8: 0.6672 - dense_1_loss_9: 0.7478 - dense_1_loss_10: 0.640
5 - dense_1_loss_11: 0.7244 - dense_1_loss_12: 0.6315 - dense_1_loss_13: 0.55
93 - dense 1 loss 14: 0.5831 - dense 1 loss 15: 0.6357 - dense 1 loss 16: 0.6
231 - dense_1_loss_17: 0.6541 - dense_1_loss_18: 0.6453 - dense_1_loss_19: 0.
6392 - dense 1 loss 20: 0.6468 - dense 1 loss 21: 0.6790 - dense 1 loss 22:
0.6437 - dense_1_loss_23: 0.6800 - dense_1_loss_24: 0.6146 - dense_1_loss_2
5: 0.7576 - dense_1_loss_26: 0.6761 - dense_1_loss_27: 0.7096 - dense_1_loss_
28: 0.6672 - dense 1 loss 29: 0.7438 - dense 1 loss 30: 0.0000e+00 - dense 1
acc_1: 0.0667 - dense_1_acc_2: 0.3667 - dense_1_acc_3: 0.6000 - dense_1_acc_
4: 0.6500 - dense_1_acc_5: 0.7667 - dense_1_acc_6: 0.8833 - dense_1_acc_7: 0.
9333 - dense 1 acc 8: 0.9667 - dense 1 acc 9: 0.8833 - dense 1 acc 10: 0.9833
- dense_1_acc_11: 0.8833 - dense_1_acc_12: 0.9833 - dense_1_acc_13: 0.9833 -
 dense_1_acc_14: 0.9833 - dense_1_acc_15: 0.9833 - dense_1_acc_16: 0.9833 - d
ense_1_acc_17: 0.9500 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 0.9667 - den
se 1 acc 20: 0.9667 - dense 1 acc 21: 0.9500 - dense 1 acc 22: 0.9833 - dense
_1_acc_23:    0.9667 - dense_1_acc_24:    0.9333 - dense_1_acc_25:    0.8333 - dense_1
acc 26: 0.9333 - dense 1 acc 27: 0.9333 - dense 1 acc 28: 0.9500 - dense 1 a
cc_29: 0.9167 - dense_1_acc_30: 0.0000e+00
Epoch 33/100
60/60 [=============== ] - 0s - loss: 25.6533 - dense_1_loss_1:
4.0049 - dense 1 loss 2: 2.8351 - dense 1 loss 3: 1.7530 - dense 1 loss 4: 1.
2335 - dense_1_loss_5: 0.9787 - dense_1_loss_6: 0.7757 - dense_1_loss_7: 0.68
52 - dense_1_loss_8: 0.6176 - dense_1_loss_9: 0.6913 - dense_1_loss_10: 0.579
0 - dense_1_loss_11: 0.6868 - dense_1_loss_12: 0.5683 - dense_1_loss_13: 0.50
62 - dense_1_loss_14: 0.5304 - dense_1_loss_15: 0.5923 - dense_1_loss_16: 0.5
734 - dense_1_loss_17: 0.6008 - dense_1_loss_18: 0.5724 - dense_1_loss_19: 0.
6024 - dense 1 loss 20: 0.5933 - dense 1 loss 21: 0.6267 - dense 1 loss 22:
0.5889 - dense_1_loss_23: 0.6234 - dense_1_loss_24: 0.5700 - dense_1_loss_2
5: 0.7016 - dense_1_loss_26: 0.6054 - dense_1_loss_27: 0.6449 - dense_1_loss_
28: 0.6277 - dense_1_loss_29: 0.6842 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc_1: 0.0667 - dense_1_acc_2: 0.3667 - dense_1_acc_3: 0.6500 - dense_1_acc_
4: 0.7000 - dense 1 acc 5: 0.7667 - dense 1 acc 6: 0.9167 - dense 1 acc 7: 0.
9500 - dense 1 acc 8: 0.9833 - dense 1 acc 9: 0.9000 - dense 1 acc 10: 1.0000
- dense_1_acc_11: 0.9167 - dense_1_acc_12: 0.9833 - dense_1_acc_13: 0.9833 -
dense_1_acc_14: 1.0000 - dense_1_acc_15: 0.9833 - dense_1_acc_16: 1.0000 - d
ense_1_acc_17: 0.9667 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 0.9667 - den
se_1_acc_20: 0.9667 - dense_1_acc_21: 0.9500 - dense_1_acc_22: 0.9833 - dense
_1_acc_23:    0.9667 - dense_1_acc_24:    0.9500 - dense_1_acc_25:    0.8833 - dense_1
acc 26: 0.9333 - dense 1 acc 27: 0.9500 - dense 1 acc 28: 0.9500 - dense 1 a
cc_29: 0.9333 - dense_1_acc_30: 0.0000e+00
Epoch 34/100
60/60 [================== ] - 0s - loss: 24.0893 - dense 1 loss 1:
3.9982 - dense_1_loss_2: 2.7842 - dense_1_loss_3: 1.6866 - dense_1_loss_4: 1.
1544 - dense 1 loss 5: 0.9121 - dense 1 loss 6: 0.7124 - dense 1 loss 7: 0.62
93 - dense_1_loss_8: 0.5628 - dense_1_loss_9: 0.6373 - dense_1_loss_10: 0.524
4 - dense_1_loss_11: 0.6296 - dense_1_loss_12: 0.5171 - dense_1_loss_13: 0.46
63 - dense_1_loss_14: 0.4913 - dense_1_loss_15: 0.5215 - dense_1_loss_16: 0.5
271 - dense_1_loss_17: 0.5468 - dense_1_loss_18: 0.5320 - dense_1_loss_19: 0.
5391 - dense_1_loss_20: 0.5329 - dense_1_loss_21: 0.5770 - dense_1_loss_22:
0.5414 - dense_1_loss_23: 0.5500 - dense_1_loss_24: 0.5287 - dense_1_loss_2
5: 0.6500 - dense_1_loss_26: 0.5522 - dense_1_loss_27: 0.5827 - dense_1_loss_
28: 0.5656 - dense_1_loss_29: 0.6364 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc_1: 0.0667 - dense_1_acc_2: 0.3667 - dense_1_acc_3: 0.6500 - dense_1_acc_
4: 0.7333 - dense_1_acc_5: 0.8000 - dense_1_acc_6: 0.9333 - dense_1_acc_7: 0.
9667 - dense_1_acc_8: 0.9833 - dense_1_acc_9: 0.9333 - dense_1_acc_10: 1.0000
```

```
- dense 1 acc 11: 0.9333 - dense 1 acc 12: 0.9833 - dense 1 acc 13: 0.9833 -
 dense_1_acc_14: 0.9833 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense_1_acc_17: 0.9667 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 0.9667 - den
se_1_acc_20: 0.9667 - dense_1_acc_21: 0.9833 - dense_1_acc_22: 1.0000 - dense
_1_acc_23: 0.9667 - dense_1_acc_24: 0.9500 - dense_1_acc_25: 0.9667 - dense_1
_acc_26: 0.9833 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 0.9667 - dense_1_a
cc_29: 0.9333 - dense_1_acc_30: 0.0000e+00
Epoch 35/100
3.9919 - dense 1 loss 2: 2.7291 - dense 1 loss 3: 1.6152 - dense 1 loss 4: 1.
0809 - dense 1 loss 5: 0.8556 - dense 1 loss 6: 0.6625 - dense 1 loss 7: 0.57
47 - dense_1_loss_8: 0.5239 - dense_1_loss_9: 0.5808 - dense_1_loss_10: 0.485
7 - dense 1 loss 11: 0.5639 - dense 1 loss 12: 0.4763 - dense 1 loss 13: 0.42
00 - dense_1_loss_14: 0.4401 - dense_1_loss_15: 0.4782 - dense_1_loss_16: 0.4
843 - dense_1_loss_17: 0.4890 - dense_1_loss_18: 0.4946 - dense_1_loss_19: 0.
4932 - dense 1 loss 20: 0.5053 - dense 1 loss 21: 0.5222 - dense 1 loss 22:
0.4891 - dense 1 loss 23: 0.4964 - dense 1 loss 24: 0.4800 - dense 1 loss 2
5: 0.6029 - dense_1_loss_26: 0.5242 - dense_1_loss_27: 0.5337 - dense_1_loss_
28: 0.5138 - dense 1 loss 29: 0.5924 - dense 1 loss 30: 0.0000e+00 - dense 1
acc_1: 0.0667 - dense_1_acc_2: 0.3667 - dense_1_acc_3: 0.6500 - dense_1_acc_
4: 0.7500 - dense_1_acc_5: 0.8333 - dense_1_acc_6: 0.9333 - dense_1_acc_7: 0.
9833 - dense 1 acc 8: 0.9833 - dense 1 acc 9: 0.9333 - dense 1 acc 10: 1.0000
- dense_1_acc_11: 0.9333 - dense_1_acc_12: 0.9833 - dense_1_acc_13: 1.0000 -
dense_1_acc_14: 1.0000 - dense_1_acc_15: 0.9833 - dense_1_acc_16: 1.0000 - d
ense_1_acc_17: 0.9667 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 0.9833 - den
se_1_acc_20: 0.9833 - dense_1_acc_21: 0.9500 - dense_1_acc_22: 1.0000 - dense
_1_acc_23: 0.9833 - dense_1_acc_24: 0.9833 - dense_1_acc_25: 0.9500 - dense_1
_acc_26: 0.9667 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 0.9500 - dense_1_a
cc 29: 0.9500 - dense 1 acc 30: 0.0000e+00
Epoch 36/100
60/60 [========================= ] - 0s - loss: 21.3087 - dense_1_loss_1:
3.9861 - dense 1 loss 2: 2.6769 - dense 1 loss 3: 1.5481 - dense 1 loss 4: 1.
0107 - dense_1_loss_5: 0.7919 - dense_1_loss_6: 0.5950 - dense_1_loss_7: 0.51
94 - dense 1 loss 8: 0.4739 - dense 1 loss 9: 0.5134 - dense 1 loss 10: 0.441
4 - dense_1_loss_11: 0.5100 - dense_1_loss_12: 0.4248 - dense_1_loss_13: 0.37
95 - dense_1_loss_14: 0.3967 - dense_1_loss_15: 0.4417 - dense_1_loss_16: 0.4
302 - dense_1_loss_17: 0.4515 - dense_1_loss_18: 0.4523 - dense_1_loss_19: 0.
4397 - dense_1_loss_20: 0.4537 - dense_1_loss_21: 0.4735 - dense_1_loss_22:
0.4510 - dense 1 loss 23: 0.4548 - dense 1 loss 24: 0.4486 - dense 1 loss 2
5: 0.5519 - dense_1_loss_26: 0.4709 - dense_1_loss_27: 0.4834 - dense_1_loss_
28: 0.4906 - dense 1 loss 29: 0.5470 - dense 1 loss 30: 0.0000e+00 - dense 1
acc_1: 0.0667 - dense_1_acc_2: 0.3667 - dense_1_acc_3: 0.6667 - dense_1_acc_
4: 0.7500 - dense_1_acc_5: 0.8833 - dense_1_acc_6: 0.9500 - dense_1_acc_7: 0.
9833 - dense 1 acc 8: 0.9833 - dense 1 acc 9: 0.9667 - dense 1 acc 10: 1.0000
- dense_1_acc_11: 0.9333 - dense_1_acc_12: 0.9833 - dense_1_acc_13: 1.0000 -
dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 - d
ense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 0.9833 - den
se 1 acc 20: 1.0000 - dense 1 acc 21: 0.9833 - dense 1 acc 22: 1.0000 - dense
_1_acc_23: 1.0000 - dense_1_acc_24: 0.9833 - dense_1_acc_25: 0.9667 - dense_1
_acc_26: 0.9833 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 0.9667 - dense_1_a
cc 29: 0.9667 - dense 1 acc 30: 0.0000e+00
Epoch 37/100
3.9802 - dense_1_loss_2: 2.6263 - dense_1_loss_3: 1.4845 - dense_1_loss_4: 0.
9419 - dense_1_loss_5: 0.7392 - dense_1_loss_6: 0.5553 - dense_1_loss_7: 0.47
80 - dense_1_loss_8: 0.4361 - dense_1_loss_9: 0.4865 - dense_1_loss_10: 0.401
3 - dense_1_loss_11: 0.4754 - dense_1_loss_12: 0.3807 - dense_1_loss_13: 0.34
```

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69 - dense 1 loss 14: 0.3621 - dense 1 loss 15: 0.3898 - dense 1 loss 16: 0.3
930 - dense_1_loss_17: 0.4074 - dense_1_loss_18: 0.4044 - dense_1_loss_19: 0.
3986 - dense_1_loss_20: 0.4151 - dense_1_loss_21: 0.4387 - dense_1_loss_22:
0.4134 - dense_1_loss_23: 0.4040 - dense_1_loss_24: 0.4155 - dense_1_loss_2
5: 0.4945 - dense 1 loss 26: 0.4202 - dense 1 loss 27: 0.4348 - dense 1 loss
28: 0.4352 - dense_1_loss_29: 0.5047 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc 1: 0.0667 - dense 1 acc 2: 0.4500 - dense 1 acc 3: 0.7000 - dense 1 acc
4: 0.7500 - dense_1_acc_5: 0.9000 - dense_1_acc_6: 0.9500 - dense_1_acc_7: 0.
9833 - dense_1_acc_8: 0.9833 - dense_1_acc_9: 0.9667 - dense_1_acc_10: 1.0000
- dense 1 acc 11: 0.9333 - dense 1 acc 12: 0.9833 - dense 1 acc 13: 1.0000 -
dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 - d
ense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 0.9833 - den
se 1 acc 20: 1.0000 - dense 1 acc 21: 0.9833 - dense 1 acc 22: 1.0000 - dense
_1_acc_23: 1.0000 - dense_1_acc_24: 0.9833 - dense_1_acc_25: 0.9667 - dense_1
_acc_26: 0.9833 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc 29: 0.9667 - dense 1 acc 30: 0.0000e+00
Epoch 38/100
60/60 [========================== ] - 0s - loss: 18.9312 - dense_1_loss_1:
3.9742 - dense 1 loss 2: 2.5764 - dense 1 loss 3: 1.4236 - dense 1 loss 4: 0.
8768 - dense_1_loss_5: 0.6885 - dense_1_loss_6: 0.5138 - dense_1_loss_7: 0.43
13 - dense_1_loss_8: 0.4026 - dense_1_loss_9: 0.4408 - dense_1_loss_10: 0.362
2 - dense 1 loss 11: 0.4349 - dense 1 loss 12: 0.3514 - dense 1 loss 13: 0.30
54 - dense_1_loss_14: 0.3247 - dense_1_loss_15: 0.3625 - dense_1_loss_16: 0.3
729 - dense_1_loss_17: 0.3631 - dense_1_loss_18: 0.3627 - dense_1_loss_19: 0.
3727 - dense_1_loss_20: 0.3897 - dense_1_loss_21: 0.3954 - dense_1_loss_22:
0.3676 - dense_1_loss_23: 0.3705 - dense_1_loss_24: 0.3839 - dense_1_loss_2
5: 0.4497 - dense_1_loss_26: 0.3932 - dense_1_loss_27: 0.3965 - dense_1_loss_
28: 0.3842 - dense_1_loss_29: 0.4600 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc 1: 0.0667 - dense 1 acc 2: 0.4500 - dense 1 acc 3: 0.7000 - dense 1 acc
4: 0.7667 - dense_1_acc_5: 0.9000 - dense_1_acc_6: 0.9500 - dense_1_acc_7: 0.
9833 - dense_1_acc_8: 0.9833 - dense_1_acc_9: 0.9667 - dense_1_acc_10: 1.0000
- dense 1 acc 11: 0.9333 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000 -
dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 0.9833 - den
se 1 acc 20: 1.0000 - dense 1 acc 21: 0.9833 - dense 1 acc 22: 1.0000 - dense
_1_acc_23: 1.0000 - dense_1_acc_24: 0.9833 - dense_1_acc_25: 0.9667 - dense_1
_acc_26: 0.9833 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc_29: 0.9667 - dense_1_acc_30: 0.0000e+00
Epoch 39/100
60/60 [========================= ] - 0s - loss: 17.8987 - dense_1_loss_1:
3.9685 - dense 1 loss 2: 2.5261 - dense 1 loss 3: 1.3652 - dense 1 loss 4: 0.
8203 - dense_1_loss_5: 0.6414 - dense_1_loss_6: 0.4718 - dense_1_loss_7: 0.38
88 - dense_1_loss_8: 0.3648 - dense_1_loss_9: 0.3980 - dense_1_loss_10: 0.329
1 - dense 1 loss 11: 0.3948 - dense 1 loss 12: 0.3234 - dense 1 loss 13: 0.27
76 - dense_1_loss_14: 0.2938 - dense_1_loss_15: 0.3296 - dense_1_loss_16: 0.3
391 - dense 1 loss 17: 0.3328 - dense 1 loss 18: 0.3273 - dense 1 loss 19: 0.
3328 - dense_1_loss_20: 0.3517 - dense_1_loss_21: 0.3675 - dense_1_loss_22:
0.3359 - dense 1 loss 23: 0.3506 - dense 1 loss 24: 0.3508 - dense 1 loss 2
5: 0.4073 - dense_1_loss_26: 0.3541 - dense_1_loss_27: 0.3694 - dense_1_loss_
28: 0.3669 - dense_1_loss_29: 0.4195 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc 1: 0.0667 - dense 1 acc 2: 0.4500 - dense 1 acc 3: 0.7000 - dense 1 acc
4: 0.7667 - dense_1_acc_5: 0.9333 - dense_1_acc_6: 0.9667 - dense_1_acc_7: 0.
9833 - dense_1_acc_8: 0.9833 - dense_1_acc_9: 0.9667 - dense_1_acc_10: 1.0000
- dense_1_acc_11: 0.9500 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000 -
dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - den
se_1_acc_20: 1.0000 - dense_1_acc_21: 0.9833 - dense_1_acc_22: 1.0000 - dense
```

```
1 acc 23: 1.0000 - dense 1 acc 24: 0.9833 - dense 1 acc 25: 0.9667 - dense 1
_acc_26: 0.9833 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc 29: 0.9667 - dense 1 acc 30: 0.0000e+00
Epoch 40/100
60/60 [=========================== ] - 0s - loss: 16.9362 - dense 1 loss 1:
3.9626 - dense_1_loss_2: 2.4786 - dense_1_loss_3: 1.3108 - dense_1_loss_4: 0.
7605 - dense 1 loss 5: 0.5949 - dense 1 loss 6: 0.4401 - dense 1 loss 7: 0.35
81 - dense_1_loss_8: 0.3344 - dense_1_loss_9: 0.3690 - dense_1_loss_10: 0.302
8 - dense_1_loss_11: 0.3585 - dense_1_loss_12: 0.2906 - dense_1_loss_13: 0.25
27 - dense 1 loss 14: 0.2720 - dense 1 loss 15: 0.2922 - dense 1 loss 16: 0.3
035 - dense_1_loss_17: 0.3016 - dense_1_loss_18: 0.3061 - dense_1_loss_19: 0.
3002 - dense_1_loss_20: 0.3192 - dense_1_loss_21: 0.3382 - dense_1_loss_22:
0.3060 - dense_1_loss_23: 0.3164 - dense_1_loss_24: 0.3136 - dense_1_loss_2
5: 0.3740 - dense_1_loss_26: 0.3252 - dense_1_loss_27: 0.3412 - dense_1_loss_
28: 0.3198 - dense_1_loss_29: 0.3934 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc 1: 0.0667 - dense 1 acc 2: 0.4500 - dense 1 acc 3: 0.7000 - dense 1 acc
4: 0.8000 - dense 1 acc 5: 0.9500 - dense 1 acc 6: 0.9667 - dense 1 acc 7: 1.
0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 0.9667 - dense_1_acc_10: 1.0000
- dense 1 acc 11: 0.9500 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000 -
 dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - den
se 1 acc 20: 1.0000 - dense 1 acc 21: 0.9833 - dense 1 acc 22: 1.0000 - dense
1 acc 23: 1.0000 - dense 1 acc 24: 0.9833 - dense 1 acc 25: 0.9667 - dense 1
_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc_29: 0.9833 - dense_1_acc_30: 0.0000e+00
Epoch 41/100
60/60 [========================== ] - 0s - loss: 16.0594 - dense 1 loss 1:
3.9570 - dense_1_loss_2: 2.4292 - dense_1_loss_3: 1.2560 - dense_1_loss_4: 0.
7091 - dense 1 loss 5: 0.5553 - dense 1 loss 6: 0.4034 - dense 1 loss 7: 0.32
66 - dense_1_loss_8: 0.3075 - dense_1_loss_9: 0.3325 - dense_1_loss_10: 0.273
3 - dense_1_loss_11: 0.3290 - dense_1_loss_12: 0.2591 - dense_1_loss_13: 0.23
30 - dense_1_loss_14: 0.2464 - dense_1_loss_15: 0.2722 - dense_1_loss_16: 0.2
771 - dense_1_loss_17: 0.2745 - dense_1_loss_18: 0.2761 - dense_1_loss_19: 0.
2809 - dense 1 loss 20: 0.2964 - dense 1 loss 21: 0.3017 - dense 1 loss 22:
0.2787 - dense 1 loss 23: 0.2914 - dense 1 loss 24: 0.2859 - dense 1 loss 2
5: 0.3423 - dense_1_loss_26: 0.3001 - dense_1_loss_27: 0.3027 - dense_1_loss_
28: 0.2996 - dense_1_loss_29: 0.3621 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc_1: 0.0667 - dense_1_acc_2: 0.4500 - dense_1_acc_3: 0.7000 - dense_1_acc_
4: 0.9167 - dense 1 acc 5: 0.9667 - dense 1 acc 6: 0.9667 - dense 1 acc 7: 1.
0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 0.9667 - dense_1_acc_10: 1.0000
- dense 1 acc 11: 0.9833 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000 -
dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - den
se_1_acc_20: 1.0000 - dense_1_acc_21: 0.9833 - dense_1_acc_22: 1.0000 - dense
_1_acc_23: 1.0000 - dense_1_acc_24: 0.9833 - dense_1_acc_25: 0.9667 - dense_1
_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc_29: 0.9833 - dense_1_acc_30: 0.0000e+00
Epoch 42/100
60/60 [=============== ] - 0s - loss: 15.2570 - dense_1_loss_1:
3.9514 - dense_1_loss_2: 2.3848 - dense_1_loss_3: 1.2057 - dense_1_loss_4: 0.
6600 - dense 1 loss 5: 0.5176 - dense 1 loss 6: 0.3671 - dense 1 loss 7: 0.30
12 - dense_1_loss_8: 0.2800 - dense_1_loss_9: 0.3001 - dense_1_loss_10: 0.250
1 - dense_1_loss_11: 0.3064 - dense_1_loss_12: 0.2407 - dense_1_loss_13: 0.20
94 - dense 1 loss 14: 0.2287 - dense 1 loss 15: 0.2439 - dense 1 loss 16: 0.2
524 - dense_1_loss_17: 0.2487 - dense_1_loss_18: 0.2477 - dense_1_loss_19: 0.
2551 - dense_1_loss_20: 0.2696 - dense_1_loss_21: 0.2775 - dense_1_loss_22:
0.2547 - dense_1_loss_23: 0.2610 - dense_1_loss_24: 0.2674 - dense_1_loss_2
```

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5: 0.3094 - dense 1 loss 26: 0.2726 - dense 1 loss 27: 0.2807 - dense 1 loss
28: 0.2859 - dense_1_loss_29: 0.3271 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc 1: 0.0667 - dense 1 acc 2: 0.4667 - dense 1 acc 3: 0.7667 - dense 1 acc
4: 0.9500 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 0.9667 - dense_1_acc_7: 1.
0000 - dense 1 acc 8: 1.0000 - dense 1 acc 9: 0.9833 - dense 1 acc 10: 1.0000
- dense_1_acc_11: 0.9833 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000 -
 dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - den
se_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - dense
1 acc 23: 1.0000 - dense 1 acc 24: 1.0000 - dense 1 acc 25: 1.0000 - dense 1
_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc_29: 0.9833 - dense_1_acc_30: 0.0000e+00
Epoch 43/100
60/60 [========================== ] - 0s - loss: 14.5391 - dense_1_loss_1:
3.9469 - dense_1_loss_2: 2.3376 - dense_1_loss_3: 1.1597 - dense_1_loss_4: 0.
6112 - dense_1_loss_5: 0.4837 - dense_1_loss_6: 0.3418 - dense_1_loss_7: 0.27
74 - dense 1 loss 8: 0.2585 - dense 1 loss 9: 0.2795 - dense 1 loss 10: 0.231
9 - dense_1_loss_11: 0.2819 - dense_1_loss_12: 0.2201 - dense_1_loss_13: 0.19
39 - dense 1 loss 14: 0.2145 - dense 1 loss 15: 0.2192 - dense 1 loss 16: 0.2
345 - dense_1_loss_17: 0.2249 - dense_1_loss_18: 0.2283 - dense_1_loss_19: 0.
2311 - dense_1_loss_20: 0.2539 - dense_1_loss_21: 0.2532 - dense_1_loss_22:
0.2337 - dense 1 loss 23: 0.2282 - dense 1 loss 24: 0.2444 - dense 1 loss 2
5: 0.2823 - dense_1_loss_26: 0.2522 - dense_1_loss_27: 0.2593 - dense_1_loss_
28: 0.2483 - dense_1_loss_29: 0.3071 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc_1: 0.0667 - dense_1_acc_2: 0.4667 - dense_1_acc_3: 0.7667 - dense_1_acc_
4: 0.9500 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 0.9667 - dense_1_acc_7: 1.
0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 0.9833 - dense_1_acc_10: 1.0000
- dense_1_acc_11: 0.9833 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000 -
 dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 - d
ense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - den
se_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - dense
_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense_1
_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc_29: 0.9833 - dense_1_acc_30: 0.0000e+00
Epoch 44/100
60/60 [================== ] - 0s - loss: 13.8763 - dense 1 loss 1:
3.9415 - dense_1_loss_2: 2.2939 - dense_1_loss_3: 1.1166 - dense_1_loss_4: 0.
5693 - dense_1_loss_5: 0.4528 - dense_1_loss_6: 0.3145 - dense_1_loss_7: 0.25
41 - dense_1_loss_8: 0.2382 - dense_1_loss_9: 0.2532 - dense_1_loss_10: 0.214
8 - dense_1_loss_11: 0.2569 - dense_1_loss_12: 0.2022 - dense_1_loss_13: 0.17
35 - dense 1 loss 14: 0.1977 - dense 1 loss 15: 0.2035 - dense 1 loss 16: 0.2
158 - dense_1_loss_17: 0.2048 - dense_1_loss_18: 0.2057 - dense_1_loss_19: 0.
2141 - dense_1_loss_20: 0.2338 - dense_1_loss_21: 0.2334 - dense_1_loss_22:
0.2115 - dense 1 loss 23: 0.2119 - dense 1 loss 24: 0.2214 - dense 1 loss 2
5: 0.2605 - dense_1_loss_26: 0.2333 - dense_1_loss_27: 0.2395 - dense_1_loss_
28: 0.2247 - dense 1 loss 29: 0.2832 - dense 1 loss 30: 0.0000e+00 - dense 1
acc_1: 0.0667 - dense_1_acc_2: 0.4667 - dense_1_acc_3: 0.7667 - dense_1_acc_
4: 0.9500 - dense 1 acc 5: 0.9833 - dense 1 acc 6: 0.9667 - dense 1 acc 7: 1.
0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 0.9833 - dense_1_acc_10: 1.0000
- dense_1_acc_11: 0.9833 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000 -
dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 - d
ense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - den
se_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - dense
_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense_1
_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc_29: 0.9833 - dense_1_acc_30: 0.0000e+00
Epoch 45/100
```

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60/60 [================== ] - 0s - loss: 13.2683 - dense 1 loss 1:
3.9372 - dense_1_loss_2: 2.2510 - dense_1_loss_3: 1.0706 - dense_1_loss_4: 0.
5344 - dense_1_loss_5: 0.4223 - dense_1_loss_6: 0.2856 - dense_1_loss_7: 0.22
94 - dense_1_loss_8: 0.2199 - dense_1_loss_9: 0.2259 - dense_1_loss_10: 0.197
0 - dense 1 loss 11: 0.2354 - dense 1 loss 12: 0.1870 - dense 1 loss 13: 0.16
17 - dense_1_loss_14: 0.1768 - dense_1_loss_15: 0.1889 - dense_1_loss_16: 0.1
943 - dense 1 loss 17: 0.1925 - dense 1 loss 18: 0.1896 - dense 1 loss 19: 0.
1956 - dense_1_loss_20: 0.2092 - dense_1_loss_21: 0.2181 - dense_1_loss_22:
0.1948 - dense_1_loss_23: 0.2011 - dense_1_loss_24: 0.2057 - dense_1_loss_2
5: 0.2380 - dense 1 loss 26: 0.2087 - dense 1 loss 27: 0.2197 - dense 1 loss
28: 0.2178 - dense_1_loss_29: 0.2602 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc_1: 0.0667 - dense_1_acc_2: 0.4667 - dense_1_acc_3: 0.7833 - dense_1_acc_
4: 0.9667 - dense 1 acc 5: 0.9833 - dense 1 acc 6: 0.9833 - dense 1 acc 7: 1.
0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.0000
- dense_1_acc_11: 0.9833 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000 -
 dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - den
se_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - dense
1 acc 23: 1.0000 - dense 1 acc 24: 1.0000 - dense 1 acc 25: 1.0000 - dense 1
_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc_29: 0.9833 - dense_1_acc_30: 0.0000e+00
Epoch 46/100
60/60 [=========================== ] - 0s - loss: 12.7033 - dense 1 loss 1:
3.9317 - dense_1_loss_2: 2.2084 - dense_1_loss_3: 1.0318 - dense_1_loss_4: 0.
4987 - dense_1_loss_5: 0.3955 - dense_1_loss_6: 0.2690 - dense_1_loss_7: 0.21
13 - dense_1_loss_8: 0.2022 - dense_1_loss_9: 0.2089 - dense_1_loss_10: 0.179
4 - dense_1_loss_11: 0.2124 - dense_1_loss_12: 0.1708 - dense_1_loss_13: 0.14
78 - dense_1_loss_14: 0.1619 - dense_1_loss_15: 0.1706 - dense_1_loss_16: 0.1
795 - dense 1 loss 17: 0.1753 - dense 1 loss 18: 0.1739 - dense 1 loss 19: 0.
1811 - dense_1_loss_20: 0.1914 - dense_1_loss_21: 0.1968 - dense_1_loss_22:
0.1779 - dense_1_loss_23: 0.1829 - dense_1_loss_24: 0.1916 - dense_1_loss_2
5: 0.2213 - dense_1_loss_26: 0.1914 - dense_1_loss_27: 0.2006 - dense_1_loss_
28: 0.1996 - dense_1_loss_29: 0.2395 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc_1: 0.0667 - dense_1_acc_2: 0.4667 - dense_1_acc_3: 0.8000 - dense_1_acc_
4: 0.9667 - dense 1 acc 5: 0.9833 - dense 1 acc 6: 0.9833 - dense 1 acc 7: 1.
0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.0000
- dense_1_acc_11: 0.9833 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000 -
 dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - den
se_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - dense
1 acc 23: 1.0000 - dense 1 acc 24: 1.0000 - dense 1 acc 25: 1.0000 - dense 1
_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc_29: 0.9833 - dense_1_acc_30: 0.0000e+00
Epoch 47/100
60/60 [==========================] - 0s - loss: 12.2331 - dense_1_loss_1:
3.9271 - dense 1 loss 2: 2.1684 - dense 1 loss 3: 0.9960 - dense 1 loss 4: 0.
4657 - dense_1_loss_5: 0.3725 - dense_1_loss_6: 0.2494 - dense_1_loss_7: 0.19
57 - dense_1_loss_8: 0.1884 - dense_1_loss_9: 0.1963 - dense_1_loss_10: 0.167
0 - dense_1_loss_11: 0.1897 - dense_1_loss_12: 0.1587 - dense_1_loss_13: 0.13
61 - dense_1_loss_14: 0.1508 - dense_1_loss_15: 0.1573 - dense_1_loss_16: 0.1
703 - dense 1 loss 17: 0.1613 - dense 1 loss 18: 0.1624 - dense 1 loss 19: 0.
1663 - dense_1_loss_20: 0.1824 - dense_1_loss_21: 0.1809 - dense_1_loss_22:
0.1652 - dense_1_loss_23: 0.1684 - dense_1_loss_24: 0.1782 - dense_1_loss_2
5: 0.2049 - dense 1 loss 26: 0.1797 - dense 1 loss 27: 0.1882 - dense 1 loss
28: 0.1789 - dense_1_loss_29: 0.2271 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc_1: 0.0667 - dense_1_acc_2: 0.4667 - dense_1_acc_3: 0.8000 - dense_1_acc_
4: 0.9667 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 0.9833 - dense_1_acc_7: 1.
```

```
0000 - dense 1 acc 8: 1.0000 - dense 1 acc 9: 1.0000 - dense 1 acc 10: 1.0000
- dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000 -
dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - den
se_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - dense
_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense_1
_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc_29: 0.9833 - dense_1_acc_30: 0.0000e+00
Epoch 48/100
60/60 [================ ] - 0s - loss: 11.7483 - dense 1 loss 1:
3.9226 - dense_1_loss_2: 2.1281 - dense_1_loss_3: 0.9608 - dense_1_loss_4: 0.
4342 - dense_1_loss_5: 0.3497 - dense_1_loss_6: 0.2261 - dense_1_loss_7: 0.18
15 - dense 1 loss 8: 0.1755 - dense 1 loss 9: 0.1796 - dense 1 loss 10: 0.154
0 - dense_1_loss_11: 0.1773 - dense_1_loss_12: 0.1464 - dense_1_loss_13: 0.12
41 - dense_1_loss_14: 0.1380 - dense_1_loss_15: 0.1469 - dense_1_loss_16: 0.1
554 - dense_1_loss_17: 0.1457 - dense_1_loss_18: 0.1452 - dense_1_loss_19: 0.
1520 - dense 1 loss 20: 0.1669 - dense 1 loss 21: 0.1673 - dense 1 loss 22:
0.1509 - dense_1_loss_23: 0.1566 - dense_1_loss_24: 0.1636 - dense_1_loss_2
5: 0.1867 - dense 1 loss 26: 0.1662 - dense 1 loss 27: 0.1722 - dense 1 loss
28: 0.1693 - dense_1_loss_29: 0.2055 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc_1: 0.0667 - dense_1_acc_2: 0.4833 - dense_1_acc_3: 0.8000 - dense_1_acc_
4: 0.9667 - dense 1 acc 5: 0.9833 - dense 1 acc 6: 0.9833 - dense 1 acc 7: 1.
0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.0000
- dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000 -
dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - den
se_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - dense
_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense_1
acc 26: 1.0000 - dense 1 acc 27: 1.0000 - dense 1 acc 28: 1.0000 - dense 1 a
cc_29: 0.9833 - dense_1_acc_30: 0.0000e+00
Epoch 49/100
60/60 [================== ] - 0s - loss: 11.3472 - dense 1 loss 1:
3.9181 - dense_1_loss_2: 2.0896 - dense_1_loss_3: 0.9246 - dense_1_loss_4: 0.
4102 - dense 1 loss 5: 0.3287 - dense 1 loss 6: 0.2096 - dense 1 loss 7: 0.16
86 - dense 1 loss 8: 0.1651 - dense 1 loss 9: 0.1638 - dense 1 loss 10: 0.143
3 - dense_1_loss_11: 0.1670 - dense_1_loss_12: 0.1357 - dense_1_loss_13: 0.11
62 - dense_1_loss_14: 0.1311 - dense_1_loss_15: 0.1379 - dense_1_loss_16: 0.1
420 - dense_1_loss_17: 0.1368 - dense_1_loss_18: 0.1357 - dense_1_loss_19: 0.
1416 - dense 1 loss 20: 0.1536 - dense 1 loss 21: 0.1578 - dense 1 loss 22:
0.1388 - dense_1_loss_23: 0.1475 - dense_1_loss_24: 0.1511 - dense_1_loss_2
5: 0.1701 - dense 1 loss 26: 0.1529 - dense 1 loss 27: 0.1587 - dense 1 loss
28: 0.1618 - dense_1_loss_29: 0.1891 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc_1: 0.0667 - dense_1_acc_2: 0.4833 - dense_1_acc_3: 0.8000 - dense_1_acc_
4: 0.9667 - dense 1 acc 5: 0.9833 - dense 1 acc 6: 0.9833 - dense 1 acc 7: 1.
0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.0000
- dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000 -
dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - den
se_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - dense
_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense_1
_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc 29: 0.9833 - dense 1 acc 30: 0.0000e+00
Epoch 50/100
60/60 [================== ] - 0s - loss: 10.9577 - dense 1 loss 1:
3.9135 - dense_1_loss_2: 2.0520 - dense_1_loss_3: 0.8919 - dense_1_loss_4: 0.
3833 - dense_1_loss_5: 0.3090 - dense_1_loss_6: 0.1965 - dense_1_loss_7: 0.15
68 - dense_1_loss_8: 0.1534 - dense_1_loss_9: 0.1523 - dense_1_loss_10: 0.133
```

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1 - dense 1 loss 11: 0.1508 - dense 1 loss 12: 0.1243 - dense 1 loss 13: 0.10
77 - dense_1_loss_14: 0.1248 - dense_1_loss_15: 0.1263 - dense_1_loss_16: 0.1
311 - dense 1 loss 17: 0.1267 - dense 1 loss 18: 0.1280 - dense 1 loss 19: 0.
1309 - dense_1_loss_20: 0.1431 - dense_1_loss_21: 0.1443 - dense_1_loss_22:
0.1309 - dense 1 loss 23: 0.1327 - dense 1 loss 24: 0.1396 - dense 1 loss 2
5: 0.1583 - dense_1_loss_26: 0.1423 - dense_1_loss_27: 0.1486 - dense_1_loss_
28: 0.1471 - dense 1 loss 29: 0.1786 - dense 1 loss 30: 0.0000e+00 - dense 1
acc_1: 0.0667 - dense_1_acc_2: 0.4833 - dense_1_acc_3: 0.8000 - dense_1_acc_
4: 0.9667 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 0.9833 - dense_1_acc_7: 1.
0000 - dense 1 acc 8: 1.0000 - dense 1 acc 9: 1.0000 - dense 1 acc 10: 1.0000
- dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000 -
dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - den
se_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - dense
_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense_1
_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc_29: 0.9833 - dense_1_acc_30: 0.0000e+00
Epoch 51/100
60/60 [================== ] - 0s - loss: 10.6144 - dense 1 loss 1:
3.9090 - dense_1_loss_2: 2.0147 - dense_1_loss_3: 0.8613 - dense_1_loss_4: 0.
3600 - dense_1_loss_5: 0.2925 - dense_1_loss_6: 0.1838 - dense_1_loss_7: 0.14
41 - dense 1 loss 8: 0.1441 - dense 1 loss 9: 0.1414 - dense 1 loss 10: 0.124
0 - dense_1_loss_11: 0.1374 - dense_1_loss_12: 0.1142 - dense_1_loss_13: 0.10
06 - dense_1_loss_14: 0.1168 - dense_1_loss_15: 0.1166 - dense_1_loss_16: 0.1
240 - dense_1_loss_17: 0.1190 - dense_1_loss_18: 0.1198 - dense_1_loss_19: 0.
1224 - dense_1_loss_20: 0.1329 - dense_1_loss_21: 0.1330 - dense_1_loss_22:
0.1241 - dense_1_loss_23: 0.1237 - dense_1_loss_24: 0.1304 - dense_1_loss_2
5: 0.1492 - dense_1_loss_26: 0.1332 - dense_1_loss_27: 0.1390 - dense_1_loss_
28: 0.1361 - dense 1 loss 29: 0.1671 - dense 1 loss 30: 0.0000e+00 - dense 1
acc_1: 0.0667 - dense_1_acc_2: 0.4833 - dense_1_acc_3: 0.8000 - dense_1_acc_
4: 0.9667 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 1.0000 - dense_1_acc_7: 1.
0000 - dense 1 acc 8: 1.0000 - dense 1 acc 9: 1.0000 - dense 1 acc 10: 1.0000
- dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000 -
dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - den
se_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - dense
_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense_1
_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc 29: 0.9833 - dense 1 acc 30: 0.0000e+00
Epoch 52/100
60/60 [================== ] - 0s - loss: 10.2921 - dense 1 loss 1:
3.9050 - dense 1 loss 2: 1.9805 - dense 1 loss 3: 0.8312 - dense 1 loss 4: 0.
3402 - dense_1_loss_5: 0.2766 - dense_1_loss_6: 0.1706 - dense_1_loss_7: 0.13
45 - dense 1 loss 8: 0.1362 - dense 1 loss 9: 0.1300 - dense 1 loss 10: 0.114
5 - dense_1_loss_11: 0.1281 - dense_1_loss_12: 0.1068 - dense_1_loss_13: 0.09
26 - dense 1 loss 14: 0.1078 - dense 1 loss 15: 0.1093 - dense 1 loss 16: 0.1
144 - dense_1_loss_17: 0.1105 - dense_1_loss_18: 0.1115 - dense_1_loss_19: 0.
1154 - dense 1 loss 20: 0.1215 - dense 1 loss 21: 0.1247 - dense 1 loss 22:
0.1141 - dense_1_loss_23: 0.1168 - dense_1_loss_24: 0.1223 - dense_1_loss_2
5: 0.1400 - dense_1_loss_26: 0.1249 - dense_1_loss_27: 0.1288 - dense_1_loss_
28: 0.1294 - dense 1 loss 29: 0.1539 - dense 1 loss 30: 0.0000e+00 - dense 1
acc_1: 0.0667 - dense_1_acc_2: 0.5000 - dense_1_acc_3: 0.8000 - dense_1_acc_
4: 0.9667 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 1.0000 - dense_1_acc_7: 1.
0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.0000
- dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000 -
dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - den
```

```
se 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - dense
_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense_1
_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc 29: 0.9833 - dense 1 acc 30: 0.0000e+00
Epoch 53/100
60/60 [========================== ] - 0s - loss: 10.0141 - dense_1_loss_1:
3.9004 - dense 1 loss 2: 1.9461 - dense 1 loss 3: 0.8035 - dense 1 loss 4: 0.
3233 - dense_1_loss_5: 0.2619 - dense_1_loss_6: 0.1598 - dense_1_loss_7: 0.12
80 - dense_1_loss_8: 0.1290 - dense_1_loss_9: 0.1224 - dense_1_loss_10: 0.108
4 - dense 1 loss 11: 0.1203 - dense 1 loss 12: 0.1010 - dense 1 loss 13: 0.08
72 - dense_1_loss_14: 0.1016 - dense_1_loss_15: 0.1033 - dense_1_loss_16: 0.1
070 - dense_1_loss_17: 0.1036 - dense_1_loss_18: 0.1036 - dense_1_loss_19: 0.
1084 - dense_1_loss_20: 0.1144 - dense_1_loss_21: 0.1167 - dense_1_loss_22:
0.1059 - dense_1_loss_23: 0.1094 - dense_1_loss_24: 0.1155 - dense_1_loss_2
5: 0.1311 - dense_1_loss_26: 0.1167 - dense_1_loss_27: 0.1200 - dense_1_loss_
28: 0.1227 - dense_1_loss_29: 0.1430 - dense_1_loss_30: 0.0000e+00 - dense_1_
acc 1: 0.0667 - dense 1 acc 2: 0.5000 - dense 1 acc 3: 0.8000 - dense 1 acc
4: 0.9667 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 1.0000 - dense_1_acc_7: 1.
0000 - dense 1 acc 8: 1.0000 - dense 1 acc 9: 1.0000 - dense 1 acc 10: 1.0000
- dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000 -
 dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 - d
ense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - den
se_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - dense
_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense_1
_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1_a
cc_29: 0.9833 - dense_1_acc_30: 0.0000e+00
Epoch 54/100
3.8963 - dense 1 loss 2: 1.9140 - dense 1 loss 3: 0.7767 - dense 1 loss 4:
0.3063 - dense_1_loss_5: 0.2465 - dense_1_loss_6: 0.1503 - dense_1_loss_7:
0.1220 - dense_1_loss_8: 0.1210 - dense_1_loss_9: 0.1153 - dense_1_loss_10:
0.1031 - dense_1_loss_11: 0.1112 - dense_1_loss_12: 0.0954 - dense_1_loss_1
3: 0.0826 - dense_1_loss_14: 0.0962 - dense_1_loss_15: 0.0974 - dense_1_loss_
16: 0.1000 - dense_1_loss_17: 0.0970 - dense_1_loss_18: 0.0970 - dense_1_loss
19: 0.1005 - dense 1 loss 20: 0.1091 - dense 1 loss 21: 0.1090 - dense 1 los
s_22: 0.0993 - dense_1_loss_23: 0.1008 - dense_1_loss_24: 0.1075 - dense_1_lo
ss_25: 0.1215 - dense_1_loss_26: 0.1075 - dense_1_loss_27: 0.1125 - dense_1_1
oss_28: 0.1136 - dense_1_loss_29: 0.1344 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5000 - dense_1_acc_3: 0.8000 - dense_1_a
cc_4: 0.9667 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense 1 acc 8: 1.0000 - dense 1 acc 9: 1.0000 - dense 1 acc 10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
 dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 0.9833 - dense_1_acc_30: 0.0000e+00
Epoch 55/100
3.8921 - dense 1 loss 2: 1.8816 - dense 1 loss 3: 0.7519 - dense 1 loss 4:
0.2907 - dense_1_loss_5: 0.2345 - dense_1_loss_6: 0.1425 - dense_1_loss_7:
0.1149 - dense_1_loss_8: 0.1150 - dense_1_loss_9: 0.1094 - dense_1_loss_10:
0.0968 - dense 1 loss 11: 0.1040 - dense 1 loss 12: 0.0894 - dense 1 loss 1
3: 0.0779 - dense_1_loss_14: 0.0912 - dense_1_loss_15: 0.0911 - dense_1_loss_
16: 0.0944 - dense_1_loss_17: 0.0910 - dense_1_loss_18: 0.0911 - dense_1_loss
_19: 0.0946 - dense_1_loss_20: 0.1031 - dense_1_loss_21: 0.1027 - dense_1_los
```

```
s 22: 0.0934 - dense 1 loss 23: 0.0947 - dense 1 loss 24: 0.1010 - dense 1 lo
ss_25: 0.1143 - dense_1_loss_26: 0.1018 - dense_1_loss_27: 0.1060 - dense_1_1
oss 28: 0.1060 - dense 1 loss 29: 0.1271 - dense 1 loss 30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5000 - dense_1_acc_3: 0.8167 - dense_1_a
cc 4: 0.9667 - dense 1 acc 5: 0.9833 - dense 1 acc 6: 1.0000 - dense 1 acc 7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
 dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 0.9833 - dense 1 acc 30: 0.0000e+00
Epoch 56/100
3.8882 - dense 1 loss 2: 1.8519 - dense 1 loss 3: 0.7275 - dense 1 loss 4:
 0.2753 - dense 1 loss 5: 0.2216 - dense 1 loss 6: 0.1332 - dense 1 loss 7:
0.1076 - dense_1_loss_8: 0.1083 - dense_1_loss_9: 0.1022 - dense_1_loss_10:
0.0906 - dense 1 loss 11: 0.0964 - dense 1 loss 12: 0.0838 - dense 1 loss 1
3: 0.0725 - dense_1_loss_14: 0.0851 - dense_1_loss_15: 0.0861 - dense_1_loss_
16: 0.0891 - dense_1_loss_17: 0.0857 - dense_1_loss_18: 0.0855 - dense_1_loss
_19: 0.0894 - dense_1_loss_20: 0.0963 - dense_1_loss_21: 0.0973 - dense_1_los
s_22: 0.0877 - dense_1_loss_23: 0.0904 - dense_1_loss_24: 0.0952 - dense_1_lo
ss_25: 0.1069 - dense_1_loss_26: 0.0968 - dense_1_loss_27: 0.1000 - dense_1_l
oss_28: 0.1005 - dense_1_loss_29: 0.1187 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5000 - dense_1_acc_3: 0.8167 - dense_1_a
cc_4: 0.9667 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
 dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 57/100
3.8841 - dense_1_loss_2: 1.8214 - dense_1_loss_3: 0.7045 - dense_1_loss_4:
0.2622 - dense 1 loss 5: 0.2113 - dense 1 loss 6: 0.1259 - dense 1 loss 7:
0.1017 - dense_1_loss_8: 0.1031 - dense_1_loss_9: 0.0957 - dense_1_loss_10:
 0.0855 - dense 1 loss 11: 0.0908 - dense 1 loss 12: 0.0794 - dense 1 loss 1
3: 0.0684 - dense_1_loss_14: 0.0802 - dense_1_loss_15: 0.0820 - dense_1_loss_
16: 0.0844 - dense_1_loss_17: 0.0809 - dense_1_loss_18: 0.0805 - dense_1_loss
19: 0.0855 - dense 1 loss 20: 0.0906 - dense 1 loss 21: 0.0917 - dense 1 los
s_22: 0.0826 - dense_1_loss_23: 0.0872 - dense_1_loss_24: 0.0910 - dense_1_lo
ss 25: 0.1012 - dense 1 loss 26: 0.0921 - dense 1 loss 27: 0.0943 - dense 1 l
oss_28: 0.0967 - dense_1_loss_29: 0.1114 - dense_1_loss_30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.5000 - dense 1 acc 3: 0.8333 - dense 1 a
cc_4: 0.9667 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
 dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
```

```
Epoch 58/100
3.8799 - dense 1 loss 2: 1.7931 - dense 1 loss 3: 0.6850 - dense 1 loss 4:
0.2498 - dense_1_loss_5: 0.2013 - dense_1_loss_6: 0.1199 - dense_1_loss_7:
0.0965 - dense 1 loss 8: 0.0979 - dense 1 loss 9: 0.0904 - dense 1 loss 10:
0.0810 - dense_1_loss_11: 0.0855 - dense_1_loss_12: 0.0752 - dense_1_loss_1
3: 0.0649 - dense 1 loss 14: 0.0762 - dense 1 loss 15: 0.0775 - dense 1 loss
16: 0.0800 - dense_1_loss_17: 0.0766 - dense_1_loss_18: 0.0761 - dense_1_loss
_19: 0.0807 - dense_1_loss_20: 0.0865 - dense_1_loss_21: 0.0857 - dense_1_los
s 22: 0.0781 - dense 1 loss 23: 0.0818 - dense 1 loss 24: 0.0858 - dense 1 lo
ss_25: 0.0955 - dense_1_loss_26: 0.0863 - dense_1_loss_27: 0.0891 - dense_1_l
oss_28: 0.0914 - dense_1_loss_29: 0.1045 - dense_1_loss_30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.5000 - dense 1 acc 3: 0.8333 - dense 1 a
cc_4: 0.9667 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 59/100
3.8763 - dense_1_loss_2: 1.7663 - dense_1_loss_3: 0.6633 - dense_1_loss_4:
0.2389 - dense_1_loss_5: 0.1912 - dense_1_loss_6: 0.1147 - dense_1_loss_7:
0.0920 - dense_1_loss_8: 0.0929 - dense_1_loss_9: 0.0861 - dense_1_loss_10:
0.0769 - dense_1_loss_11: 0.0811 - dense_1_loss_12: 0.0713 - dense_1_loss_1
3: 0.0621 - dense 1 loss 14: 0.0728 - dense 1 loss 15: 0.0734 - dense 1 loss
16: 0.0756 - dense_1_loss_17: 0.0725 - dense_1_loss_18: 0.0725 - dense_1_loss
_19: 0.0754 - dense_1_loss_20: 0.0825 - dense_1_loss_21: 0.0807 - dense_1_los
s_22: 0.0739 - dense_1_loss_23: 0.0766 - dense_1_loss_24: 0.0809 - dense_1_lo
ss_25: 0.0903 - dense_1_loss_26: 0.0802 - dense_1_loss_27: 0.0840 - dense_1_l
oss_28: 0.0860 - dense_1_loss_29: 0.0983 - dense_1_loss_30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.5000 - dense 1 acc 3: 0.8333 - dense 1 a
cc_4: 0.9667 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 60/100
3.8722 - dense_1_loss_2: 1.7392 - dense_1_loss_3: 0.6442 - dense_1_loss_4:
0.2282 - dense_1_loss_5: 0.1817 - dense_1_loss_6: 0.1092 - dense_1_loss_7:
0.0880 - dense_1_loss_8: 0.0883 - dense_1_loss_9: 0.0817 - dense_1_loss_10:
0.0731 - dense_1_loss_11: 0.0772 - dense_1_loss_12: 0.0676 - dense_1_loss_1
3: 0.0593 - dense 1 loss 14: 0.0693 - dense 1 loss 15: 0.0698 - dense 1 loss
16: 0.0716 - dense_1_loss_17: 0.0688 - dense_1_loss_18: 0.0693 - dense_1_loss
_19: 0.0711 - dense_1_loss_20: 0.0778 - dense_1_loss_21: 0.0774 - dense_1_los
s_22: 0.0705 - dense_1_loss_23: 0.0723 - dense_1_loss_24: 0.0764 - dense_1_lo
ss_25: 0.0862 - dense_1_loss_26: 0.0759 - dense_1_loss_27: 0.0800 - dense_1_1
oss_28: 0.0821 - dense_1_loss_29: 0.0939 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5000 - dense_1_acc_3: 0.8500 - dense_1_a
```

```
cc 4: 0.9667 - dense 1 acc 5: 0.9833 - dense 1 acc 6: 1.0000 - dense 1 acc 7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 61/100
3.8683 - dense_1_loss_2: 1.7143 - dense_1_loss_3: 0.6263 - dense_1_loss_4:
0.2174 - dense 1 loss 5: 0.1744 - dense 1 loss 6: 0.1037 - dense 1 loss 7:
0.0844 - dense_1_loss_8: 0.0846 - dense_1_loss_9: 0.0780 - dense_1_loss_10:
0.0695 - dense_1_loss_11: 0.0732 - dense_1_loss_12: 0.0641 - dense_1_loss_1
3: 0.0561 - dense_1_loss_14: 0.0653 - dense_1_loss_15: 0.0668 - dense_1_loss_
16: 0.0681 - dense 1 loss 17: 0.0652 - dense 1 loss 18: 0.0655 - dense 1 loss
_19: 0.0676 - dense_1_loss_20: 0.0736 - dense_1_loss_21: 0.0736 - dense_1_los
s 22: 0.0665 - dense 1 loss 23: 0.0692 - dense 1 loss 24: 0.0725 - dense 1 lo
ss_25: 0.0823 - dense_1_loss_26: 0.0721 - dense_1_loss_27: 0.0759 - dense_1_l
oss_28: 0.0785 - dense_1_loss_29: 0.0888 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5000 - dense_1_acc_3: 0.8667 - dense_1_a
cc_4: 0.9667 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se 1 acc 23: 1.0000 - dense 1 acc 24: 1.0000 - dense 1 acc 25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 62/100
3.8644 - dense 1 loss 2: 1.6887 - dense 1 loss 3: 0.6089 - dense 1 loss 4:
0.2094 - dense 1 loss 5: 0.1674 - dense 1 loss 6: 0.0985 - dense 1 loss 7:
0.0808 - dense_1_loss_8: 0.0810 - dense_1_loss_9: 0.0744 - dense_1_loss_10:
0.0667 - dense_1_loss_11: 0.0697 - dense_1_loss_12: 0.0613 - dense_1_loss_1
3: 0.0534 - dense_1_loss_14: 0.0621 - dense_1_loss_15: 0.0642 - dense_1_loss_
16: 0.0653 - dense_1_loss_17: 0.0620 - dense_1_loss_18: 0.0620 - dense_1_loss
_19: 0.0650 - dense_1_loss_20: 0.0705 - dense_1_loss_21: 0.0700 - dense_1_los
s 22: 0.0630 - dense 1 loss 23: 0.0667 - dense 1 loss 24: 0.0695 - dense 1 lo
ss_25: 0.0785 - dense_1_loss_26: 0.0692 - dense_1_loss_27: 0.0724 - dense_1_1
oss_28: 0.0752 - dense_1_loss_29: 0.0842 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5000 - dense_1_acc_3: 0.8667 - dense_1_a
cc_4: 0.9833 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense 1 acc 8: 1.0000 - dense 1 acc 9: 1.0000 - dense 1 acc 10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se 1 acc 23: 1.0000 - dense 1 acc 24: 1.0000 - dense 1 acc 25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 63/100
3.8608 - dense_1_loss_2: 1.6648 - dense_1_loss_3: 0.5922 - dense_1_loss_4:
0.2009 - dense_1_loss_5: 0.1600 - dense_1_loss_6: 0.0944 - dense_1_loss_7:
```

```
0.0775 - dense 1 loss 8: 0.0773 - dense 1 loss 9: 0.0709 - dense 1 loss 10:
0.0637 - dense_1_loss_11: 0.0660 - dense_1_loss_12: 0.0585 - dense_1_loss_1
3: 0.0510 - dense 1 loss 14: 0.0595 - dense 1 loss 15: 0.0613 - dense 1 loss
16: 0.0625 - dense_1_loss_17: 0.0591 - dense_1_loss_18: 0.0589 - dense_1_loss
19: 0.0622 - dense 1 loss 20: 0.0674 - dense 1 loss 21: 0.0664 - dense 1 los
s_22: 0.0602 - dense_1_loss_23: 0.0635 - dense_1_loss_24: 0.0665 - dense_1_lo
ss_25: 0.0745 - dense_1_loss_26: 0.0659 - dense_1_loss_27: 0.0690 - dense_1_l
oss_28: 0.0716 - dense_1_loss_29: 0.0800 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5167 - dense_1_acc_3: 0.8667 - dense_1_a
cc 4: 1.0000 - dense 1 acc 5: 0.9833 - dense 1 acc 6: 1.0000 - dense 1 acc 7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
1 acc 26: 1.0000 - dense 1 acc 27: 1.0000 - dense 1 acc 28: 1.0000 - dense 1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 64/100
3.8568 - dense_1_loss_2: 1.6423 - dense_1_loss_3: 0.5754 - dense_1_loss_4:
0.1932 - dense_1_loss_5: 0.1526 - dense_1_loss_6: 0.0907 - dense_1_loss_7:
0.0743 - dense_1_loss_8: 0.0737 - dense_1_loss_9: 0.0679 - dense_1_loss_10:
0.0610 - dense_1_loss_11: 0.0628 - dense_1_loss_12: 0.0556 - dense_1_loss_1
3: 0.0490 - dense_1_loss_14: 0.0573 - dense_1_loss_15: 0.0583 - dense_1_loss_
16: 0.0597 - dense_1_loss_17: 0.0565 - dense_1_loss_18: 0.0565 - dense_1_loss
_19: 0.0590 - dense_1_loss_20: 0.0646 - dense_1_loss_21: 0.0634 - dense_1_los
s_22: 0.0580 - dense_1_loss_23: 0.0602 - dense_1_loss_24: 0.0638 - dense_1_lo
ss 25: 0.0708 - dense 1 loss 26: 0.0627 - dense 1 loss 27: 0.0657 - dense 1 l
oss_28: 0.0682 - dense_1_loss_29: 0.0766 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5167 - dense_1_acc_3: 0.8667 - dense_1_a
cc_4: 1.0000 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000
- dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 65/100
3.8533 - dense_1_loss_2: 1.6196 - dense_1_loss_3: 0.5610 - dense_1_loss_4:
0.1863 - dense 1 loss 5: 0.1463 - dense 1 loss 6: 0.0875 - dense 1 loss 7:
0.0714 - dense_1_loss_8: 0.0708 - dense_1_loss_9: 0.0649 - dense_1_loss_10:
0.0583 - dense 1 loss 11: 0.0603 - dense 1 loss 12: 0.0534 - dense 1 loss 1
3: 0.0471 - dense_1_loss_14: 0.0552 - dense_1_loss_15: 0.0558 - dense_1_loss_
16: 0.0569 - dense 1 loss 17: 0.0541 - dense 1 loss 18: 0.0544 - dense 1 loss
_19: 0.0563 - dense_1_loss_20: 0.0616 - dense_1_loss_21: 0.0609 - dense_1_los
s_22: 0.0557 - dense_1_loss_23: 0.0576 - dense_1_loss_24: 0.0610 - dense_1_lo
ss 25: 0.0674 - dense 1 loss 26: 0.0596 - dense 1 loss 27: 0.0629 - dense 1 l
oss_28: 0.0650 - dense_1_loss_29: 0.0734 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5167 - dense_1_acc_3: 0.8667 - dense_1_a
cc 4: 1.0000 - dense 1 acc 5: 0.9833 - dense 1 acc 6: 1.0000 - dense 1 acc 7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
```

```
dense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 66/100
3.8495 - dense_1_loss_2: 1.5979 - dense_1_loss_3: 0.5463 - dense_1_loss_4:
0.1794 - dense_1_loss_5: 0.1403 - dense_1_loss_6: 0.0842 - dense_1_loss_7:
0.0685 - dense 1 loss 8: 0.0682 - dense 1 loss 9: 0.0621 - dense 1 loss 10:
0.0558 - dense 1 loss 11: 0.0577 - dense 1 loss 12: 0.0512 - dense 1 loss 1
3: 0.0452 - dense_1_loss_14: 0.0530 - dense_1_loss_15: 0.0534 - dense_1_loss_
16: 0.0545 - dense_1_loss_17: 0.0518 - dense_1_loss_18: 0.0519 - dense_1_loss
_19: 0.0540 - dense_1_loss_20: 0.0590 - dense_1_loss_21: 0.0584 - dense_1_los
s_22: 0.0532 - dense_1_loss_23: 0.0554 - dense_1_loss_24: 0.0587 - dense_1_lo
ss_25: 0.0646 - dense_1_loss_26: 0.0569 - dense_1_loss_27: 0.0600 - dense_1_l
oss 28: 0.0625 - dense 1 loss 29: 0.0702 - dense 1 loss 30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5333 - dense_1_acc_3: 0.8667 - dense_1_a
cc 4: 1.0000 - dense 1 acc 5: 0.9833 - dense 1 acc 6: 1.0000 - dense 1 acc 7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 -
dense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 67/100
3.8456 - dense 1 loss 2: 1.5765 - dense 1 loss 3: 0.5328 - dense 1 loss 4:
0.1733 - dense_1_loss_5: 0.1358 - dense_1_loss_6: 0.0810 - dense_1_loss_7:
0.0662 - dense_1_loss_8: 0.0660 - dense_1_loss_9: 0.0599 - dense_1_loss_10:
0.0537 - dense_1_loss_11: 0.0553 - dense_1_loss_12: 0.0492 - dense_1_loss_1
3: 0.0432 - dense 1 loss 14: 0.0507 - dense 1 loss 15: 0.0514 - dense 1 loss
16: 0.0523 - dense_1_loss_17: 0.0497 - dense_1_loss_18: 0.0495 - dense_1_loss
_19: 0.0521 - dense_1_loss_20: 0.0566 - dense_1_loss_21: 0.0559 - dense_1_los
s_22: 0.0507 - dense_1_loss_23: 0.0535 - dense_1_loss_24: 0.0562 - dense_1_lo
ss_25: 0.0619 - dense_1_loss_26: 0.0545 - dense_1_loss_27: 0.0577 - dense_1_1
oss 28: 0.0602 - dense 1 loss 29: 0.0669 - dense 1 loss 30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5333 - dense_1_acc_3: 0.8833 - dense_1_a
cc 4: 1.0000 - dense 1 acc 5: 0.9833 - dense 1 acc 6: 1.0000 - dense 1 acc 7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 68/100
3.8421 - dense_1_loss_2: 1.5559 - dense_1_loss_3: 0.5194 - dense_1_loss_4:
0.1675 - dense_1_loss_5: 0.1305 - dense_1_loss_6: 0.0781 - dense_1_loss_7:
0.0638 - dense 1 loss 8: 0.0635 - dense 1 loss 9: 0.0579 - dense 1 loss 10:
0.0518 - dense_1_loss_11: 0.0532 - dense_1_loss_12: 0.0474 - dense_1_loss_1
3: 0.0413 - dense_1_loss_14: 0.0487 - dense_1_loss_15: 0.0496 - dense_1_loss_
16: 0.0502 - dense_1_loss_17: 0.0481 - dense_1_loss_18: 0.0473 - dense_1_loss
```

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_19: 0.0503 - dense_1_loss_20: 0.0546 - dense_1_loss_21: 0.0536 - dense_1_los
s_22: 0.0487 - dense_1_loss_23: 0.0517 - dense_1_loss_24: 0.0540 - dense_1_lo
ss_25: 0.0595 - dense_1_loss_26: 0.0525 - dense_1_loss_27: 0.0554 - dense_1_1
oss_28: 0.0579 - dense_1_loss_29: 0.0642 - dense_1_loss_30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.5333 - dense 1 acc 3: 0.8833 - dense 1 a
cc_4: 1.0000 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
1 acc 26: 1.0000 - dense 1 acc 27: 1.0000 - dense 1 acc 28: 1.0000 - dense 1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 69/100
3.8386 - dense 1 loss 2: 1.5362 - dense 1 loss 3: 0.5068 - dense 1 loss 4:
0.1618 - dense_1_loss_5: 0.1252 - dense_1_loss_6: 0.0753 - dense_1_loss_7:
0.0617 - dense 1 loss 8: 0.0608 - dense 1 loss 9: 0.0559 - dense 1 loss 10:
0.0500 - dense_1_loss_11: 0.0509 - dense_1_loss_12: 0.0455 - dense_1_loss_1
3: 0.0398 - dense_1_loss_14: 0.0467 - dense_1_loss_15: 0.0479 - dense_1_loss_
16: 0.0483 - dense 1 loss 17: 0.0462 - dense 1 loss 18: 0.0457 - dense 1 loss
_19: 0.0481 - dense_1_loss_20: 0.0527 - dense_1_loss_21: 0.0514 - dense_1_los
s_22: 0.0468 - dense_1_loss_23: 0.0496 - dense_1_loss_24: 0.0520 - dense_1_lo
ss_25: 0.0571 - dense_1_loss_26: 0.0503 - dense_1_loss_27: 0.0532 - dense_1_l
oss_28: 0.0557 - dense_1_loss_29: 0.0619 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5667 - dense_1_acc_3: 0.8833 - dense_1_a
cc_4: 1.0000 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense 1 acc 8: 1.0000 - dense 1 acc 9: 1.0000 - dense 1 acc 10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
1 acc 26: 1.0000 - dense 1 acc 27: 1.0000 - dense 1 acc 28: 1.0000 - dense 1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 70/100
3.8350 - dense 1 loss 2: 1.5165 - dense 1 loss 3: 0.4945 - dense 1 loss 4:
0.1571 - dense_1_loss_5: 0.1207 - dense_1_loss_6: 0.0729 - dense_1_loss_7:
0.0597 - dense 1 loss 8: 0.0585 - dense 1 loss 9: 0.0540 - dense 1 loss 10:
0.0482 - dense_1_loss_11: 0.0491 - dense_1_loss_12: 0.0439 - dense_1_loss_1
3: 0.0384 - dense_1_loss_14: 0.0451 - dense_1_loss_15: 0.0461 - dense_1_loss_
16: 0.0465 - dense_1_loss_17: 0.0445 - dense_1_loss_18: 0.0442 - dense_1_loss
_19: 0.0462 - dense_1_loss_20: 0.0507 - dense_1_loss_21: 0.0496 - dense_1_los
s_22: 0.0453 - dense_1_loss_23: 0.0476 - dense_1_loss_24: 0.0500 - dense_1_lo
ss_25: 0.0551 - dense_1_loss_26: 0.0483 - dense_1_loss_27: 0.0514 - dense_1_l
oss 28: 0.0536 - dense 1 loss 29: 0.0598 - dense 1 loss 30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5833 - dense_1_acc_3: 0.8833 - dense_1_a
cc_4: 1.0000 - dense_1_acc_5: 0.9833 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense 1 acc 8: 1.0000 - dense 1 acc 9: 1.0000 - dense 1 acc 10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
```

```
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 71/100
3.8314 - dense 1 loss 2: 1.4982 - dense 1 loss 3: 0.4828 - dense 1 loss 4:
0.1520 - dense 1 loss 5: 0.1162 - dense 1 loss 6: 0.0707 - dense 1 loss 7:
0.0576 - dense_1_loss_8: 0.0565 - dense_1_loss_9: 0.0520 - dense_1_loss_10:
0.0465 - dense 1 loss 11: 0.0474 - dense 1 loss 12: 0.0424 - dense 1 loss 1
3: 0.0371 - dense_1_loss_14: 0.0437 - dense_1_loss_15: 0.0443 - dense_1_loss_
16: 0.0450 - dense_1_loss_17: 0.0428 - dense_1_loss_18: 0.0425 - dense_1_loss
19: 0.0444 - dense 1 loss 20: 0.0488 - dense 1 loss 21: 0.0479 - dense 1 los
s_22: 0.0438 - dense_1_loss_23: 0.0458 - dense_1_loss_24: 0.0481 - dense_1_lo
ss_25: 0.0530 - dense_1_loss_26: 0.0464 - dense_1_loss_27: 0.0495 - dense_1_l
oss 28: 0.0514 - dense 1 loss 29: 0.0577 - dense 1 loss 30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5833 - dense_1_acc_3: 0.8833 - dense_1_a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
1 acc 26: 1.0000 - dense 1 acc 27: 1.0000 - dense 1 acc 28: 1.0000 - dense 1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 72/100
3.8281 - dense_1_loss_2: 1.4793 - dense_1_loss_3: 0.4715 - dense_1_loss_4:
0.1481 - dense 1 loss 5: 0.1122 - dense 1 loss 6: 0.0685 - dense 1 loss 7:
0.0558 - dense_1_loss_8: 0.0546 - dense_1_loss_9: 0.0503 - dense_1_loss_10:
0.0449 - dense 1 loss 11: 0.0458 - dense 1 loss 12: 0.0409 - dense 1 loss 1
3: 0.0358 - dense_1_loss_14: 0.0422 - dense_1_loss_15: 0.0428 - dense_1_loss_
16: 0.0435 - dense_1_loss_17: 0.0412 - dense_1_loss_18: 0.0409 - dense_1_loss
19: 0.0429 - dense 1 loss 20: 0.0471 - dense 1 loss 21: 0.0462 - dense 1 los
s_22: 0.0422 - dense_1_loss_23: 0.0442 - dense_1_loss_24: 0.0466 - dense_1_lo
ss_25: 0.0511 - dense_1_loss_26: 0.0447 - dense_1_loss_27: 0.0475 - dense_1_l
oss 28: 0.0496 - dense 1 loss 29: 0.0555 - dense 1 loss 30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.5833 - dense_1_acc_3: 0.8833 - dense_1_a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 73/100
3.8245 - dense 1 loss 2: 1.4615 - dense 1 loss 3: 0.4617 - dense 1 loss 4:
0.1440 - dense_1_loss_5: 0.1088 - dense_1_loss_6: 0.0664 - dense_1_loss_7:
0.0541 - dense_1_loss_8: 0.0530 - dense_1_loss_9: 0.0486 - dense_1_loss_10:
0.0434 - dense 1 loss 11: 0.0442 - dense 1 loss 12: 0.0395 - dense 1 loss 1
3: 0.0346 - dense_1_loss_14: 0.0407 - dense_1_loss_15: 0.0414 - dense_1_loss_
16: 0.0421 - dense_1_loss_17: 0.0397 - dense_1_loss_18: 0.0393 - dense_1_loss
19: 0.0417 - dense 1 loss 20: 0.0455 - dense 1 loss 21: 0.0445 - dense 1 los
s_22: 0.0406 - dense_1_loss_23: 0.0429 - dense_1_loss_24: 0.0452 - dense_1_lo
ss_25: 0.0493 - dense_1_loss_26: 0.0431 - dense_1_loss_27: 0.0458 - dense_1_l
oss_28: 0.0480 - dense_1_loss_29: 0.0534 - dense_1_loss_30: 0.0000e+00 - dens
```

```
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.5833 - dense 1 acc 3: 0.8833 - dense 1 a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 74/100
3.8210 - dense 1 loss 2: 1.4445 - dense 1 loss 3: 0.4508 - dense 1 loss 4:
0.1395 - dense_1_loss_5: 0.1050 - dense_1_loss_6: 0.0645 - dense_1_loss_7:
0.0525 - dense_1_loss_8: 0.0512 - dense_1_loss_9: 0.0470 - dense_1_loss_10:
0.0420 - dense 1 loss 11: 0.0427 - dense 1 loss 12: 0.0382 - dense 1 loss 1
3: 0.0335 - dense 1 loss 14: 0.0394 - dense 1 loss 15: 0.0402 - dense 1 loss
16: 0.0407 - dense_1_loss_17: 0.0384 - dense_1_loss_18: 0.0379 - dense_1_loss
19: 0.0403 - dense 1 loss 20: 0.0439 - dense 1 loss 21: 0.0430 - dense 1 los
s_22: 0.0392 - dense_1_loss_23: 0.0417 - dense_1_loss_24: 0.0436 - dense_1_lo
ss_25: 0.0477 - dense_1_loss_26: 0.0417 - dense_1_loss_27: 0.0444 - dense_1_l
oss 28: 0.0464 - dense 1 loss 29: 0.0516 - dense 1 loss 30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.5833 - dense 1 acc 3: 0.8833 - dense 1 a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 75/100
3.8179 - dense 1 loss 2: 1.4277 - dense 1 loss 3: 0.4409 - dense 1 loss 4:
0.1359 - dense_1_loss_5: 0.1018 - dense_1_loss_6: 0.0625 - dense_1_loss_7:
0.0509 - dense_1_loss_8: 0.0496 - dense_1_loss_9: 0.0456 - dense_1_loss_10:
0.0408 - dense_1_loss_11: 0.0413 - dense_1_loss_12: 0.0369 - dense_1_loss_1
3: 0.0325 - dense_1_loss_14: 0.0382 - dense_1_loss_15: 0.0389 - dense_1_loss_
16: 0.0395 - dense_1_loss_17: 0.0372 - dense_1_loss_18: 0.0367 - dense_1_loss
19: 0.0390 - dense 1 loss 20: 0.0426 - dense 1 loss 21: 0.0416 - dense 1 los
s_22: 0.0380 - dense_1_loss_23: 0.0404 - dense_1_loss_24: 0.0422 - dense_1_lo
ss_25: 0.0462 - dense_1_loss_26: 0.0403 - dense_1_loss_27: 0.0432 - dense_1_1
oss 28: 0.0449 - dense 1 loss 29: 0.0502 - dense 1 loss 30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.6000 - dense_1_acc_3: 0.8833 - dense_1_a
cc 4: 1.0000 - dense 1 acc 5: 1.0000 - dense 1 acc 6: 1.0000 - dense 1 acc 7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 76/100
3.8145 - dense_1_loss_2: 1.4116 - dense_1_loss_3: 0.4309 - dense_1_loss_4:
```

```
0.1323 - dense 1 loss 5: 0.0986 - dense 1 loss 6: 0.0607 - dense 1 loss 7:
0.0494 - dense_1_loss_8: 0.0482 - dense_1_loss_9: 0.0443 - dense_1_loss_10:
0.0397 - dense_1_loss_11: 0.0399 - dense_1_loss_12: 0.0358 - dense_1_loss_1
3: 0.0315 - dense_1_loss_14: 0.0371 - dense_1_loss_15: 0.0376 - dense_1_loss_
16: 0.0382 - dense 1 loss 17: 0.0360 - dense 1 loss 18: 0.0355 - dense 1 loss
_19: 0.0377 - dense_1_loss_20: 0.0413 - dense_1_loss_21: 0.0403 - dense_1_los
s 22: 0.0368 - dense 1 loss 23: 0.0390 - dense 1 loss 24: 0.0408 - dense 1 lo
ss_25: 0.0447 - dense_1_loss_26: 0.0391 - dense_1_loss_27: 0.0417 - dense_1_1
oss_28: 0.0435 - dense_1_loss_29: 0.0485 - dense_1_loss_30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.6333 - dense 1 acc 3: 0.8833 - dense 1 a
cc 4: 1.0000 - dense 1 acc 5: 1.0000 - dense 1 acc 6: 1.0000 - dense 1 acc 7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
 dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se 1 acc 23: 1.0000 - dense 1 acc 24: 1.0000 - dense 1 acc 25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 77/100
60/60 [============== ] - 0s - loss: 6.8131 - dense_1_loss_1:
 3.8113 - dense 1 loss 2: 1.3959 - dense_1_loss_3: 0.4224 - dense_1_loss_4:
0.1292 - dense_1_loss_5: 0.0961 - dense_1_loss_6: 0.0591 - dense_1_loss_7:
0.0481 - dense_1_loss_8: 0.0469 - dense_1_loss_9: 0.0432 - dense_1_loss_10:
 0.0385 - dense_1_loss_11: 0.0387 - dense_1_loss_12: 0.0348 - dense_1_loss_1
3: 0.0306 - dense_1_loss_14: 0.0360 - dense_1_loss_15: 0.0365 - dense_1_loss_
16: 0.0371 - dense_1_loss_17: 0.0350 - dense_1_loss_18: 0.0345 - dense_1_loss
_19: 0.0365 - dense_1_loss_20: 0.0401 - dense_1_loss_21: 0.0390 - dense_1_los
s 22: 0.0357 - dense 1 loss 23: 0.0378 - dense 1 loss 24: 0.0395 - dense 1 lo
ss_25: 0.0433 - dense_1_loss_26: 0.0379 - dense_1_loss_27: 0.0404 - dense_1_l
oss_28: 0.0421 - dense_1_loss_29: 0.0470 - dense_1_loss_30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.6333 - dense 1 acc 3: 0.8833 - dense 1 a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 78/100
3.8078 - dense 1 loss 2: 1.3801 - dense 1 loss 3: 0.4134 - dense 1 loss 4:
0.1261 - dense_1_loss_5: 0.0933 - dense_1_loss_6: 0.0574 - dense_1_loss_7:
0.0467 - dense 1 loss 8: 0.0455 - dense 1 loss 9: 0.0419 - dense 1 loss 10:
0.0374 - dense_1_loss_11: 0.0375 - dense_1_loss_12: 0.0337 - dense_1_loss_1
3: 0.0297 - dense 1 loss 14: 0.0350 - dense 1 loss 15: 0.0355 - dense 1 loss
16: 0.0359 - dense_1_loss_17: 0.0340 - dense_1_loss_18: 0.0334 - dense_1_loss
_19: 0.0354 - dense_1_loss_20: 0.0388 - dense_1_loss_21: 0.0380 - dense_1_los
s 22: 0.0347 - dense 1 loss 23: 0.0367 - dense 1 loss 24: 0.0385 - dense 1 lo
ss_25: 0.0419 - dense_1_loss_26: 0.0368 - dense_1_loss_27: 0.0390 - dense_1_1
oss_28: 0.0410 - dense_1_loss_29: 0.0456 - dense_1_loss_30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.6333 - dense 1 acc 3: 0.8833 - dense 1 a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
```

```
- dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
1 acc 26: 1.0000 - dense 1 acc 27: 1.0000 - dense 1 acc 28: 1.0000 - dense 1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 79/100
3.8049 - dense_1_loss_2: 1.3653 - dense_1_loss_3: 0.4032 - dense_1_loss_4:
0.1229 - dense 1 loss 5: 0.0904 - dense 1 loss 6: 0.0558 - dense 1 loss 7:
0.0454 - dense_1_loss_8: 0.0442 - dense_1_loss_9: 0.0407 - dense_1_loss_10:
0.0363 - dense_1_loss_11: 0.0364 - dense_1_loss_12: 0.0327 - dense_1_loss_1
3: 0.0289 - dense_1_loss_14: 0.0340 - dense_1_loss_15: 0.0345 - dense_1_loss_
16: 0.0349 - dense_1_loss_17: 0.0331 - dense_1_loss_18: 0.0324 - dense_1_loss
_19: 0.0343 - dense_1_loss_20: 0.0377 - dense_1_loss_21: 0.0369 - dense_1_los
s_22: 0.0337 - dense_1_loss_23: 0.0357 - dense_1_loss_24: 0.0373 - dense_1_lo
ss 25: 0.0407 - dense 1 loss 26: 0.0357 - dense 1 loss 27: 0.0380 - dense 1 l
oss_28: 0.0398 - dense_1_loss_29: 0.0442 - dense_1_loss_30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.6333 - dense 1 acc 3: 0.8833 - dense 1 a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 80/100
3.8015 - dense_1_loss_2: 1.3502 - dense_1_loss_3: 0.3960 - dense_1_loss_4:
0.1203 - dense 1 loss 5: 0.0883 - dense 1 loss 6: 0.0544 - dense 1 loss 7:
0.0443 - dense_1_loss_8: 0.0432 - dense_1_loss_9: 0.0395 - dense_1_loss_10:
0.0353 - dense 1 loss 11: 0.0354 - dense 1 loss 12: 0.0318 - dense 1 loss 1
3: 0.0281 - dense 1 loss 14: 0.0330 - dense 1 loss 15: 0.0334 - dense 1 loss
16: 0.0339 - dense_1_loss_17: 0.0320 - dense_1_loss_18: 0.0315 - dense_1_loss
_19: 0.0333 - dense_1_loss_20: 0.0365 - dense_1_loss_21: 0.0358 - dense_1_los
s_22: 0.0327 - dense_1_loss_23: 0.0347 - dense_1_loss_24: 0.0362 - dense_1_lo
ss_25: 0.0395 - dense_1_loss_26: 0.0346 - dense_1_loss_27: 0.0369 - dense_1_l
oss_28: 0.0386 - dense_1_loss_29: 0.0427 - dense_1_loss_30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.6333 - dense 1 acc 3: 0.8833 - dense 1 a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se 1 acc 23: 1.0000 - dense 1 acc 24: 1.0000 - dense 1 acc 25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 81/100
3.7984 - dense_1_loss_2: 1.3360 - dense_1_loss_3: 0.3872 - dense_1_loss_4:
0.1176 - dense 1 loss 5: 0.0858 - dense 1 loss 6: 0.0530 - dense 1 loss 7:
0.0431 - dense_1_loss_8: 0.0420 - dense_1_loss_9: 0.0385 - dense_1_loss_10:
0.0345 - dense_1_loss_11: 0.0345 - dense_1_loss_12: 0.0310 - dense_1_loss_1
3: 0.0273 - dense_1_loss_14: 0.0321 - dense_1_loss_15: 0.0325 - dense_1_loss_
```

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16: 0.0329 - dense_1_loss_17: 0.0311 - dense_1_loss_18: 0.0306 - dense_1_loss
_19: 0.0324 - dense_1_loss_20: 0.0355 - dense_1_loss_21: 0.0348 - dense_1_los
s_22: 0.0319 - dense_1_loss_23: 0.0337 - dense_1_loss_24: 0.0353 - dense_1_lo
ss_25: 0.0385 - dense_1_loss_26: 0.0336 - dense_1_loss_27: 0.0360 - dense_1_1
oss 28: 0.0377 - dense 1 loss 29: 0.0417 - dense 1 loss 30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.6500 - dense_1_acc_3: 0.8833 - dense_1_a
cc 4: 1.0000 - dense 1 acc 5: 1.0000 - dense 1 acc 6: 1.0000 - dense 1 acc 7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se 1 acc 23: 1.0000 - dense 1 acc 24: 1.0000 - dense 1 acc 25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 82/100
3.7952 - dense_1_loss_2: 1.3224 - dense_1_loss_3: 0.3798 - dense_1_loss_4:
0.1150 - dense 1 loss 5: 0.0838 - dense 1 loss 6: 0.0518 - dense 1 loss 7:
0.0420 - dense_1_loss_8: 0.0410 - dense_1_loss_9: 0.0376 - dense_1_loss_10:
0.0336 - dense_1_loss_11: 0.0335 - dense_1_loss_12: 0.0302 - dense_1_loss_1
3: 0.0265 - dense 1 loss 14: 0.0313 - dense 1 loss 15: 0.0317 - dense 1 loss
16: 0.0321 - dense_1_loss_17: 0.0303 - dense_1_loss_18: 0.0297 - dense_1_loss
_19: 0.0315 - dense_1_loss_20: 0.0346 - dense_1_loss_21: 0.0338 - dense_1_los
s_22: 0.0310 - dense_1_loss_23: 0.0328 - dense_1_loss_24: 0.0344 - dense_1_lo
ss_25: 0.0373 - dense_1_loss_26: 0.0327 - dense_1_loss_27: 0.0349 - dense_1_l
oss_28: 0.0365 - dense_1_loss_29: 0.0405 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.6500 - dense_1_acc_3: 0.8833 - dense_1_a
cc 4: 1.0000 - dense 1 acc 5: 1.0000 - dense 1 acc 6: 1.0000 - dense 1 acc 7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se 1 acc 23: 1.0000 - dense 1 acc 24: 1.0000 - dense 1 acc 25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 83/100
3.7921 - dense_1_loss_2: 1.3079 - dense_1_loss_3: 0.3719 - dense_1_loss_4:
0.1123 - dense 1 loss 5: 0.0816 - dense 1 loss 6: 0.0504 - dense 1 loss 7:
0.0409 - dense_1_loss_8: 0.0397 - dense_1_loss_9: 0.0366 - dense_1_loss_10:
0.0327 - dense_1_loss_11: 0.0326 - dense_1_loss_12: 0.0293 - dense_1_loss_1
3: 0.0258 - dense 1 loss 14: 0.0305 - dense 1 loss 15: 0.0309 - dense 1 loss
16: 0.0313 - dense_1_loss_17: 0.0295 - dense_1_loss_18: 0.0289 - dense_1_loss
19: 0.0307 - dense 1 loss 20: 0.0337 - dense 1 loss 21: 0.0328 - dense 1 los
s_22: 0.0301 - dense_1_loss_23: 0.0320 - dense_1_loss_24: 0.0334 - dense_1_lo
ss_25: 0.0363 - dense_1_loss_26: 0.0318 - dense_1_loss_27: 0.0339 - dense_1_1
oss_28: 0.0356 - dense_1_loss_29: 0.0394 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.6500 - dense_1_acc_3: 0.8833 - dense_1_a
cc 4: 1.0000 - dense 1 acc 5: 1.0000 - dense 1 acc 6: 1.0000 - dense 1 acc 7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
```

```
1 acc 26: 1.0000 - dense 1 acc 27: 1.0000 - dense 1 acc 28: 1.0000 - dense 1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 84/100
3.7889 - dense 1 loss 2: 1.2944 - dense 1 loss 3: 0.3648 - dense 1 loss 4:
0.1099 - dense_1_loss_5: 0.0797 - dense_1_loss_6: 0.0492 - dense_1_loss_7:
0.0399 - dense_1_loss_8: 0.0388 - dense_1_loss_9: 0.0357 - dense_1_loss_10:
0.0319 - dense_1_loss_11: 0.0318 - dense_1_loss_12: 0.0285 - dense_1_loss_1
3: 0.0252 - dense_1_loss_14: 0.0297 - dense_1_loss_15: 0.0302 - dense_1_loss_
16: 0.0305 - dense 1 loss 17: 0.0287 - dense 1 loss 18: 0.0282 - dense 1 loss
_19: 0.0299 - dense_1_loss_20: 0.0328 - dense_1_loss_21: 0.0320 - dense_1_los
s_22: 0.0294 - dense_1_loss_23: 0.0312 - dense_1_loss_24: 0.0325 - dense_1_lo
ss_25: 0.0354 - dense_1_loss_26: 0.0309 - dense_1_loss_27: 0.0332 - dense_1_1
oss_28: 0.0347 - dense_1_loss_29: 0.0384 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.6500 - dense_1_acc_3: 0.8833 - dense_1_a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense 1 acc 8: 1.0000 - dense 1 acc 9: 1.0000 - dense 1 acc 10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se 1 acc 23: 1.0000 - dense 1 acc 24: 1.0000 - dense 1 acc 25: 1.0000 - dense
1 acc 26: 1.0000 - dense 1 acc 27: 1.0000 - dense 1 acc 28: 1.0000 - dense 1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 85/100
3.7857 - dense_1_loss_2: 1.2821 - dense_1_loss_3: 0.3573 - dense_1_loss_4:
0.1076 - dense_1_loss_5: 0.0778 - dense_1_loss_6: 0.0481 - dense_1_loss_7:
0.0390 - dense 1 loss 8: 0.0378 - dense 1 loss 9: 0.0348 - dense 1 loss 10:
0.0311 - dense_1_loss_11: 0.0309 - dense_1_loss_12: 0.0278 - dense_1_loss_1
3: 0.0246 - dense_1_loss_14: 0.0289 - dense_1_loss_15: 0.0293 - dense_1_loss_
16: 0.0298 - dense_1_loss_17: 0.0280 - dense_1_loss_18: 0.0274 - dense_1_loss
_19: 0.0291 - dense_1_loss_20: 0.0319 - dense_1_loss_21: 0.0312 - dense_1_los
s 22: 0.0287 - dense 1 loss 23: 0.0304 - dense 1 loss 24: 0.0317 - dense 1 lo
ss_25: 0.0346 - dense_1_loss_26: 0.0301 - dense_1_loss_27: 0.0324 - dense_1_l
oss_28: 0.0338 - dense_1_loss_29: 0.0374 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.6667 - dense_1_acc_3: 0.8833 - dense_1_a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 86/100
3.7830 - dense_1_loss_2: 1.2690 - dense_1_loss_3: 0.3507 - dense_1_loss_4:
0.1054 - dense_1_loss_5: 0.0761 - dense_1_loss_6: 0.0471 - dense_1_loss_7:
0.0381 - dense 1 loss 8: 0.0370 - dense 1 loss 9: 0.0340 - dense 1 loss 10:
0.0303 - dense_1_loss_11: 0.0302 - dense_1_loss_12: 0.0272 - dense_1_loss_1
3: 0.0240 - dense_1_loss_14: 0.0282 - dense_1_loss_15: 0.0286 - dense_1_loss_
16: 0.0290 - dense_1_loss_17: 0.0274 - dense_1_loss_18: 0.0267 - dense_1_loss
_19: 0.0283 - dense_1_loss_20: 0.0311 - dense_1_loss_21: 0.0305 - dense_1_los
s_22: 0.0279 - dense_1_loss_23: 0.0297 - dense_1_loss_24: 0.0309 - dense_1_lo
ss_25: 0.0337 - dense_1_loss_26: 0.0293 - dense_1_loss_27: 0.0316 - dense_1_l
```

```
oss_28: 0.0329 - dense_1_loss_29: 0.0365 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.6667 - dense_1_acc_3: 0.8833 - dense_1_a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
1 acc 26: 1.0000 - dense 1 acc 27: 1.0000 - dense 1 acc 28: 1.0000 - dense 1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 87/100
3.7796 - dense_1_loss_2: 1.2574 - dense_1_loss_3: 0.3444 - dense_1_loss_4:
0.1035 - dense_1_loss_5: 0.0746 - dense_1_loss_6: 0.0461 - dense_1_loss_7:
0.0373 - dense_1_loss_8: 0.0362 - dense_1_loss_9: 0.0332 - dense_1_loss_10:
0.0297 - dense 1 loss 11: 0.0294 - dense 1 loss 12: 0.0265 - dense 1 loss 1
3: 0.0235 - dense_1_loss_14: 0.0275 - dense_1_loss_15: 0.0279 - dense_1_loss_
16: 0.0283 - dense 1 loss 17: 0.0267 - dense 1 loss 18: 0.0260 - dense 1 loss
_19: 0.0276 - dense_1_loss_20: 0.0304 - dense_1_loss_21: 0.0297 - dense_1_los
s_22: 0.0272 - dense_1_loss_23: 0.0290 - dense_1_loss_24: 0.0302 - dense_1_lo
ss 25: 0.0329 - dense 1 loss 26: 0.0286 - dense 1 loss 27: 0.0308 - dense 1 l
oss_28: 0.0321 - dense_1_loss_29: 0.0355 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.6833 - dense_1_acc_3: 0.9167 - dense_1_a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 88/100
60/60 [==========================] - 0s - loss: 6.2485 - dense 1 loss 1:
3.7765 - dense 1 loss 2: 1.2450 - dense 1 loss 3: 0.3376 - dense 1 loss 4:
0.1015 - dense_1_loss_5: 0.0728 - dense_1_loss_6: 0.0451 - dense_1_loss_7:
0.0365 - dense_1_loss_8: 0.0353 - dense_1_loss_9: 0.0325 - dense_1_loss_10:
0.0290 - dense 1 loss 11: 0.0287 - dense 1 loss 12: 0.0259 - dense 1 loss 1
3: 0.0229 - dense_1_loss_14: 0.0269 - dense_1_loss_15: 0.0273 - dense_1_loss_
16: 0.0275 - dense 1 loss 17: 0.0261 - dense 1 loss 18: 0.0254 - dense 1 loss
_19: 0.0269 - dense_1_loss_20: 0.0297 - dense_1_loss_21: 0.0289 - dense_1_los
s_22: 0.0265 - dense_1_loss_23: 0.0283 - dense_1_loss_24: 0.0296 - dense_1_lo
ss 25: 0.0320 - dense 1 loss 26: 0.0279 - dense 1 loss 27: 0.0300 - dense 1 l
oss_28: 0.0314 - dense_1_loss_29: 0.0346 - dense_1_loss_30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.6833 - dense 1 acc 3: 0.9167 - dense 1 a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense 1 acc 8: 1.0000 - dense 1 acc 9: 1.0000 - dense 1 acc 10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
1 acc 26: 1.0000 - dense 1 acc 27: 1.0000 - dense 1 acc 28: 1.0000 - dense 1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 89/100
```

```
3.7735 - dense 1 loss 2: 1.2331 - dense 1 loss 3: 0.3311 - dense 1 loss 4:
0.0993 - dense_1_loss_5: 0.0711 - dense_1_loss_6: 0.0441 - dense_1_loss_7:
0.0356 - dense_1_loss_8: 0.0345 - dense_1_loss_9: 0.0318 - dense_1_loss_10:
0.0284 - dense_1_loss_11: 0.0280 - dense_1_loss_12: 0.0252 - dense_1_loss_1
3: 0.0224 - dense 1 loss 14: 0.0262 - dense 1 loss 15: 0.0268 - dense 1 loss
16: 0.0269 - dense_1_loss_17: 0.0256 - dense_1_loss_18: 0.0248 - dense_1_loss
19: 0.0263 - dense 1 loss 20: 0.0290 - dense 1 loss 21: 0.0283 - dense 1 los
s_22: 0.0259 - dense_1_loss_23: 0.0277 - dense_1_loss_24: 0.0289 - dense_1_lo
ss_25: 0.0313 - dense_1_loss_26: 0.0272 - dense_1_loss_27: 0.0294 - dense_1_1
oss 28: 0.0307 - dense 1 loss 29: 0.0339 - dense 1 loss 30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.6833 - dense 1 acc 3: 0.9167 - dense 1 a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 90/100
60/60 [================] - 0s - loss: 6.1681 - dense_1_loss_1:
3.7705 - dense 1 loss 2: 1.2220 - dense 1 loss 3: 0.3255 - dense 1 loss 4:
0.0974 - dense_1_loss_5: 0.0698 - dense_1_loss_6: 0.0431 - dense_1_loss_7:
0.0349 - dense_1_loss_8: 0.0338 - dense_1_loss_9: 0.0311 - dense_1_loss_10:
0.0277 - dense_1_loss_11: 0.0274 - dense_1_loss_12: 0.0246 - dense_1_loss_1
3: 0.0219 - dense_1_loss_14: 0.0256 - dense_1_loss_15: 0.0262 - dense_1_loss_
16: 0.0263 - dense_1_loss_17: 0.0249 - dense_1_loss_18: 0.0242 - dense_1_loss
19: 0.0257 - dense 1 loss 20: 0.0283 - dense 1 loss 21: 0.0276 - dense 1 los
s_22: 0.0253 - dense_1_loss_23: 0.0271 - dense_1_loss_24: 0.0282 - dense_1_lo
ss_25: 0.0306 - dense_1_loss_26: 0.0265 - dense_1_loss_27: 0.0287 - dense_1_l
oss_28: 0.0299 - dense_1_loss_29: 0.0331 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.6833 - dense_1_acc_3: 0.9167 - dense_1_a
cc 4: 1.0000 - dense 1 acc 5: 1.0000 - dense 1 acc 6: 1.0000 - dense 1 acc 7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
1 acc 26: 1.0000 - dense 1 acc 27: 1.0000 - dense 1 acc 28: 1.0000 - dense 1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 91/100
3.7676 - dense_1_loss_2: 1.2106 - dense_1_loss_3: 0.3201 - dense_1_loss_4:
0.0956 - dense 1 loss 5: 0.0683 - dense 1 loss 6: 0.0422 - dense 1 loss 7:
0.0341 - dense_1_loss_8: 0.0330 - dense_1_loss_9: 0.0304 - dense_1_loss_10:
0.0271 - dense_1_loss_11: 0.0268 - dense_1_loss_12: 0.0241 - dense_1_loss_1
3: 0.0213 - dense_1_loss_14: 0.0251 - dense_1_loss_15: 0.0256 - dense_1_loss_
16: 0.0258 - dense_1_loss_17: 0.0244 - dense_1_loss_18: 0.0237 - dense_1_loss
19: 0.0252 - dense 1 loss 20: 0.0277 - dense 1 loss 21: 0.0270 - dense 1 los
s_22: 0.0247 - dense_1_loss_23: 0.0265 - dense_1_loss_24: 0.0276 - dense_1_lo
ss_25: 0.0299 - dense_1_loss_26: 0.0260 - dense_1_loss_27: 0.0281 - dense_1_1
oss_28: 0.0292 - dense_1_loss_29: 0.0323 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.6833 - dense_1_acc_3: 0.9167 - dense_1_a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
```

```
00 - dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se 1 acc 23: 1.0000 - dense 1 acc 24: 1.0000 - dense 1 acc 25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 92/100
3.7644 - dense_1_loss_2: 1.1996 - dense_1_loss_3: 0.3143 - dense_1_loss_4:
0.0938 - dense_1_loss_5: 0.0670 - dense_1_loss_6: 0.0413 - dense_1_loss_7:
0.0334 - dense_1_loss_8: 0.0324 - dense_1_loss_9: 0.0298 - dense_1_loss_10:
0.0266 - dense 1 loss 11: 0.0262 - dense 1 loss 12: 0.0235 - dense 1 loss 1
3: 0.0208 - dense_1_loss_14: 0.0246 - dense_1_loss_15: 0.0250 - dense_1_loss_
16: 0.0252 - dense_1_loss_17: 0.0238 - dense_1_loss_18: 0.0232 - dense_1_loss
_19: 0.0246 - dense_1_loss_20: 0.0270 - dense_1_loss_21: 0.0264 - dense_1_los
s 22: 0.0242 - dense 1 loss 23: 0.0259 - dense 1 loss 24: 0.0270 - dense 1 lo
ss_25: 0.0293 - dense_1_loss_26: 0.0254 - dense_1_loss_27: 0.0274 - dense_1_l
oss 28: 0.0285 - dense 1 loss 29: 0.0315 - dense 1 loss 30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.6833 - dense_1_acc_3: 0.9167 - dense_1_a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense 1 acc 8: 1.0000 - dense 1 acc 9: 1.0000 - dense 1 acc 10: 1.00
00 - dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 93/100
3.7614 - dense_1_loss_2: 1.1891 - dense_1_loss_3: 0.3092 - dense_1_loss_4:
0.0922 - dense_1_loss_5: 0.0657 - dense_1_loss_6: 0.0405 - dense_1_loss_7:
0.0328 - dense 1 loss 8: 0.0317 - dense 1 loss 9: 0.0292 - dense 1 loss 10:
0.0260 - dense 1 loss 11: 0.0257 - dense 1 loss 12: 0.0230 - dense 1 loss 1
3: 0.0204 - dense_1_loss_14: 0.0241 - dense_1_loss_15: 0.0245 - dense_1_loss_
16: 0.0247 - dense_1_loss_17: 0.0233 - dense_1_loss_18: 0.0227 - dense_1_loss
_19: 0.0241 - dense_1_loss_20: 0.0265 - dense_1_loss_21: 0.0258 - dense_1_los
s 22: 0.0237 - dense 1 loss 23: 0.0253 - dense 1 loss 24: 0.0264 - dense 1 lo
ss_25: 0.0286 - dense_1_loss_26: 0.0248 - dense_1_loss_27: 0.0268 - dense_1_l
oss 28: 0.0279 - dense 1 loss 29: 0.0308 - dense 1 loss 30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.6833 - dense_1_acc_3: 0.9167 - dense_1_a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense 1 acc 14: 1.0000 - dense 1 acc 15: 1.0000 - dense 1 acc 16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 94/100
3.7588 - dense 1 loss 2: 1.1785 - dense 1 loss 3: 0.3036 - dense 1 loss 4:
0.0907 - dense_1_loss_5: 0.0644 - dense_1_loss_6: 0.0397 - dense_1_loss_7:
0.0322 - dense_1_loss_8: 0.0311 - dense_1_loss_9: 0.0285 - dense_1_loss_10:
0.0255 - dense_1_loss_11: 0.0251 - dense_1_loss_12: 0.0226 - dense_1_loss_1
```

```
3: 0.0200 - dense 1 loss 14: 0.0236 - dense 1 loss 15: 0.0240 - dense 1 loss
16: 0.0242 - dense_1_loss_17: 0.0228 - dense_1_loss_18: 0.0222 - dense_1_loss
_19: 0.0236 - dense_1_loss_20: 0.0259 - dense_1_loss_21: 0.0252 - dense_1_los
s_22: 0.0232 - dense_1_loss_23: 0.0248 - dense_1_loss_24: 0.0259 - dense_1_lo
ss 25: 0.0279 - dense 1 loss 26: 0.0242 - dense 1 loss 27: 0.0262 - dense 1 l
oss_28: 0.0274 - dense_1_loss_29: 0.0301 - dense_1_loss_30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.6833 - dense 1 acc 3: 0.9167 - dense 1 a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 95/100
3.7558 - dense 1 loss 2: 1.1684 - dense 1 loss 3: 0.2980 - dense 1 loss 4:
0.0892 - dense_1_loss_5: 0.0632 - dense_1_loss_6: 0.0389 - dense_1_loss_7:
0.0316 - dense_1_loss_8: 0.0305 - dense_1_loss_9: 0.0280 - dense_1_loss_10:
0.0250 - dense 1 loss 11: 0.0246 - dense 1 loss 12: 0.0221 - dense 1 loss 1
3: 0.0196 - dense_1_loss_14: 0.0231 - dense_1_loss_15: 0.0235 - dense_1_loss_
16: 0.0237 - dense_1_loss_17: 0.0224 - dense_1_loss_18: 0.0217 - dense_1_loss
_19: 0.0230 - dense_1_loss_20: 0.0254 - dense_1_loss_21: 0.0247 - dense_1_los
s_22: 0.0228 - dense_1_loss_23: 0.0243 - dense_1_loss_24: 0.0254 - dense_1_lo
ss_25: 0.0273 - dense_1_loss_26: 0.0238 - dense_1_loss_27: 0.0257 - dense_1_l
oss_28: 0.0269 - dense_1_loss_29: 0.0296 - dense_1_loss_30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.6833 - dense 1 acc 3: 0.9167 - dense 1 a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 96/100
60/60 [===========================] - 0s - loss: 5.9548 - dense 1 loss 1:
3.7529 - dense 1 loss 2: 1.1580 - dense 1 loss 3: 0.2932 - dense 1 loss 4:
0.0877 - dense 1 loss 5: 0.0621 - dense 1 loss 6: 0.0382 - dense 1 loss 7:
0.0310 - dense_1_loss_8: 0.0300 - dense_1_loss_9: 0.0275 - dense_1_loss_10:
0.0245 - dense 1 loss 11: 0.0241 - dense 1 loss 12: 0.0216 - dense 1 loss 1
3: 0.0192 - dense_1_loss_14: 0.0227 - dense_1_loss_15: 0.0229 - dense_1_loss_
16: 0.0232 - dense 1 loss 17: 0.0219 - dense 1 loss 18: 0.0212 - dense 1 loss
_19: 0.0225 - dense_1_loss_20: 0.0248 - dense_1_loss_21: 0.0241 - dense_1_los
s 22: 0.0223 - dense 1 loss 23: 0.0238 - dense 1 loss 24: 0.0249 - dense 1 lo
ss_25: 0.0267 - dense_1_loss_26: 0.0232 - dense_1_loss_27: 0.0253 - dense_1_l
oss_28: 0.0263 - dense_1_loss_29: 0.0289 - dense_1_loss_30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.6833 - dense 1 acc 3: 0.9167 - dense 1 a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
```

```
se 1 acc 23: 1.0000 - dense 1 acc 24: 1.0000 - dense 1 acc 25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 97/100
s_1: 3.7508 - dense_1_loss_2: 1.1762 - dense_1_loss_3: 0.2495 - dense_1_loss_
4: 0.0828 - dense 1 loss 5: 0.0550 - dense 1 loss 6: 0.0291 - dense 1 loss 7:
0.0248 - dense_1_loss_8: 0.0258 - dense_1_loss_9: 0.0226 - dense_1_loss_10:
0.0238 - dense_1_loss_11: 0.0221 - dense_1_loss_12: 0.0213 - dense_1_loss_1
3: 0.0178 - dense 1 loss 14: 0.0203 - dense 1 loss 15: 0.0219 - dense 1 loss
16: 0.0213 - dense_1_loss_17: 0.0200 - dense_1_loss_18: 0.0210 - dense_1_loss
_19: 0.0205 - dense_1_loss_20: 0.0235 - dense_1_loss_21: 0.0237 - dense_1_los
s_22: 0.0210 - dense_1_loss_23: 0.0227 - dense_1_loss_24: 0.0231 - dense_1_lo
ss_25: 0.0231 - dense_1_loss_26: 0.0236 - dense_1_loss_27: 0.0242 - dense_1_1
oss_28: 0.0269 - dense_1_loss_29: 0.0299 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0625 - dense_1_acc_2: 0.6562 - dense_1_acc_3: 0.9375 - dense_1_a
cc 4: 1.0000 - dense 1 acc 5: 1.0000 - dense 1 acc 6: 1.0000 - dense 1 acc 7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense 1 acc 11: 1.0000 - dense 1 acc 12: 1.0000 - dense 1 acc 13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
 dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+0 - 0s - loss: 5.9221 - dense_1_los
s_1: 3.7500 - dense_1_loss_2: 1.1479 - dense_1_loss_3: 0.2882 - dense_1_loss_
4: 0.0862 - dense_1_loss_5: 0.0608 - dense_1_loss_6: 0.0374 - dense_1_loss_7:
0.0303 - dense_1_loss_8: 0.0293 - dense_1_loss_9: 0.0270 - dense_1_loss_10:
0.0240 - dense 1 loss 11: 0.0235 - dense 1 loss 12: 0.0212 - dense 1 loss 1
3: 0.0188 - dense_1_loss_14: 0.0223 - dense_1_loss_15: 0.0225 - dense_1_loss_
16: 0.0228 - dense_1_loss_17: 0.0215 - dense_1_loss_18: 0.0208 - dense_1_loss
19: 0.0220 - dense 1 loss 20: 0.0243 - dense 1 loss 21: 0.0237 - dense 1 los
s_22: 0.0219 - dense_1_loss_23: 0.0233 - dense_1_loss_24: 0.0244 - dense_1_lo
ss_25: 0.0262 - dense_1_loss_26: 0.0227 - dense_1_loss_27: 0.0248 - dense_1_l
oss 28: 0.0258 - dense 1 loss 29: 0.0284 - dense 1 loss 30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.6833 - dense_1_acc_3: 0.9167 - dense_1_a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
 dense 1 acc 17: 1.0000 - dense 1 acc 18: 1.0000 - dense 1 acc 19: 1.0000 - d
ense_1_acc_20: 1.0000 - dense_1_acc_21: 1.0000 - dense_1_acc_22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 98/100
3.7471 - dense 1 loss 2: 1.1390 - dense 1 loss 3: 0.2841 - dense 1 loss 4:
 0.0847 - dense_1_loss_5: 0.0597 - dense_1_loss_6: 0.0368 - dense_1_loss_7:
0.0298 - dense_1_loss_8: 0.0288 - dense_1_loss_9: 0.0265 - dense_1_loss_10:
0.0235 - dense 1 loss 11: 0.0231 - dense 1 loss 12: 0.0208 - dense 1 loss 1
3: 0.0184 - dense_1_loss_14: 0.0219 - dense_1_loss_15: 0.0220 - dense_1_loss_
16: 0.0224 - dense_1_loss_17: 0.0211 - dense_1_loss_18: 0.0204 - dense_1_loss
19: 0.0216 - dense 1 loss 20: 0.0238 - dense 1 loss 21: 0.0232 - dense 1 los
s_22: 0.0215 - dense_1_loss_23: 0.0229 - dense_1_loss_24: 0.0239 - dense_1_lo
ss_25: 0.0257 - dense_1_loss_26: 0.0223 - dense_1_loss_27: 0.0243 - dense_1_l
oss_28: 0.0253 - dense_1_loss_29: 0.0278 - dense_1_loss_30: 0.0000e+00 - dens
```

```
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.7000 - dense 1 acc 3: 0.9500 - dense 1 a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
 dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
Epoch 99/100
3.7442 - dense_1_loss_2: 1.1293 - dense_1_loss_3: 0.2798 - dense_1_loss_4:
0.0835 - dense_1_loss_5: 0.0587 - dense_1_loss_6: 0.0361 - dense_1_loss_7:
0.0293 - dense_1_loss_8: 0.0283 - dense_1_loss_9: 0.0260 - dense_1_loss_10:
0.0231 - dense 1 loss 11: 0.0226 - dense 1 loss 12: 0.0204 - dense 1 loss 1
3: 0.0180 - dense 1 loss 14: 0.0214 - dense 1 loss 15: 0.0217 - dense 1 loss
16: 0.0219 - dense_1_loss_17: 0.0207 - dense_1_loss_18: 0.0200 - dense_1_loss
19: 0.0212 - dense 1 loss 20: 0.0234 - dense 1 loss 21: 0.0228 - dense 1 los
s_22: 0.0210 - dense_1_loss_23: 0.0225 - dense_1_loss_24: 0.0235 - dense_1_lo
ss_25: 0.0252 - dense_1_loss_26: 0.0219 - dense_1_loss_27: 0.0238 - dense_1_l
oss 28: 0.0248 - dense 1 loss 29: 0.0273 - dense 1 loss 30: 0.0000e+00 - dens
e 1 acc 1: 0.0667 - dense 1 acc 2: 0.7000 - dense 1 acc 3: 0.9500 - dense 1 a
cc_4: 1.0000 - dense_1_acc_5: 1.0000 - dense_1_acc_6: 1.0000 - dense_1_acc_7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
 dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
_acc_29: 1.0000 - dense_1_acc_30: 0.0000e+00
Epoch 100/100
3.7415 - dense 1 loss 2: 1.1200 - dense 1 loss 3: 0.2754 - dense 1 loss 4:
0.0823 - dense_1_loss_5: 0.0577 - dense_1_loss_6: 0.0355 - dense_1_loss_7:
0.0288 - dense_1_loss_8: 0.0278 - dense_1_loss_9: 0.0255 - dense_1_loss_10:
0.0226 - dense_1_loss_11: 0.0222 - dense_1_loss_12: 0.0200 - dense_1_loss_1
3: 0.0177 - dense_1_loss_14: 0.0210 - dense_1_loss_15: 0.0213 - dense_1_loss_
16: 0.0215 - dense_1_loss_17: 0.0203 - dense_1_loss_18: 0.0196 - dense_1_loss
19: 0.0209 - dense 1 loss 20: 0.0229 - dense 1 loss 21: 0.0223 - dense 1 los
s_22: 0.0206 - dense_1_loss_23: 0.0221 - dense_1_loss_24: 0.0230 - dense_1_lo
ss_25: 0.0247 - dense_1_loss_26: 0.0215 - dense_1_loss_27: 0.0233 - dense_1_l
oss_28: 0.0244 - dense_1_loss_29: 0.0267 - dense_1_loss_30: 0.0000e+00 - dens
e_1_acc_1: 0.0667 - dense_1_acc_2: 0.7000 - dense_1_acc_3: 0.9500 - dense_1_a
cc 4: 1.0000 - dense 1 acc 5: 1.0000 - dense 1 acc 6: 1.0000 - dense 1 acc 7:
1.0000 - dense_1_acc_8: 1.0000 - dense_1_acc_9: 1.0000 - dense_1_acc_10: 1.00
00 - dense_1_acc_11: 1.0000 - dense_1_acc_12: 1.0000 - dense_1_acc_13: 1.0000
- dense_1_acc_14: 1.0000 - dense_1_acc_15: 1.0000 - dense_1_acc_16: 1.0000 -
 dense_1_acc_17: 1.0000 - dense_1_acc_18: 1.0000 - dense_1_acc_19: 1.0000 - d
ense 1 acc 20: 1.0000 - dense 1 acc 21: 1.0000 - dense 1 acc 22: 1.0000 - den
se_1_acc_23: 1.0000 - dense_1_acc_24: 1.0000 - dense_1_acc_25: 1.0000 - dense
_1_acc_26: 1.0000 - dense_1_acc_27: 1.0000 - dense_1_acc_28: 1.0000 - dense_1
acc 29: 1.0000 - dense 1 acc 30: 0.0000e+00
```

Out[12]: <keras.callbacks.History at 0x7f414576d6a0>

## **Expected Output**

The model loss will start high, (100 or so), and after 100 epochs, it should be in the single digits. These won't be the exact number that you'll see, due to random initialization of weights.

For example:

```
Epoch 1/100
60/60 [=======] - 3s - loss: 125.7673
```

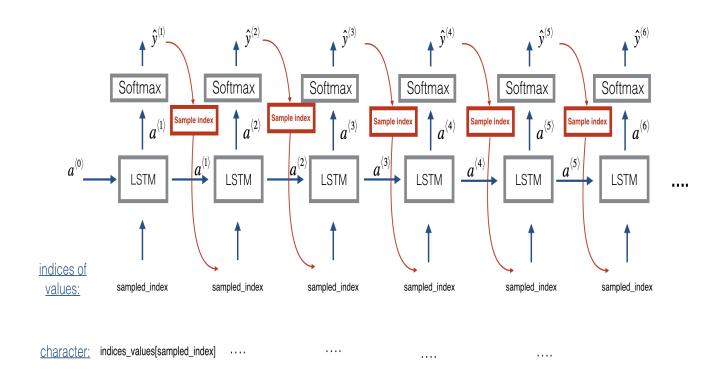
Scroll to the bottom to check Epoch 100

Now that you have trained a model, let's go to the final section to implement an inference algorithm, and generate some music!

# 3 - Generating music

You now have a trained model which has learned the patterns of the jazz soloist. Lets now use this model to synthesize new music.

## 3.1 - Predicting & Sampling



At each step of sampling, you will:

- Take as input the activation 'a' and cell state 'c' from the previous state of the LSTM.
- Forward propagate by one step.
- Get a new output activation as well as cell state.
- The new activation 'a' can then be used to generate the output using the fully connected layer, densor.

#### Initialization

- · We will initialize the following to be zeros:
  - x0
  - hidden state a0
  - cell state c0

#### **Exercise:**

- · Implement the function below to sample a sequence of musical values.
- Here are some of the key steps you'll need to implement inside the for-loop that generates the  ${\cal T}_y$  output characters:
- Step 2.A: Use LSTM\_Cell, which takes in the input layer, as well as the previous step's 'c' and 'a' to generate the current step's 'c' and 'a'.

```
next_hidden_state, _, next_cell_state = LSTM_cell(input_x, initial_state=[pr
evious_hidden_state, previous_cell_state])
```

- Choose the appropriate variables for the input\_x, hidden\_state, and cell\_state
- Step 2.B: Compute the output by applying densor to compute a softmax on 'a' to get the output for the current step.
- Step 2.C: Append the output to the list outputs.

- Step 2.D: Sample x to be the one-hot version of 'out'.
- This allows you to pass it to the next LSTM's step.
- We have provided the definition of one\_hot(x) in the 'music\_utils.py' file and imported it. Here is the
  definition of one\_hot

```
def one_hot(x):
    x = K.argmax(x)
    x = tf.one_hot(indices=x, depth=78)
    x = RepeatVector(1)(x)
    return x
```

Here is what the one hot function is doing:

- argmax: within the vector x, find the position with the maximum value and return the index of that
  position.
  - For example: argmax of [-1,0,1] finds that 1 is the maximum value, and returns the index position, which is 2. Read the documentation for <a href="keras.argmax">keras.argmax</a>
     (<a href="https://www.tensorflow.org/api\_docs/python/tf/keras/backend/argmax">https://www.tensorflow.org/api\_docs/python/tf/keras/backend/argmax</a>).
- one\_hot: takes a list of indices and the depth of the one-hot vector (number of categories, which is 78 in this assignment). It converts each index into the one-hot vector representation. For instance, if the indices is [2], and the depth is 5, then the one-hot vector returned is [0,0,1,0,0]. Check out the documentation for tf.one\_hot (https://www.tensorflow.org/api\_docs/python/tf/one\_hot) for more examples and explanations.
- RepeatVector(n): This takes a vector and duplicates it n times. Notice that we had it repeat 1 time. This
  may seem like it's not doing anything. If you look at the documentation for <u>RepeatVector</u>
  (<a href="https://keras.io/layers/core/#repeatvector">https://keras.io/layers/core/#repeatvector</a>), you'll notice that if x is a vector with dimension (m,5) and it
  gets passed into RepeatVector(1), then the output is (m,1,5). In other words, it adds an additional
  dimension (of length 1) to the resulting vector.
- Apply the custom one\_hot encoding using the <u>Lambda (https://keras.io/layers/core/#lambda)</u> layer. You saw earlier that the Lambda layer can be used like this:

```
result = Lambda(lambda x: x + 1)(input_var)
```

If you pre-define a function, you can do the same thing:

```
def add_one(x)
    return x + 1

# use the add_one function inside of the Lambda function
result = Lambda(add_one)(input_var)
```

## **Step 3: Inference Model:**

This is how to use the Keras Model.

model = Model(inputs=[input\_x, initial\_hidden\_state, initial\_cell\_state], outputs=t
he\_outputs)

- Choose the appropriate variables for the input tensor, hidden state, cell state, and output.
- Hint: the inputs to the model are the initial inputs and states.

```
In [13]: # GRADED FUNCTION: music inference model
         def music inference model(LSTM cell, densor, n values = 78, n a = 64, Ty = 100
         ):
             Uses the trained "LSTM_cell" and "densor" from model() to generate a seque
         nce of values.
             Arguments:
             LSTM_cell -- the trained "LSTM_cell" from model(), Keras layer object
             densor -- the trained "densor" from model(), Keras layer object
             n_values -- integer, number of unique values
             n_a -- number of units in the LSTM_cell
             Ty -- integer, number of time steps to generate
             Returns:
             inference model -- Keras model instance
             # Define the input of your model with a shape
             x0 = Input(shape=(1, n values))
             # Define s0, initial hidden state for the decoder LSTM
             a0 = Input(shape=(n_a,), name='a0')
             c0 = Input(shape=(n_a,), name='c0')
             a = a0
             c = c0
             x = x0
             ### START CODE HERE ###
             # Step 1: Create an empty list of "outputs" to later store your predicted
          values (≈1 line)
             outputs = []
             # Step 2: Loop over Ty and generate a value at every time step
             for t in range(Ty):
                 # Step 2.A: Perform one step of LSTM cell (≈1 line)
                 a, , c = LSTM cell(x, initial state=[a, c])
                 # Step 2.B: Apply Dense layer to the hidden state output of the LSTM_c
         ell (≈1 line)
                 out = densor(a)
                 # Step 2.C: Append the prediction "out" to "outputs". out.shape = (Non
         e, 78) (≈1 line)
                 outputs.append(out)
                 # Step 2.D:
                 # Select the next value according to "out",
                 # Set "x" to be the one-hot representation of the selected value
                 # See instructions above.
                 x = Lambda(one\_hot)(out)
             # Step 3: Create model instance with the correct "inputs" and "outputs" (≈
         1 line)
```

```
inference_model = Model(inputs=[x0, a0, c0], outputs=outputs)
### END CODE HERE ###
return inference_model
```

Run the cell below to define your inference model. This model is hard coded to generate 50 values.

In [15]: # Check the inference model
inference\_model.summary()

Layer (type) to	Output Shape	Param #	Connected
input_2 (InputLayer)	(None, 1, 78)	0	
a0 (InputLayer)	(None, 64)	0	
c0 (InputLayer)	(None, 64)	0	
lstm_1 (LSTM) [0]	[(None, 64), (None	e, 6 36608	input_2[0]
[-]			a0[0][0] c0[0][0] lambda_31
[0][0]			lstm_1[30]
[0]			lstm_1[30]
[2]			lambda_32
[0][0]			lstm_1[31]
[0]			lstm_1[31]
[2]			lambda_33
[0][0]			_ lstm_1[32]
[0]			lstm_1[32]
[2]			lambda_34
[0][0]			lstm_1[33]
[0]			lstm_1[33]
[2]			lambda_35
[0][0]			lstm_1[34]
[0]			lstm_1[34]
[2]			
[0][0]			lambda_36
[0]			lstm_1[35]
[2]			lstm_1[35]
[0][0]			lambda_37

	 lstm_1[36]
[0]	
[2]	lstm_1[36]
[0][0]	lambda_38
[0]	lstm_1[37]
[2]	lstm_1[37]
[0][0]	lambda_39
[0]	lstm_1[38]
[2]	lstm_1[38]
[0][0]	lambda_40
[0]	lstm_1[39]
[2]	lstm_1[39]
[0][0]	lambda_41
[0]	lstm_1[40]
	lstm_1[40]
[2]	lambda_42
[0][0]	lstm_1[41]
[0]	lstm_1[41]
[2]	lambda_43
[0][0]	lstm_1[42]
[0]	lstm_1[42]
[2]	lambda_44
[0][0]	lstm_1[43]
[0]	lstm_1[43]
[2]	lambda_45
[0][0]	lstm_1[44]
[0]	lstm_1[44]
[2]	lambda_46
[0][0]	lstm_1[45]
[0]	lstm_1[45]
	12 (111_1[42]

	IIIpiovise_a_Jazz_Soio_witii_aii_LSTivi_ivetwork_vsa	
[2]		lambda_47
[0][0]		lstm_1[46]
[0]		 lstm_1[46]
[2]		lambda_48
[0][0]		_ lstm_1[47]
[0]		_
[2]		lambda_49
[0][0]		lstm_1[48]
[0]		lstm_1[48]
[2]		lambda_50
[0][0]		
[0]		lstm_1[49]
[2]		lstm_1[49]
[0][0]		lambda_51
[0]		lstm_1[50]
[2]		lstm_1[50]
[0][0]		lambda_52
[0]		lstm_1[51]
[2]		lstm_1[51]
[0][0]		lambda_53
[0]		lstm_1[52]
[2]		lstm_1[52]
[0][0]		lambda_54
[0]		lstm_1[53]
[2]		lstm_1[53]
[0][0]		lambda_55
[0]		lstm_1[54]
[2]		lstm_1[54]
		lambda_56
[0][0]		

	lstm_1[55]
[0]	lstm_1[55]
[2]	lambda_57
[0][0]	lstm_1[56]
[0]	lstm_1[56]
[2]	lambda_58
[0][0]	lstm_1[57]
[0]	lstm_1[57]
[2]	lambda_59
[0][0]	_ lstm_1[58]
[0]	lstm_1[58]
[2]	lambda_60
[0][0]	lstm_1[59]
[0]	lstm_1[59]
[2]	lambda_61
[0][0]	lstm_1[60]
[0]	lstm_1[60]
[2]	lambda_62
[0][0]	
[0]	lstm_1[61]
[2]	lstm_1[61]
[0][0]	lambda_63
[0]	lstm_1[62]
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[0][0]	lambda_64
[0]	lstm_1[63]
[2]	lstm_1[63]
[0][0]	lambda_65
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[2]		lambda_66
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[2]		lambda_74
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			lstm_1[74]
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[2]			lambda_76
[0][0]			_
[0]			lstm_1[75]
[2]			lstm_1[75]
[0][0]			lambda_77
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[0][0]			lambda_78
[0]			lstm_1[77]
[2]			lstm_1[77]
[0][0]			lambda_79
[0]			lstm_1[78]
[2]			lstm_1[78]
dense_1 (Dense)	(None, 78)	5070	lstm_1[30]
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[0]	(None, 78)	5070	
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[0] [0] [0] [0] [0] [0]	(None, 78)	5070	lstm_1[31] lstm_1[32] lstm_1[33] lstm_1[34] lstm_1[35]
[0] [0] [0] [0] [0] [0] [0] [0]	(None, 78)	5070	lstm_1[31] lstm_1[32] lstm_1[33] lstm_1[34] lstm_1[35] lstm_1[36]
[0] [0] [0] [0] [0] [0] [0] [0] [0] [0]	(None, 78)	5070	lstm_1[31] lstm_1[32] lstm_1[33] lstm_1[34] lstm_1[35] lstm_1[36] lstm_1[37]
[0] [0] [0] [0] [0] [0] [0] [0] [0] [0]	(None, 78)	5070	lstm_1[31] lstm_1[32] lstm_1[33] lstm_1[34] lstm_1[35] lstm_1[36] lstm_1[37] lstm_1[38]
[0] [0] [0] [0] [0] [0] [0] [0] [0] [0]	(None, 78)	5070	lstm_1[31] lstm_1[32] lstm_1[33] lstm_1[34] lstm_1[35] lstm_1[36] lstm_1[37] lstm_1[38] lstm_1[39]
[0] [0] [0] [0] [0] [0] [0] [0] [0] [0]	(None, 78)	5070	lstm_1[31] lstm_1[32] lstm_1[33] lstm_1[34] lstm_1[35] lstm_1[36] lstm_1[37] lstm_1[38] lstm_1[39] lstm_1[40]
[0] [0] [0] [0] [0] [0] [0] [0] [0] [0]	(None, 78)	5070	lstm_1[31] lstm_1[32] lstm_1[33] lstm_1[34] lstm_1[35] lstm_1[36] lstm_1[37] lstm_1[38] lstm_1[39] lstm_1[40] lstm_1[41]

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[6	)]	lstm_1[44]
[6	9]	lstm_1[45]
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[6	)]	
[6	9]	lstm_1[48]
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[6	)]	lstm_1[51]
[6	)]	lstm_1[52]
[6	)]	lstm_1[53]
[6	9]	lstm_1[54]
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lambda_31 (Lambda) 0][0]	(None, 1, 78)	0	dense_1[3
lambda_32 (Lambda) 1][0]	(None, 1, 78)	0	dense_1[3
lambda_33 (Lambda) 2][0]	(None, 1, 78)	0	dense_1[3
lambda_34 (Lambda) 3][0]	(None, 1, 78)	0	dense_1[3
lambda_35 (Lambda) 4][0]	(None, 1, 78)	0	dense_1[3
lambda_36 (Lambda) 5][0]	(None, 1, 78)	0	dense_1[3
lambda_37 (Lambda) 6][0]	(None, 1, 78)	0	dense_1[3
lambda_38 (Lambda) 7][0]	(None, 1, 78)	0	dense_1[3
lambda_39 (Lambda) 8][0]	(None, 1, 78)	0	dense_1[3
lambda_40 (Lambda) 9][0]	(None, 1, 78)	0	dense_1[3

lambda_41 0][0]	(Lambda)	. (None,	1, 78)	0	dense_1[4
lambda_42 1][0]	(Lambda)	(None,	1, 78)	0	dense_1[4
lambda_43 2][0]	(Lambda)	. (None,	1, 78)	0	dense_1[4
lambda_44 3][0]	(Lambda)	(None,	1, 78)	0	dense_1[4
lambda_45 4][0]	(Lambda)	. (None,	1, 78)	0	dense_1[4
lambda_46 5][0]	(Lambda)	. (None,	1, 78)	0	dense_1[4
lambda_47 6][0]	(Lambda)	. (None,	1, 78)	0	dense_1[4
lambda_48 7][0]	(Lambda)	(None,	1, 78)	0	dense_1[4
lambda_49 8][0]	(Lambda)	(None,	1, 78)	0	dense_1[4
lambda_50 9][0]	(Lambda)	. (None,	1, 78)	0	dense_1[4
lambda_51 0][0]	(Lambda)	. (None,	1, 78)	0	dense_1[5
lambda_52 1][0]	(Lambda)	(None,	1, 78)	0	dense_1[5
lambda_53 2][0]	(Lambda)	(None,	1, 78)	0	dense_1[5
lambda_54 3][0]	(Lambda)	. (None,	1, 78)	0	dense_1[5
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lambda_55 4][0]	(Lambda)	(None,	1, 78)	0	dense_1[5
lambda_56 5][0]	(Lambda)	_ (None,	1, 78)	0	dense_1[5
lambda_57 6][0]	(Lambda)	_ (None,	1, 78)	0	dense_1[5
lambda_58 7][0]	(Lambda)	_ (None,	1, 78)	0	dense_1[5
lambda_59 8][0]	(Lambda)	_ (None,	1, 78)	0	dense_1[5
lambda_60 9][0]	(Lambda)	(None,	1, 78)	0	dense_1[5
lambda_61 0][0]	(Lambda)	- (None,	1, 78)	0	dense_1[6
lambda_62 1][0]	(Lambda)	- (None,	1, 78)	0	dense_1[6
lambda_63 2][0]	(Lambda)	- (None,	1, 78)	0	dense_1[6
lambda_64 3][0]	(Lambda)	- (None,	1, 78)	0	dense_1[6
lambda_65 4][0]	(Lambda)	_ (None,	1, 78)	0	dense_1[6
lambda_66 5][0]	(Lambda)	_ (None,	1, 78)	0	dense_1[6
lambda_67 6][0]	(Lambda)	_ (None,	1, 78)	0	dense_1[6
lambda_68 7][0]	(Lambda)	_ (None,	1, 78)	0	dense_1[6
lambda_69	(Lambda)	_ (None,	1, 78)	0	dense_1[6

8][0]

lambda_70 (Lambda) 9][0]	(None, 1, 78)	0	dense_1[6
lambda_71 (Lambda) 0][0]	(None, 1, 78)	0	dense_1[7
lambda_72 (Lambda) 1][0]	(None, 1, 78)	0	dense_1[7
lambda_73 (Lambda) 2][0]	(None, 1, 78)	0	dense_1[7
lambda_74 (Lambda) 3][0]	(None, 1, 78)	0	dense_1[7
lambda_75 (Lambda) 4][0]	(None, 1, 78)	0	dense_1[7
lambda_76 (Lambda) 5][0]	(None, 1, 78)	0	dense_1[7
lambda_77 (Lambda) 6][0]	(None, 1, 78)	0	dense_1[7
lambda_78 (Lambda) 7][0]	(None, 1, 78)	0	dense_1[7
lambda_79 (Lambda) 8][0]	(None, 1, 78)	0	dense_1[7
Total params: 41,678 Trainable params: 41,678 Non-trainable params: 0		<del>-</del>	<del>_</del>
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https://rquhfxqqqwexmqshpypggz.coursera-apps.org/nbconvert/html/Week 1/Jazz improvisation with LSTM/Improvise\_a\_Jazz\_Solo\_with\_an\_LSTM... 80/86

**Expected Output** If you scroll to the bottom of the output, you'll see:

Total params: 41,678 Trainable params: 41,678 Non-trainable params: 0

### Initialize inference model

The following code creates the zero-valued vectors you will use to initialize x and the LSTM state variables a and c.

```
In [16]: x_initializer = np.zeros((1, 1, 78))
a_initializer = np.zeros((1, n_a))
c_initializer = np.zeros((1, n_a))
```

**Exercise**: Implement predict and sample().

- This function takes many arguments including the inputs [x initializer, a initializer, c initializer].
- In order to predict the output corresponding to this input, you will need to carry-out 3 steps:

### Step 1

• Use your inference model to predict an output given your set of inputs. The output pred should be a list of length  $T_u$  where each element is a numpy-array of shape (1, n\_values).

```
inference_model.predict([input_x_init, hidden_state_init, cell_state_init])
```

 Choose the appropriate input arguments to predict from the input arguments of this predict\_and\_sample function.

#### Step 2

- Convert pred into a numpy array of  $T_y$  indices.
  - Each index is computed by taking the argmax of an element of the pred list.
  - Use <u>numpy.argmax</u> (<u>https://docs.scipy.org/doc/numpy/reference/generated/numpy.argmax.html</u>).
  - Set the axis parameter.
    - $\circ$  Remember that the shape of the prediction is  $(m, T_v, n_{values})$

### Step 3

- · Convert the indices into their one-hot vector representations.
  - Use to categorical (https://keras.io/utils/#to categorical).
  - Set the num classes parameter. Note that for grading purposes: you'll need to either:
    - Use a dimension from the given parameters of predict\_and\_sample() (for example, one of the dimensions of x initializer has the value for the number of distinct classes).
    - o Or just hard code the number of distinct classes (will pass the grader as well).
    - Note that using a global variable such as n\_values will not work for grading purposes.

```
In [17]: # GRADED FUNCTION: predict and sample
         def predict and sample(inference model, x initializer = x initializer, a initi
         alizer = a initializer,
                                 c initializer = c initializer):
             Predicts the next value of values using the inference model.
             Arguments:
             inference_model -- Keras model instance for inference time
             x initializer -- numpy array of shape (1, 1, 78), one-hot vector initializ
         ing the values generation
             a_initializer -- numpy array of shape (1, n_a), initializing the hidden st
         ate of the LSTM cell
             c initializer -- numpy array of shape (1, n a), initializing the cell stat
         e of the LSTM cel
             Returns:
             results -- numpy-array of shape (Ty, 78), matrix of one-hot vectors repres
         enting the values generated
             indices -- numpy-array of shape (Ty, 1), matrix of indices representing th
         e values generated
             ### START CODE HERE ###
             # Step 1: Use your inference model to predict an output sequence given x i
         nitializer, a initializer and c initializer.
             pred = inference_model.predict([x_initializer, a_initializer, c_initialize
         r])
             # Step 2: Convert "pred" into an np.array() of indices with the maximum pr
         obabilities
             indices = np.argmax(pred, axis=-1)
             # Step 3: Convert indices to one-hot vectors, the shape of the results sho
         uld be (Ty, n values)
             results = to_categorical(indices, num_classes=78)
             ### END CODE HERE ###
             return results, indices
```

### **Expected (Approximate) Output:**

- Your results may likely differ because Keras' results are not completely predictable.
- However, if you have trained your LSTM cell with model.fit() for exactly 100 epochs as described above:
  - You should very likely observe a sequence of indices that are not all identical.
  - Moreover, you should observe that:
    - np.argmax(results[12]) is the first element of list(indices[12:18])
    - and np.argmax(results[17]) is the last element of list(indices[12:18]).

**np.argmax(results[12])** =	1
**np.argmax(results[17])** =	42
**list(indices[12:18])** =	[array([1]), array([42]), array([54]), array([17]), array([1]), array([42])]

#### 3.3 - Generate music

Finally, you are ready to generate music. Your RNN generates a sequence of values. The following code generates music by first calling your predict\_and\_sample() function. These values are then post-processed into musical chords (meaning that multiple values or notes can be played at the same time).

Most computational music algorithms use some post-processing because it is difficult to generate music that sounds good without such post-processing. The post-processing does things such as clean up the generated audio by making sure the same sound is not repeated too many times, that two successive notes are not too far from each other in pitch, and so on. One could argue that a lot of these post-processing steps are hacks; also, a lot of the music generation literature has also focused on hand-crafting post-processors, and a lot of the output quality depends on the quality of the post-processing and not just the quality of the RNN. But this postprocessing does make a huge difference, so let's use it in our implementation as well.

Let's make some music!

Run the following cell to generate music and record it into your out stream. This can take a couple of minutes.

```
In [19]: | out stream = generate music(inference model)
         Predicting new values for different set of chords.
         Generated 51 sounds using the predicted values for the set of chords ("1") an
         d after pruning
         Generated 51 sounds using the predicted values for the set of chords ("2") an
         d after pruning
         Generated 50 sounds using the predicted values for the set of chords ("3") an
         d after pruning
         Generated 51 sounds using the predicted values for the set of chords ("4") an
         d after pruning
         Generated 50 sounds using the predicted values for the set of chords ("5") an
         d after pruning
         Your generated music is saved in output/my music.midi
```

To listen to your music, click File->Open... Then go to "output/" and download "my music.midi". Either play it on your computer with an application that can read midi files if you have one, or use one of the free online "MIDI to mp3" conversion tools to convert this to mp3.

As a reference, here is a 30 second audio clip we generated using this algorithm.

```
In [20]:
        IPython.display.Audio('./data/30s trained model.mp3')
Out[20]:
                0:00 / 0:30
```

## Congratulations!

You have come to the end of the notebook.

# What you should remember

- · A sequence model can be used to generate musical values, which are then post-processed into midi music.
- Fairly similar models can be used to generate dinosaur names or to generate music, with the major difference being the input fed to the model.
- In Keras, sequence generation involves defining layers with shared weights, which are then repeated for the different time steps  $1, \ldots, T_r$ .

Congratulations on completing this assignment and generating a jazz solo!

### References

The ideas presented in this notebook came primarily from three computational music papers cited below. The implementation here also took significant inspiration and used many components from Ji-Sung Kim's GitHub repository.

- Ji-Sung Kim, 2016, <u>deepjazz (https://github.com/jisungk/deepjazz)</u>
- Jon Gillick, Kevin Tang and Robert Keller, 2009. Learning Jazz Grammars (http://ai.stanford.edu/~kdtang/papers/smc09-jazzgrammar.pdf)
- Robert Keller and David Morrison, 2007, A Grammatical Approach to Automatic Improvisation (http://smc07.uoa.gr/SMC07%20Proceedings/SMC07%20Paper%2055.pdf)
- François Pachet, 1999, Surprising Harmonies (http://citeseerx.ist.psu.edu/viewdoc/download? doi=10.1.1.5.7473&rep=rep1&type=pdf)

We're also grateful to François Germain for valuable feedback.