

```
In [1]: #!/usr/bin/env python3
# -*- coding: utf-8 -*-

"""
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Tune hyperparameters of VOC_net model.

"""

%matplotlib inline

import sys
import os
import matplotlib as mpl
import matplotlib.pyplot as plt
import numpy as np
import pandas as pd
from scipy import signal
from ipywidgets import interactive
import seaborn as sns #heat map
import glob # batch processing of images

if '../..' not in sys.path:
    sys.path.append('../..')

import math
from scipy import signal
from sklearn.metrics import confusion_matrix
from sklearn.preprocessing import LabelBinarizer
from sklearn.metrics import roc_curve
from sklearn.metrics import auc
from sklearn.metrics import roc_auc_score

import itertools

from vocnet.misc.utils import classifier_internals
from vocnet.misc.utils import clf_post_processor

from vocnet.spectral_datasets.IR_datasets import IR_data
from vocnet.spectral_datasets.IR_datasets import spectra_to_img
from vocnet.spectral_datasets.THz_datasets import THz_data

from vocnet.misc.aperture import publication_fig
from vocnet.misc.voc_net_utils import multiclass_roc_auc_score
from vocnet.misc.voc_net_utils import plot_raw_scores
from vocnet.misc.voc_net_utils import simple_spectrum_fig
from vocnet.misc.voc_net_utils import simple_plot_raw_scores

from vocnet.misc.voc_net_utils import plot_sequential_group_prediction
```

```

import tensorflow as tf
from tensorflow.keras import datasets, layers, models

GPU_mem_limit=1.0
gpus = tf.config.experimental.list_physical_devices('GPU')
if gpus:
    try:
        tf.config.experimental.set_virtual_device_configuration(gpus[0]

    except RuntimeError as e:
        print(e)

# !pip install git+https://github.com/tensorflow/docs

import tensorflow_docs as tfdocs
import tensorflow_docs.modeling
import tensorflow_docs.plots
import tensorflow_docs.modeling
from tensorflow.keras import regularizers

from vocnet.models.voc_net_models import get_callbacks
from vocnet.models.voc_net_models import get_optimizer
from vocnet.models.voc_net_models import compile_and_fit

from vocnet.models.voc_net_models import C1f1k3_AP1_D12
from vocnet.models.voc_net_models import C1f1k3_MP1_D12

from vocnet.models.voc_net_models import C2f1k3_AP1_D12
from vocnet.models.voc_net_models import C2f1k3_AP1_D48_D12
from vocnet.models.voc_net_models import C2f1k3_AP2_D48_D12

from vocnet.models.voc_net_models import C2f3k3_AP1_D48_D12
from vocnet.models.voc_net_models import C2f3k3_AP1_D6_D12

from vocnet.models.voc_net_models import C1f1k3_AP1_RD50_D12
from vocnet.models.voc_net_models import C1f1k3_AP1_D48_RL1_D12
from vocnet.models.voc_net_models import C2f3k3_AP1_D48_RD50_D12
from vocnet.models.voc_net_models import C2f3k3_AP1_D48_RL1_D12
from vocnet.models.voc_net_models import C2f3k3_AP1_D48_RL1_RD50_D12

from tensorflow import keras
import keras_tuner as kt

#Set random seed
# os.environ['PYTHONHASHSEED'] = str(42)
tf.random.set_seed(42)
# np.random.seed(42)

```

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2022-07-07 12:59:49.632684: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcudart.so.11.0
2022-07-07 12:59:50.496051: I tensorflow/stream_executor/platform/default/

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ult/dso_loader.cc:53] Successfully opened dynamic library libcuda.so.1
2022-07-07 12:59:50.526016: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1733] Found device 0 with properties:
pciBusID: 0000:65:00.0 name: Quadro RTX 4000 computeCapability: 7.5
coreClock: 1.545GHz coreCount: 36 deviceMemorySize: 7.79GiB deviceMemoryBandwidth: 387.49GiB/s
2022-07-07 12:59:50.526078: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcudart.so.11.0
2022-07-07 12:59:50.532176: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcublas.so.11
2022-07-07 12:59:50.532277: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcublasLt.so.11
2022-07-07 12:59:50.533524: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcufft.so.10
2022-07-07 12:59:50.533807: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcurand.so.10
2022-07-07 12:59:50.534369: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcusolver.so.11
2022-07-07 12:59:50.535278: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcusparse.so.11
2022-07-07 12:59:50.535434: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcudnn.so.8
2022-07-07 12:59:50.536294: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1871] Adding visible gpu devices: 0

```

```

In [2]: s = THz_data(resolution=0.016, verbosity = False)
s.load_THz_data()
# s.dataset_info()
X = s.spectra
y = s.targets

X=nn.expand_dims(X,-1)

```

```

In [3]: #split intro train and test set

#seeds used 123,237, 786
from sklearn.model_selection import train_test_split

TRAIN_SIZE=0.70
TEST_SIZE=1-TRAIN_SIZE

x_train, x_test, y_train, y_test = train_test_split(X, y, train_size=TRAIN_SIZE,
                                                    test_size=TEST_SIZE,
                                                    random_state=786,
                                                    stratify=y
                                                    )

print("All:", np.bincount(y) / float(len(y))*100 )

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```
print("Training:", np.bincount(y_train) / float(len(y_train))*100 )
print("Testing:", np.bincount(y_test) / float(len(y_test))*100 )
```

All: [8.33333333 8.33333333 8.33333333 8.33333333 8.33333333 8.33333333
3
8.33333333 8.33333333 8.33333333 8.33333333 8.33333333 8.33333333]
Training: [8.35148874 8.35148874 8.35148874 8.35148874 8.35148874 8.35
148874
8.35148874 8.2788671 8.35148874 8.35148874 8.2788671 8.2788671]
Testing: [8.29103215 8.29103215 8.29103215 8.29103215 8.29103215 8.291
03215
8.29103215 8.46023689 8.29103215 8.29103215 8.46023689 8.46023689]

```
In [4]: def thz_model(hp):

    model = models.Sequential()

    hp_filters= hp.Int('filters', min_value=2, max_value=4, step=1)
    # hp_kernel_size= hp.Int('kernel_size', min_value=3, max_value=5, s
    # hp_pool_size=hp.Int('pool_size', min_value=2, max_value=3, step=1
    # hp_stride_size=hp.Int('stride_size', min_value=2, max_value=3, st
    hp_units= hp.Int('units', min_value=24, max_value=48, step=6)
    # hp_dropout = hp.Choice('dropout', values=[0.3, 0.5, 0.7])
    hp_learning_rate = hp.Choice('learning_rate', values=[1e-2, 1e-3, 1

    # C1 Convolutional Layer
    model.add(layers.Conv1D(filters = hp_filters , kernel_size=3, activ

    # S2 Subsampling Layer
    model.add(layers.AveragePooling1D(pool_size = 2, strides = 2, paddi

    # C3 Convolutional Layer
    model.add(layers.Conv1D(filters = hp_filters , kernel_size=3, activ

    # Flatten the CNN output to feed it with fully connected layers
    model.add(layers.Flatten())

    model.add(layers.Dense(hp_units, activation='relu'))
    model.add(layers.Dropout(0.5))
    model.add(layers.Dense(12)) # number of dense layer would be equal

    # Tune the learning rate for the optimizer
    # Choose an optimal value from 0.01, 0.001, or 0.0001

    model.compile(optimizer=tf.keras.optimizers.Adam(learning_rate=hp_l
                  loss=tf.keras.losses.SparseCategoricalCrossentropy(from_log
                  metrics=[
                      tf.keras.losses.SparseCategoricalCrossentropy(
                          from_logits=True, name='SparseCatCrossentropy'),
                      'accuracy'])

    model.summary()

    return model
```

```
In [5]: tuner = kt.Hyperband(thz_model,
                             objective='accuracy',
                             max_epochs=10,
                             factor=3,
                             directory='keras_hp_tuner',
                             project_name='thz-cnn')
```

INFO:tensorflow:Reloading Oracle from existing project keras_hp_tuner/thz-cnn/oracle.json

Model: "sequential"

Layer (type)	Output Shape	Param #
=====		
C1 (Conv1D)	(None, 227, 2)	8
S2 (AveragePooling1D)	(None, 113, 2)	0
C3 (Conv1D)	(None, 111, 2)	14
flatten (Flatten)	(None, 222)	0
dense (Dense)	(None, 24)	5352
dropout (Dropout)	(None, 24)	0
dense_1 (Dense)	(None, 12)	300
=====		

Total params: 5,674

Trainable params: 5,674

Non-trainable params: 0

INFO:tensorflow:Reloading Tuner from keras_hp_tuner/thz-cnn/tuner0.json

2022-07-07 12:59:52.679286: I tensorflow/core/platform/cpu_feature_guard.cc:142] This TensorFlow binary is optimized with oneAPI Deep Neural Network Library (oneDNN) to use the following CPU instructions in performance-critical operations: AVX2 AVX512F FMA

To enable them in other operations, rebuild TensorFlow with the appropriate compiler flags.

2022-07-07 12:59:52.680229: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1733] Found device 0 with properties:

pciBusID: 0000:65:00.0 name: Quadro RTX 4000 computeCapability: 7.5
coreClock: 1.545GHz coreCount: 36 deviceMemorySize: 7.79GiB deviceMemoryBandwidth: 387.49GiB/s

2022-07-07 12:59:52.681113: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1871] Adding visible gpu devices: 0

2022-07-07 12:59:52.681194: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcudart.so.11.0

2022-07-07 12:59:53.086049: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1258] Device interconnect StreamExecutor with strength 1 edge matrix:

2022-07-07 12:59:53.086073: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1264] 0

2022-07-07 12:59:53.086078: I tensorflow/core/common_runtime/gpu/gpu_d

```

evice.cc:1277] 0:    N
2022-07-07 12:59:53.087017: I tensorflow/core/common_runtime/gpu/gpu_d
evice.cc:1418] Created TensorFlow device (/job:localhost/replica:0/task:0/device:GPU:0 with 1000 MB memory) -> physical GPU (device: 0, nam
e: Quadro RTX 4000, pci bus id: 0000:65:00:0, compute capability: 7.5)

```

In [6]: `stop_early = tf.keras.callbacks.EarlyStopping(monitor='SparseCatCrossen`

In [7]: `# tuner.search(X, y, epochs=200, validation_split=0.3, callbacks=[stop_
tuner.search(X, y, epochs=200, validation_data=(x_test, y_test), callba`

```

# Get the optimal hyperparameters
best_hps=tuner.get_best_hyperparameters(num_trials=2)[0]

```

INFO:tensorflow:Oracle triggered exit

In [8]: `print("""The hyperparameter search is complete.""")
print(f"""
hp_filters_1= {best_hps.get('filters')}
hp_kernel_size= {best_hps.get('kernel_size')}
hp_pool_size= {best_hps.get('pool_size')}
hp_stride_size={best_hps.get('stride_size')}
hp_units= {best_hps.get('units')}
hp_dropout = {best_hps.get('dropout')}
hp_learning_rate = {best_hps.get('learning_rate')}
""")

print(f"""
hp_filters= {best_hps.get('filters')}

hp_units= {best_hps.get('units')}

hp_learning_rate = {best_hps.get('learning_rate')}
""")`

The hyperparameter search is complete.

hp_filters= 3

hp_units= 48

hp_learning_rate = 0.01

In [9]: `best_hps.space`

Out[9]:

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[Int(name: "filters", min_value: 2, max_value: 4, step: 1, sampling: N
... default: 3)]
```

```
In [10]: # Build the model with the optimal hyperparameters and train it on the
model = tuner.hypermodel.build(best_hps)
history = model.fit(x_train, y_train, epochs=200, validation_data=(x_te

val_acc_per_epoch = history.history['val_accuracy']
best_epoch = val_acc_per_epoch.index(max(val_acc_per_epoch)) + 1
print('Best epoch: %d' % (best_epoch))
```

Model: "sequential_1"

Layer (type)	Output Shape	Param #
=====		
C1 (Conv1D)	(None, 227, 3)	12
S2 (AveragePooling1D)	(None, 113, 3)	0
C3 (Conv1D)	(None, 111, 3)	30
flatten_1 (Flatten)	(None, 333)	0
dense_2 (Dense)	(None, 48)	16032
dropout_1 (Dropout)	(None, 48)	0
dense_3 (Dense)	(None, 12)	588
=====		

Total params: 16,662

Trainable params: 16,662

Non-trainable params: 0

Epoch 1/200

2022-07-07 13:00:03.476771: I tensorflow/compiler/mlir/mlir_graph_optimization_pass.cc:176] None of the MLIR Optimization Passes are enabled (registered 2)

2022-07-07 13:00:03.497642: I tensorflow/core/platform/profile_utils/cpu_utils.cc:114] CPU Frequency: 3600000000 Hz

2022-07-07 13:00:03.988891: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcudnn.so.8

2022-07-07 13:00:04.233095: I tensorflow/stream_executor/cuda/cuda_dnn.cc:359] Loaded cuDNN version 8204

2022-07-07 13:00:04.689231: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcublas.so.11

1/44 [.....] - ETA: 1:18 - loss: 2.4642 - SparseCatCrossentropy: 2.4642 - accuracy: 0.0312

2022-07-07 13:00:05.156000: I tensorflow/stream_executor/platform/default/dso_loader.cc:53] Successfully opened dynamic library libcublasLt.so.11

```
44/44 [=====] - 2s 12ms/step - loss: 1.0290 -  
SparseCatCrossentropy: 1.0064 - accuracy: 0.7248 - val_loss: 0.1309 -  
val_SparseCatCrossentropy: 0.1310 - val_accuracy: 0.9831  
Epoch 2/200  
44/44 [=====] - 0s 7ms/step - loss: 0.1921 -  
SparseCatCrossentropy: 0.1880 - accuracy: 0.9506 - val_loss: 0.0470 -  
val_SparseCatCrossentropy: 0.0473 - val_accuracy: 0.9949  
Epoch 3/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0980 -  
SparseCatCrossentropy: 0.0995 - accuracy: 0.9826 - val_loss: 0.0304 -  
val_SparseCatCrossentropy: 0.0304 - val_accuracy: 0.9966  
Epoch 4/200  
44/44 [=====] - 0s 7ms/step - loss: 0.1575 -  
SparseCatCrossentropy: 0.1541 - accuracy: 0.9731 - val_loss: 0.0179 -  
val_SparseCatCrossentropy: 0.0183 - val_accuracy: 1.0000  
Epoch 5/200  
44/44 [=====] - 0s 7ms/step - loss: 0.1309 -  
SparseCatCrossentropy: 0.1280 - accuracy: 0.9739 - val_loss: 0.0190 -  
val_SparseCatCrossentropy: 0.0196 - val_accuracy: 1.0000  
Epoch 6/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0694 -  
SparseCatCrossentropy: 0.0783 - accuracy: 0.9804 - val_loss: 0.0175 -  
val_SparseCatCrossentropy: 0.0175 - val_accuracy: 1.0000  
Epoch 7/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0744 -  
SparseCatCrossentropy: 0.0728 - accuracy: 0.9811 - val_loss: 0.0101 -  
val_SparseCatCrossentropy: 0.0100 - val_accuracy: 1.0000  
Epoch 8/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0796 -  
SparseCatCrossentropy: 0.0779 - accuracy: 0.9811 - val_loss: 0.0131 -  
val_SparseCatCrossentropy: 0.0133 - val_accuracy: 0.9983  
Epoch 9/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0610 -  
SparseCatCrossentropy: 0.0596 - accuracy: 0.9833 - val_loss: 0.0088 -  
val_SparseCatCrossentropy: 0.0087 - val_accuracy: 1.0000  
Epoch 10/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0765 -  
SparseCatCrossentropy: 0.0748 - accuracy: 0.9855 - val_loss: 0.0132 -  
val_SparseCatCrossentropy: 0.0130 - val_accuracy: 0.9949  
Epoch 11/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0772 -  
SparseCatCrossentropy: 0.0755 - accuracy: 0.9818 - val_loss: 0.0059 -  
val_SparseCatCrossentropy: 0.0059 - val_accuracy: 1.0000  
Epoch 12/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0853 -  
SparseCatCrossentropy: 0.0834 - accuracy: 0.9775 - val_loss: 0.0198 -  
val_SparseCatCrossentropy: 0.0197 - val_accuracy: 0.9932  
Epoch 13/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0578 -  
SparseCatCrossentropy: 0.0565 - accuracy: 0.9855 - val_loss: 0.0049 -  
val_SparseCatCrossentropy: 0.0048 - val_accuracy: 1.0000  
Epoch 14/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0553 -  
SparseCatCrossentropy: 0.0541 - accuracy: 0.9789 - val_loss: 0.0068 -  
val_SparseCatCrossentropy: 0.0068 - val_accuracy: 1.0000  
Epoch 15/200
```



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44/44 [=====] - 0s 7ms/step - loss: 0.0363 -  
SparseCatCrossentropy: 0.0355 - accuracy: 0.9891 - val_loss: 0.0033 -  
val_SparseCatCrossentropy: 0.0032 - val_accuracy: 1.0000  
Epoch 16/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0199 -  
SparseCatCrossentropy: 0.0195 - accuracy: 0.9927 - val_loss: 0.0025 -  
val_SparseCatCrossentropy: 0.0025 - val_accuracy: 1.0000  
Epoch 17/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0371 -  
SparseCatCrossentropy: 0.0363 - accuracy: 0.9898 - val_loss: 0.0023 -  
val_SparseCatCrossentropy: 0.0023 - val_accuracy: 1.0000  
Epoch 18/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0445 -  
SparseCatCrossentropy: 0.0436 - accuracy: 0.9847 - val_loss: 0.0087 -  
val_SparseCatCrossentropy: 0.0087 - val_accuracy: 1.0000  
Epoch 19/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0254 -  
SparseCatCrossentropy: 0.0249 - accuracy: 0.9935 - val_loss: 0.0030 -  
val_SparseCatCrossentropy: 0.0030 - val_accuracy: 1.0000  
Epoch 20/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0473 -  
SparseCatCrossentropy: 0.0463 - accuracy: 0.9898 - val_loss: 0.0022 -  
val_SparseCatCrossentropy: 0.0021 - val_accuracy: 1.0000  
Epoch 21/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0569 -  
SparseCatCrossentropy: 0.0557 - accuracy: 0.9877 - val_loss: 0.0022 -  
val_SparseCatCrossentropy: 0.0021 - val_accuracy: 1.0000  
Epoch 22/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0342 -  
SparseCatCrossentropy: 0.0481 - accuracy: 0.9920 - val_loss: 0.0086 -  
val_SparseCatCrossentropy: 0.0086 - val_accuracy: 1.0000  
Epoch 23/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0529 -  
SparseCatCrossentropy: 0.0517 - accuracy: 0.9847 - val_loss: 0.0071 -  
val_SparseCatCrossentropy: 0.0070 - val_accuracy: 1.0000  
Epoch 24/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0494 -  
SparseCatCrossentropy: 0.0484 - accuracy: 0.9898 - val_loss: 0.0051 -  
val_SparseCatCrossentropy: 0.0050 - val_accuracy: 1.0000  
Epoch 25/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0422 -  
SparseCatCrossentropy: 0.0413 - accuracy: 0.9898 - val_loss: 0.0052 -  
val_SparseCatCrossentropy: 0.0051 - val_accuracy: 1.0000  
Epoch 26/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0246 -  
SparseCatCrossentropy: 0.0241 - accuracy: 0.9942 - val_loss: 0.0040 -  
val_SparseCatCrossentropy: 0.0039 - val_accuracy: 1.0000  
Epoch 27/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0287 -  
SparseCatCrossentropy: 0.0281 - accuracy: 0.9927 - val_loss: 0.0038 -  
val_SparseCatCrossentropy: 0.0038 - val_accuracy: 1.0000  
Epoch 28/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0495 -  
SparseCatCrossentropy: 0.0484 - accuracy: 0.9891 - val_loss: 0.0025 -  
val_SparseCatCrossentropy: 0.0024 - val_accuracy: 1.0000  
Epoch 29/200
```

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44/44 [=====] - 0s 7ms/step - loss: 0.0671 -  
SparseCatCrossentropy: 0.0657 - accuracy: 0.9862 - val_loss: 0.0091 -  
val_SparseCatCrossentropy: 0.0089 - val_accuracy: 0.9983  
Epoch 30/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0323 -  
SparseCatCrossentropy: 0.0316 - accuracy: 0.9920 - val_loss: 0.0020 -  
val_SparseCatCrossentropy: 0.0020 - val_accuracy: 1.0000  
Epoch 31/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0229 -  
SparseCatCrossentropy: 0.0224 - accuracy: 0.9927 - val_loss: 0.0016 -  
val_SparseCatCrossentropy: 0.0015 - val_accuracy: 1.0000  
Epoch 32/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0277 -  
SparseCatCrossentropy: 0.0271 - accuracy: 0.9949 - val_loss: 9.1887e-0  
4 - val_SparseCatCrossentropy: 9.0230e-04 - val_accuracy: 1.0000  
Epoch 33/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0597 -  
SparseCatCrossentropy: 0.0583 - accuracy: 0.9869 - val_loss: 0.0034 -  
val_SparseCatCrossentropy: 0.0033 - val_accuracy: 1.0000  
Epoch 34/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0627 -  
SparseCatCrossentropy: 0.0613 - accuracy: 0.9855 - val_loss: 0.0020 -  
val_SparseCatCrossentropy: 0.0019 - val_accuracy: 1.0000  
Epoch 35/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0232 -  
SparseCatCrossentropy: 0.0227 - accuracy: 0.9920 - val_loss: 0.0065 -  
val_SparseCatCrossentropy: 0.0064 - val_accuracy: 0.9983  
Epoch 36/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0299 -  
SparseCatCrossentropy: 0.0292 - accuracy: 0.9935 - val_loss: 0.0012 -  
val_SparseCatCrossentropy: 0.0012 - val_accuracy: 1.0000  
Epoch 37/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0256 -  
SparseCatCrossentropy: 0.0251 - accuracy: 0.9920 - val_loss: 0.0011 -  
val_SparseCatCrossentropy: 0.0011 - val_accuracy: 1.0000  
Epoch 38/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0241 -  
SparseCatCrossentropy: 0.0239 - accuracy: 0.9920 - val_loss: 8.8106e-0  
4 - val_SparseCatCrossentropy: 8.5953e-04 - val_accuracy: 1.0000  
Epoch 39/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0210 -  
SparseCatCrossentropy: 0.0203 - accuracy: 0.9964 - val_loss: 0.0022 -  
val_SparseCatCrossentropy: 0.0021 - val_accuracy: 1.0000  
Epoch 41/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0177 -  
SparseCatCrossentropy: 0.0173 - accuracy: 0.9942 - val_loss: 7.7580e-0  
4 - val_SparseCatCrossentropy: 7.5815e-04 - val_accuracy: 1.0000  
Epoch 42/200  
44/44 [=====] - 0s 8ms/step - loss: 0.0153 -  
SparseCatCrossentropy: 0.0150 - accuracy: 0.9971 - val_loss: 5.8284e-0  
4 - val_SparseCatCrossentropy: 5.6970e-04 - val_accuracy: 1.0000  
Epoch 43/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0175 -  
SparseCatCrossentropy: 0.0171 - accuracy: 0.9927 - val_loss: 9.4120e-0  
4 - val_SparseCatCrossentropy: 9.2694e-04 - val_accuracy: 1.0000
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Epoch 44/200
44/44 [=====] - 0s 7ms/step - loss: 0.0190 -
SparseCatCrossentropy: 0.0185 - accuracy: 0.9949 - val_loss: 8.0197e-0
4 - val_SparseCatCrossentropy: 7.9714e-04 - val_accuracy: 1.0000
Epoch 45/200
44/44 [=====] - 0s 7ms/step - loss: 0.0232 -
SparseCatCrossentropy: 0.0227 - accuracy: 0.9935 - val_loss: 4.6704e-0
4 - val_SparseCatCrossentropy: 4.6424e-04 - val_accuracy: 1.0000
Epoch 46/200
44/44 [=====] - 0s 7ms/step - loss: 0.0356 -
SparseCatCrossentropy: 0.0348 - accuracy: 0.9935 - val_loss: 0.0010 -
val_SparseCatCrossentropy: 9.9114e-04 - val_accuracy: 1.0000
Epoch 47/200
44/44 [=====] - 0s 7ms/step - loss: 0.0107 -
SparseCatCrossentropy: 0.0104 - accuracy: 0.9964 - val_loss: 7.9604e-0
4 - val_SparseCatCrossentropy: 7.7504e-04 - val_accuracy: 1.0000
Epoch 48/200
44/44 [=====] - 0s 7ms/step - loss: 0.0160 -
SparseCatCrossentropy: 0.0157 - accuracy: 0.9985 - val_loss: 4.0670e-0
4 - val_SparseCatCrossentropy: 3.9696e-04 - val_accuracy: 1.0000
Epoch 49/200
44/44 [=====] - 0s 7ms/step - loss: 0.0162 -
SparseCatCrossentropy: 0.0158 - accuracy: 0.9956 - val_loss: 0.0047 -
val_SparseCatCrossentropy: 0.0046 - val_accuracy: 0.9983
Epoch 50/200
44/44 [=====] - 0s 7ms/step - loss: 0.0183 -
SparseCatCrossentropy: 0.0179 - accuracy: 0.9942 - val_loss: 5.9630e-0
4 - val_SparseCatCrossentropy: 5.8517e-04 - val_accuracy: 1.0000
Epoch 51/200
44/44 [=====] - 0s 7ms/step - loss: 0.0086 -
SparseCatCrossentropy: 0.0084 - accuracy: 0.9971 - val_loss: 0.0015 -
val_SparseCatCrossentropy: 0.0014 - val_accuracy: 1.0000
Epoch 52/200
44/44 [=====] - 0s 7ms/step - loss: 0.0147 -
SparseCatCrossentropy: 0.0144 - accuracy: 0.9956 - val_loss: 5.1408e-0
4 - val_SparseCatCrossentropy: 5.0617e-04 - val_accuracy: 1.0000
Epoch 53/200
44/44 [=====] - 0s 7ms/step - loss: 0.0214 -
SparseCatCrossentropy: 0.0209 - accuracy: 0.9920 - val_loss: 8.1163e-0
4 - val_SparseCatCrossentropy: 7.9484e-04 - val_accuracy: 1.0000
Epoch 54/200
44/44 [=====] - 0s 7ms/step - loss: 0.0112 -
SparseCatCrossentropy: 0.0109 - accuracy: 0.9971 - val_loss: 0.0014 -
val_SparseCatCrossentropy: 0.0013 - val_accuracy: 1.0000
Epoch 55/200
44/44 [=====] - 0s 7ms/step - loss: 0.0218 -
SparseCatCrossentropy: 0.0213 - accuracy: 0.9956 - val_loss: 5.1348e-0
4 - val_SparseCatCrossentropy: 5.0079e-04 - val_accuracy: 1.0000
Epoch 56/200
44/44 [=====] - 0s 7ms/step - loss: 0.0049 -
SparseCatCrossentropy: 0.0048 - accuracy: 0.9985 - val_loss: 1.3071e-0
4 - val_SparseCatCrossentropy: 1.2739e-04 - val_accuracy: 1.0000
Epoch 57/200
44/44 [=====] - 0s 7ms/step - loss: 0.0154 -
SparseCatCrossentropy: 0.0151 - accuracy: 0.9964 - val_loss: 0.0012 -
val_SparseCatCrossentropy: 0.0011 - val_accuracy: 1.0000
```

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Epoch 58/200
44/44 [=====] - 0s 7ms/step - loss: 0.0352 -
SparseCatCrossentropy: 0.0346 - accuracy: 0.9906 - val_loss: 0.0011 -
val_SparseCatCrossentropy: 0.0010 - val_accuracy: 1.0000
Epoch 59/200
44/44 [=====] - 0s 7ms/step - loss: 0.0524 -
SparseCatCrossentropy: 0.0513 - accuracy: 0.9927 - val_loss: 0.0013 -
val_SparseCatCrossentropy: 0.0013 - val_accuracy: 1.0000
Epoch 60/200
44/44 [=====] - 0s 7ms/step - loss: 0.0093 -
SparseCatCrossentropy: 0.0091 - accuracy: 0.9985 - val_loss: 2.8741e-0
4 - val_SparseCatCrossentropy: 2.8030e-04 - val_accuracy: 1.0000
Epoch 61/200
44/44 [=====] - 0s 7ms/step - loss: 0.0168 -
SparseCatCrossentropy: 0.0164 - accuracy: 0.9964 - val_loss: 3.6585e-0
4 - val_SparseCatCrossentropy: 3.5815e-04 - val_accuracy: 1.0000
Epoch 62/200
44/44 [=====] - 0s 7ms/step - loss: 0.0117 -
SparseCatCrossentropy: 0.0114 - accuracy: 0.9978 - val_loss: 1.5240e-0
4 - val_SparseCatCrossentropy: 1.4924e-04 - val_accuracy: 1.0000
Epoch 63/200
44/44 [=====] - 0s 7ms/step - loss: 0.0062 -
SparseCatCrossentropy: 0.0060 - accuracy: 0.9985 - val_loss: 1.2638e-0
4 - val_SparseCatCrossentropy: 1.2355e-04 - val_accuracy: 1.0000
Epoch 64/200
44/44 [=====] - 0s 7ms/step - loss: 0.0101 -
SparseCatCrossentropy: 0.0099 - accuracy: 0.9964 - val_loss: 7.0945e-0
5 - val_SparseCatCrossentropy: 6.9211e-05 - val_accuracy: 1.0000
Epoch 65/200
44/44 [=====] - 0s 7ms/step - loss: 0.0137 -
SparseCatCrossentropy: 0.0134 - accuracy: 0.9971 - val_loss: 7.2444e-0
5 - val_SparseCatCrossentropy: 7.0598e-05 - val_accuracy: 1.0000
Epoch 66/200
44/44 [=====] - 0s 7ms/step - loss: 0.0200 -
SparseCatCrossentropy: 0.0196 - accuracy: 0.9956 - val_loss: 1.3249e-0
4 - val_SparseCatCrossentropy: 1.2903e-04 - val_accuracy: 1.0000
Epoch 67/200
44/44 [=====] - 0s 7ms/step - loss: 0.0212 -
SparseCatCrossentropy: 0.0207 - accuracy: 0.9956 - val_loss: 1.6195e-0
4 - val_SparseCatCrossentropy: 1.5819e-04 - val_accuracy: 1.0000
Epoch 68/200
44/44 [=====] - 0s 7ms/step - loss: 0.0044 -
SparseCatCrossentropy: 0.0043 - accuracy: 0.9985 - val_loss: 1.0475e-0
4 - val_SparseCatCrossentropy: 1.0191e-04 - val_accuracy: 1.0000
Epoch 69/200
44/44 [=====] - 0s 7ms/step - loss: 0.0134 -
SparseCatCrossentropy: 0.0131 - accuracy: 0.9949 - val_loss: 8.8742e-0
5 - val_SparseCatCrossentropy: 8.6347e-05 - val_accuracy: 1.0000
Epoch 70/200
44/44 [=====] - 0s 7ms/step - loss: 0.0167 -
SparseCatCrossentropy: 0.0163 - accuracy: 0.9949 - val_loss: 7.4353e-0
5 - val_SparseCatCrossentropy: 7.2343e-05 - val_accuracy: 1.0000
Epoch 71/200
44/44 [=====] - 0s 7ms/step - loss: 0.0184 -
SparseCatCrossentropy: 0.0180 - accuracy: 0.9971 - val_loss: 7.9321e-0
5 - val_SparseCatCrossentropy: 7.7259e-05 - val_accuracy: 1.0000
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Epoch 72/200
44/44 [=====] - 0s 7ms/step - loss: 0.0182 -
SparseCatCrossentropy: 0.0178 - accuracy: 0.9949 - val_loss: 3.5428e-0
5 - val_SparseCatCrossentropy: 3.4560e-05 - val_accuracy: 1.0000
Epoch 73/200
44/44 [=====] - 0s 10ms/step - loss: 0.0103 -
SparseCatCrossentropy: 0.0101 - accuracy: 0.9971 - val_loss: 3.6066e-0
5 - val_SparseCatCrossentropy: 3.5118e-05 - val_accuracy: 1.0000
Epoch 74/200
44/44 [=====] - 0s 4ms/step - loss: 0.0060 -
SparseCatCrossentropy: 0.0059 - accuracy: 0.9985 - val_loss: 5.8322e-0
5 - val_SparseCatCrossentropy: 5.6772e-05 - val_accuracy: 1.0000
Epoch 75/200
44/44 [=====] - 0s 6ms/step - loss: 0.0077 -
SparseCatCrossentropy: 0.0076 - accuracy: 0.9971 - val_loss: 2.5710e-0
5 - val_SparseCatCrossentropy: 2.5018e-05 - val_accuracy: 1.0000
Epoch 76/200
44/44 [=====] - 0s 6ms/step - loss: 0.0124 -
SparseCatCrossentropy: 0.0121 - accuracy: 0.9964 - val_loss: 4.1023e-0
5 - val_SparseCatCrossentropy: 3.9919e-05 - val_accuracy: 1.0000
Epoch 77/200
44/44 [=====] - 0s 7ms/step - loss: 0.0086 -
SparseCatCrossentropy: 0.0084 - accuracy: 0.9971 - val_loss: 3.2143e-0
Epoch 78/200
44/44 [=====] - 0s 7ms/step - loss: 0.0223 -
SparseCatCrossentropy: 0.0218 - accuracy: 0.9949 - val_loss: 3.4710e-0
5 - val_SparseCatCrossentropy: 3.3842e-05 - val_accuracy: 1.0000
Epoch 79/200
44/44 [=====] - 0s 7ms/step - loss: 0.0236 -
SparseCatCrossentropy: 0.0231 - accuracy: 0.9942 - val_loss: 8.1616e-0
5 - val_SparseCatCrossentropy: 7.9573e-05 - val_accuracy: 1.0000
Epoch 80/200
44/44 [=====] - 0s 8ms/step - loss: 0.0116 -
SparseCatCrossentropy: 0.0113 - accuracy: 0.9971 - val_loss: 8.3661e-0
5 - val_SparseCatCrossentropy: 8.1448e-05 - val_accuracy: 1.0000
Epoch 81/200
44/44 [=====] - 0s 7ms/step - loss: 0.0046 -
SparseCatCrossentropy: 0.0045 - accuracy: 0.9978 - val_loss: 5.4689e-0
5 - val_SparseCatCrossentropy: 5.3328e-05 - val_accuracy: 1.0000
Epoch 82/200
44/44 [=====] - 0s 7ms/step - loss: 0.0087 -
SparseCatCrossentropy: 0.0195 - accuracy: 0.9985 - val_loss: 3.6450e-0
5 - val_SparseCatCrossentropy: 3.5531e-05 - val_accuracy: 1.0000
Epoch 83/200
44/44 [=====] - 0s 7ms/step - loss: 0.0089 -
SparseCatCrossentropy: 0.0087 - accuracy: 0.9964 - val_loss: 4.7772e-0
5 - val_SparseCatCrossentropy: 4.6563e-05 - val_accuracy: 1.0000
Epoch 84/200
44/44 [=====] - 0s 7ms/step - loss: 0.0089 -
SparseCatCrossentropy: 0.0087 - accuracy: 0.9964 - val_loss: 2.6261e-0
5 - val_SparseCatCrossentropy: 2.5574e-05 - val_accuracy: 1.0000
Epoch 85/200
44/44 [=====] - 0s 7ms/step - loss: 0.0120 -
SparseCatCrossentropy: 0.0117 - accuracy: 0.9971 - val_loss: 8.6612e-0
4 - val_SparseCatCrossentropy: 8.4242e-04 - val_accuracy: 1.0000
Epoch 86/200
```

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44/44 [=====] - 0s 7ms/step - loss: 0.0095 -  
SparseCatCrossentropy: 0.0093 - accuracy: 0.9978 - val_loss: 5.7765e-0  
5 - val_SparseCatCrossentropy: 5.6263e-05 - val_accuracy: 1.0000  
Epoch 87/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0110 -  
SparseCatCrossentropy: 0.0108 - accuracy: 0.9985 - val_loss: 0.0013 -  
val_SparseCatCrossentropy: 0.0012 - val_accuracy: 1.0000  
Epoch 88/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0079 -  
SparseCatCrossentropy: 0.0077 - accuracy: 0.9971 - val_loss: 2.4174e-0  
5 - val_SparseCatCrossentropy: 2.3543e-05 - val_accuracy: 1.0000  
Epoch 89/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0066 -  
SparseCatCrossentropy: 0.0065 - accuracy: 0.9978 - val_loss: 7.9308e-0  
5 - val_SparseCatCrossentropy: 7.7202e-05 - val_accuracy: 1.0000  
Epoch 90/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0115 -  
SparseCatCrossentropy: 0.0113 - accuracy: 0.9978 - val_loss: 8.9024e-0  
6 - val_SparseCatCrossentropy: 8.6704e-06 - val_accuracy: 1.0000  
Epoch 91/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0041 -  
SparseCatCrossentropy: 0.0041 - accuracy: 0.9993 - val_loss: 0.0021 -  
val_SparseCatCrossentropy: 0.0021 - val_accuracy: 1.0000  
Epoch 92/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0168 -  
SparseCatCrossentropy: 0.0165 - accuracy: 0.9949 - val_loss: 4.1867e-0  
5 - val_SparseCatCrossentropy: 4.0866e-05 - val_accuracy: 1.0000  
Epoch 93/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0063 -  
SparseCatCrossentropy: 0.0062 - accuracy: 0.9978 - val_loss: 1.9747e-0  
5 - val_SparseCatCrossentropy: 1.9210e-05 - val_accuracy: 1.0000  
Epoch 94/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0069 -  
SparseCatCrossentropy: 0.0067 - accuracy: 0.9978 - val_loss: 4.9458e-0  
5 - val_SparseCatCrossentropy: 4.8092e-05 - val_accuracy: 1.0000  
Epoch 95/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0145 -  
SparseCatCrossentropy: 0.0142 - accuracy: 0.9949 - val_loss: 7.3281e-0  
5 - val_SparseCatCrossentropy: 7.1252e-05 - val_accuracy: 1.0000  
Epoch 96/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0226 -  
SparseCatCrossentropy: 0.0221 - accuracy: 0.9949 - val_loss: 1.6133e-0  
5 - val_SparseCatCrossentropy: 1.5704e-05 - val_accuracy: 1.0000  
Epoch 97/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0142 -  
SparseCatCrossentropy: 0.0139 - accuracy: 0.9956 - val_loss: 2.6409e-0  
5 - val_SparseCatCrossentropy: 2.5678e-05 - val_accuracy: 1.0000  
Epoch 98/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0113 -  
SparseCatCrossentropy: 0.0111 - accuracy: 0.9956 - val_loss: 8.3983e-0  
5 - val_SparseCatCrossentropy: 8.1694e-05 - val_accuracy: 1.0000  
Epoch 99/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0220 -  
SparseCatCrossentropy: 0.0215 - accuracy: 0.9964 - val_loss: 1.8699e-0  
5 - val_SparseCatCrossentropy: 1.8180e-05 - val_accuracy: 1.0000  
Epoch 100/200
```

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44/44 [=====] - 0s 7ms/step - loss: 0.0124 -  
SparseCatCrossentropy: 0.0121 - accuracy: 0.9964 - val_loss: 1.5941e-0  
5 - val_SparseCatCrossentropy: 1.5503e-05 - val_accuracy: 1.0000  
Epoch 101/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0069 -  
SparseCatCrossentropy: 0.0068 - accuracy: 0.9971 - val_loss: 1.8244e-0  
5 - val_SparseCatCrossentropy: 1.7739e-05 - val_accuracy: 1.0000  
Epoch 102/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0132 -  
SparseCatCrossentropy: 0.0129 - accuracy: 0.9956 - val_loss: 1.4686e-0  
5 - val_SparseCatCrossentropy: 1.4283e-05 - val_accuracy: 1.0000  
Epoch 103/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0025 -  
SparseCatCrossentropy: 0.0024 - accuracy: 0.9993 - val_loss: 9.2218e-0  
6 - val_SparseCatCrossentropy: 8.9670e-06 - val_accuracy: 1.0000  
Epoch 104/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0163 -  
SparseCatCrossentropy: 0.0159 - accuracy: 0.9956 - val_loss: 2.4101e-0  
5 - val_SparseCatCrossentropy: 2.3437e-05 - val_accuracy: 1.0000  
Epoch 105/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0165 -  
SparseCatCrossentropy: 0.0162 - accuracy: 0.9964 - val_loss: 4.5554e-0  
5 - val_SparseCatCrossentropy: 4.4281e-05 - val_accuracy: 1.0000  
Epoch 106/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0135 -  
SparseCatCrossentropy: 0.0132 - accuracy: 0.9942 - val_loss: 7.0697e-0  
5 - val_SparseCatCrossentropy: 6.8722e-05 - val_accuracy: 1.0000  
Epoch 107/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0189 -  
SparseCatCrossentropy: 0.0185 - accuracy: 0.9935 - val_loss: 3.2818e-0  
4 - val_SparseCatCrossentropy: 3.1901e-04 - val_accuracy: 1.0000  
Epoch 108/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0138 -  
SparseCatCrossentropy: 0.0135 - accuracy: 0.9956 - val_loss: 2.6052e-0  
5 - val_SparseCatCrossentropy: 2.5326e-05 - val_accuracy: 1.0000  
Epoch 109/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0187 -  
SparseCatCrossentropy: 0.0183 - accuracy: 0.9964 - val_loss: 0.0019 -  
val_SparseCatCrossentropy: 0.0018 - val_accuracy: 0.9983  
Epoch 110/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0185 -  
SparseCatCrossentropy: 0.0181 - accuracy: 0.9985 - val_loss: 9.1615e-0  
6 - val_SparseCatCrossentropy: 8.9062e-06 - val_accuracy: 1.0000  
Epoch 111/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0151 -  
SparseCatCrossentropy: 0.0148 - accuracy: 0.9956 - val_loss: 1.6466e-0  
4 - val_SparseCatCrossentropy: 1.6005e-04 - val_accuracy: 1.0000  
Epoch 112/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0188 -  
SparseCatCrossentropy: 0.0183 - accuracy: 0.9942 - val_loss: 9.9832e-0  
6 - val_SparseCatCrossentropy: 9.7045e-06 - val_accuracy: 1.0000  
Epoch 113/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0121 -  
SparseCatCrossentropy: 0.0118 - accuracy: 0.9956 - val_loss: 4.8969e-0  
5 - val_SparseCatCrossentropy: 4.7603e-05 - val_accuracy: 1.0000  
Epoch 114/200
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44/44 [=====] - 0s 7ms/step - loss: 0.0175 -  
SparseCatCrossentropy: 0.0171 - accuracy: 0.9949 - val_loss: 1.0598e-0  
5 - val_SparseCatCrossentropy: 1.0303e-05 - val_accuracy: 1.0000  
Epoch 115/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0435 -  
SparseCatCrossentropy: 0.0425 - accuracy: 0.9956 - val_loss: 2.1186e-0  
4 - val_SparseCatCrossentropy: 2.0601e-04 - val_accuracy: 1.0000  
Epoch 116/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0205 -  
SparseCatCrossentropy: 0.0200 - accuracy: 0.9935 - val_loss: 5.2909e-0  
4 - val_SparseCatCrossentropy: 5.1438e-04 - val_accuracy: 1.0000  
Epoch 117/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0119 -  
SparseCatCrossentropy: 0.0116 - accuracy: 0.9956 - val_loss: 8.1268e-0  
5 - val_SparseCatCrossentropy: 7.9040e-05 - val_accuracy: 1.0000  
Epoch 118/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0016 -  
SparseCatCrossentropy: 0.0015 - accuracy: 1.0000 - val_loss: 1.9915e-0  
4 - val_SparseCatCrossentropy: 1.9360e-04 - val_accuracy: 1.0000  
Epoch 119/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0111 -  
SparseCatCrossentropy: 0.0109 - accuracy: 0.9971 - val_loss: 2.0797e-0  
4 - val_SparseCatCrossentropy: 2.0221e-04 - val_accuracy: 1.0000  
Epoch 120/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0112 -  
SparseCatCrossentropy: 0.0109 - accuracy: 0.9964 - val_loss: 1.1183e-0  
5 - val_SparseCatCrossentropy: 1.0875e-05 - val_accuracy: 1.0000  
Epoch 121/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0109 -  
SparseCatCrossentropy: 0.0107 - accuracy: 0.9964 - val_loss: 3.6907e-0  
5 - val_SparseCatCrossentropy: 3.5884e-05 - val_accuracy: 1.0000  
Epoch 122/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0119 -  
SparseCatCrossentropy: 0.0117 - accuracy: 0.9971 - val_loss: 2.0194e-0  
4 - val_SparseCatCrossentropy: 1.9632e-04 - val_accuracy: 1.0000  
Epoch 123/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0071 -  
SparseCatCrossentropy: 0.0070 - accuracy: 0.9971 - val_loss: 8.4368e-0  
6 - val_SparseCatCrossentropy: 8.2035e-06 - val_accuracy: 1.0000  
Epoch 124/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0075 -  
SparseCatCrossentropy: 0.0073 - accuracy: 0.9978 - val_loss: 9.3013e-0  
6 - val_SparseCatCrossentropy: 9.0455e-06 - val_accuracy: 1.0000  
Epoch 125/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0181 -  
SparseCatCrossentropy: 0.0177 - accuracy: 0.9956 - val_loss: 1.8008e-0  
5 - val_SparseCatCrossentropy: 1.7519e-05 - val_accuracy: 1.0000  
Epoch 126/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0041 -  
SparseCatCrossentropy: 0.0040 - accuracy: 0.9978 - val_loss: 3.0792e-0  
5 - val_SparseCatCrossentropy: 2.9956e-05 - val_accuracy: 1.0000  
Epoch 127/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0044 -  
SparseCatCrossentropy: 0.0043 - accuracy: 0.9985 - val_loss: 9.1283e-0  
6 - val_SparseCatCrossentropy: 8.8926e-06 - val_accuracy: 1.0000  
Epoch 128/200
```



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44/44 [=====] - 0s 7ms/step - loss: 0.0087 -  
SparseCatCrossentropy: 0.0085 - accuracy: 0.9971 - val_loss: 5.1214e-0  
6 - val_SparseCatCrossentropy: 4.9822e-06 - val_accuracy: 1.0000  
Epoch 129/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0143 -  
SparseCatCrossentropy: 0.0139 - accuracy: 0.9978 - val_loss: 1.6892e-0  
5 - val_SparseCatCrossentropy: 1.6432e-05 - val_accuracy: 1.0000  
Epoch 130/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0105 -  
SparseCatCrossentropy: 0.0102 - accuracy: 0.9964 - val_loss: 8.0430e-0  
6 - val_SparseCatCrossentropy: 7.8197e-06 - val_accuracy: 1.0000  
Epoch 131/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0045 -  
SparseCatCrossentropy: 0.0044 - accuracy: 0.9978 - val_loss: 4.9687e-0  
6 - val_SparseCatCrossentropy: 4.8482e-06 - val_accuracy: 1.0000  
Epoch 132/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0089 -  
SparseCatCrossentropy: 0.0087 - accuracy: 0.9971 - val_loss: 5.7621e-0  
6 - val_SparseCatCrossentropy: 5.6117e-06 - val_accuracy: 1.0000  
Epoch 133/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0131 -  
SparseCatCrossentropy: 0.0128 - accuracy: 0.9964 - val_loss: 4.9310e-0  
6 - val_SparseCatCrossentropy: 4.7951e-06 - val_accuracy: 1.0000  
Epoch 134/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0072 -  
SparseCatCrossentropy: 0.0071 - accuracy: 0.9971 - val_loss: 3.1857e-0  
6 - val_SparseCatCrossentropy: 3.0977e-06 - val_accuracy: 1.0000  
Epoch 135/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0058 -  
SparseCatCrossentropy: 0.0057 - accuracy: 0.9985 - val_loss: 6.0280e-0  
6 - val_SparseCatCrossentropy: 5.8601e-06 - val_accuracy: 1.0000  
Epoch 136/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0124 -  
SparseCatCrossentropy: 0.0121 - accuracy: 0.9964 - val_loss: 2.1277e-0  
6 - val_SparseCatCrossentropy: 2.0684e-06 - val_accuracy: 1.0000  
Epoch 137/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0196 -  
SparseCatCrossentropy: 0.0192 - accuracy: 0.9971 - val_loss: 2.4114e-0  
6 - val_SparseCatCrossentropy: 2.3444e-06 - val_accuracy: 1.0000  
Epoch 138/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0131 -  
SparseCatCrossentropy: 0.0129 - accuracy: 0.9971 - val_loss: 5.3710e-0  
6 - val_SparseCatCrossentropy: 5.2228e-06 - val_accuracy: 1.0000  
Epoch 139/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0033 -  
SparseCatCrossentropy: 0.0033 - accuracy: 0.9985 - val_loss: 9.3615e-0  
6 - val_SparseCatCrossentropy: 9.1009e-06 - val_accuracy: 1.0000  
Epoch 140/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0062 -  
SparseCatCrossentropy: 0.0060 - accuracy: 0.9985 - val_loss: 1.8570e-0  
5 - val_SparseCatCrossentropy: 1.8053e-05 - val_accuracy: 1.0000  
Epoch 141/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0126 -  
SparseCatCrossentropy: 0.0123 - accuracy: 0.9971 - val_loss: 3.8701e-0  
4 - val_SparseCatCrossentropy: 3.7620e-04 - val_accuracy: 1.0000  
Epoch 142/200
```

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44/44 [=====] - 0s 7ms/step - loss: 0.0067 -  
SparseCatCrossentropy: 0.0065 - accuracy: 0.9985 - val_loss: 7.3410e-0  
5 - val_SparseCatCrossentropy: 7.1365e-05 - val_accuracy: 1.0000  
Epoch 143/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0091 -  
SparseCatCrossentropy: 0.0089 - accuracy: 0.9971 - val_loss: 3.7300e-0  
6 - val_SparseCatCrossentropy: 3.6262e-06 - val_accuracy: 1.0000  
Epoch 144/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0100 -  
SparseCatCrossentropy: 0.0098 - accuracy: 0.9971 - val_loss: 4.6542e-0  
6 - val_SparseCatCrossentropy: 4.5263e-06 - val_accuracy: 1.0000  
Epoch 145/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0200 -  
SparseCatCrossentropy: 0.0196 - accuracy: 0.9956 - val_loss: 6.2278e-0  
6 - val_SparseCatCrossentropy: 6.0550e-06 - val_accuracy: 1.0000  
Epoch 146/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0108 -  
SparseCatCrossentropy: 0.0106 - accuracy: 0.9971 - val_loss: 1.6230e-0  
5 - val_SparseCatCrossentropy: 1.5778e-05 - val_accuracy: 1.0000  
Epoch 147/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0052 -  
SparseCatCrossentropy: 0.0050 - accuracy: 0.9993 - val_loss: 2.3341e-0  
4 - val_SparseCatCrossentropy: 2.2689e-04 - val_accuracy: 1.0000  
Epoch 148/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0232 -  
SparseCatCrossentropy: 0.0227 - accuracy: 0.9935 - val_loss: 5.8760e-0  
6 - val_SparseCatCrossentropy: 5.7184e-06 - val_accuracy: 1.0000  
Epoch 149/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0165 -  
SparseCatCrossentropy: 0.0161 - accuracy: 0.9971 - val_loss: 3.9228e-0  
6 - val_SparseCatCrossentropy: 3.8178e-06 - val_accuracy: 1.0000  
Epoch 150/200  
44/44 [=====] - 0s 6ms/step - loss: 0.0130 -  
SparseCatCrossentropy: 0.0127 - accuracy: 0.9956 - val_loss: 4.2908e-0  
6 - val_SparseCatCrossentropy: 4.1735e-06 - val_accuracy: 1.0000  
Epoch 151/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0116 -  
SparseCatCrossentropy: 0.0113 - accuracy: 0.9971 - val_loss: 9.3801e-0  
6 - val_SparseCatCrossentropy: 9.1267e-06 - val_accuracy: 1.0000  
44/44 [=====] - 0s 7ms/step - loss: 0.0276 -  
SparseCatCrossentropy: 0.0270 - accuracy: 0.9949 - val_loss: 2.8633e-0  
5 - val_SparseCatCrossentropy: 2.7839e-05 - val_accuracy: 1.0000  
Epoch 153/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0084 -  
SparseCatCrossentropy: 0.0082 - accuracy: 0.9971 - val_loss: 4.4414e-0  
5 - val_SparseCatCrossentropy: 4.3175e-05 - val_accuracy: 1.0000  
Epoch 154/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0206 -  
SparseCatCrossentropy: 0.0202 - accuracy: 0.9942 - val_loss: 1.7203e-0  
4 - val_SparseCatCrossentropy: 1.6722e-04 - val_accuracy: 1.0000  
Epoch 155/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0087 -  
SparseCatCrossentropy: 0.0085 - accuracy: 0.9985 - val_loss: 4.7008e-0  
5 - val_SparseCatCrossentropy: 4.5695e-05 - val_accuracy: 1.0000  
Epoch 156/200  
44/44 [=====] - 0s 7ms/step - loss: 0.0077 -
```

SparseCatCrossentropy: 0.0075 - accuracy: 0.9956 - val_loss: 6.6665e-06 - val_SparseCatCrossentropy: 6.4807e-06 - val_accuracy: 1.0000
Epoch 157/200
44/44 [=====] - 0s 6ms/step - loss: 0.0256 - SparseCatCrossentropy: 0.0250 - accuracy: 0.9964 - val_loss: 4.2852e-06 - val_SparseCatCrossentropy: 4.1658e-06 - val_accuracy: 1.0000
Epoch 158/200
44/44 [=====] - 0s 7ms/step - loss: 0.0113 - SparseCatCrossentropy: 0.0110 - accuracy: 0.9949 - val_loss: 2.4410e-05 - val_SparseCatCrossentropy: 2.3728e-05 - val_accuracy: 1.0000
Epoch 159/200
44/44 [=====] - 0s 6ms/step - loss: 0.0115 - SparseCatCrossentropy: 0.0112 - accuracy: 0.9971 - val_loss: 1.2828e-04 - val_SparseCatCrossentropy: 1.2470e-04 - val_accuracy: 1.0000
Epoch 160/200
44/44 [=====] - 0s 6ms/step - loss: 0.0233 - SparseCatCrossentropy: 0.0228 - accuracy: 0.9935 - val_loss: 0.0011 - val_SparseCatCrossentropy: 0.0011 - val_accuracy: 1.0000
Epoch 161/200
44/44 [=====] - 0s 6ms/step - loss: 0.0129 - SparseCatCrossentropy: 0.0126 - accuracy: 0.9942 - val_loss: 4.4762e-06 - val_SparseCatCrossentropy: 4.3510e-06 - val_accuracy: 1.0000
Epoch 162/200
44/44 [=====] - 0s 6ms/step - loss: 0.0146 - SparseCatCrossentropy: 0.0143 - accuracy: 0.9964 - val_loss: 9.5743e-05 - val_SparseCatCrossentropy: 9.3066e-05 - val_accuracy: 1.0000
Epoch 163/200
44/44 [=====] - 0s 6ms/step - loss: 0.0063 - SparseCatCrossentropy: 0.0062 - accuracy: 0.9985 - val_loss: 1.2002e-05 - val_SparseCatCrossentropy: 1.1667e-05 - val_accuracy: 1.0000
Epoch 164/200
44/44 [=====] - 0s 7ms/step - loss: 0.0186 - SparseCatCrossentropy: 0.0182 - accuracy: 0.9971 - val_loss: 5.0259e-06 - val_SparseCatCrossentropy: 4.8854e-06 - val_accuracy: 1.0000
Epoch 165/200
44/44 [=====] - 0s 7ms/step - loss: 0.0073 - SparseCatCrossentropy: 0.0072 - accuracy: 0.9971 - val_loss: 1.2902e-05 - val_SparseCatCrossentropy: 1.2541e-05 - val_accuracy: 1.0000
Epoch 166/200
44/44 [=====] - 0s 7ms/step - loss: 0.0130 - SparseCatCrossentropy: 0.0127 - accuracy: 0.9949 - val_loss: 7.1959e-04 - val_SparseCatCrossentropy: 6.9966e-04 - val_accuracy: 1.0000
Epoch 167/200
44/44 [=====] - 0s 7ms/step - loss: 0.0267 - SparseCatCrossentropy: 0.0261 - accuracy: 0.9913 - val_loss: 0.0013 - val_SparseCatCrossentropy: 0.0012 - val_accuracy: 1.0000
Epoch 168/200
44/44 [=====] - 0s 7ms/step - loss: 0.0161 - SparseCatCrossentropy: 0.0157 - accuracy: 0.9935 - val_loss: 1.3444e-05 - val_SparseCatCrossentropy: 1.3068e-05 - val_accuracy: 1.0000
Epoch 169/200
44/44 [=====] - 0s 7ms/step - loss: 0.0066 - SparseCatCrossentropy: 0.0065 - accuracy: 0.9985 - val_loss: 3.7001e-05 - val_SparseCatCrossentropy: 3.5967e-05 - val_accuracy: 1.0000
Epoch 170/200
44/44 [=====] - 0s 7ms/step - loss: 0.0261 -

SparseCatCrossentropy: 0.0257 - accuracy: 0.9942 - val_loss: 1.9539e-04 - val_SparseCatCrossentropy: 1.8993e-04 - val_accuracy: 1.0000
Epoch 171/200
44/44 [=====] - 0s 6ms/step - loss: 0.0079 - SparseCatCrossentropy: 0.0077 - accuracy: 0.9964 - val_loss: 2.5729e-05 - val_SparseCatCrossentropy: 2.5010e-05 - val_accuracy: 1.0000
Epoch 172/200
44/44 [=====] - 0s 7ms/step - loss: 0.0190 - SparseCatCrossentropy: 0.0186 - accuracy: 0.9964 - val_loss: 2.3541e-04 - val_SparseCatCrossentropy: 2.2883e-04 - val_accuracy: 1.0000
Epoch 173/200
44/44 [=====] - 0s 6ms/step - loss: 0.0096 - SparseCatCrossentropy: 0.0094 - accuracy: 0.9956 - val_loss: 2.9758e-06 - val_SparseCatCrossentropy: 2.8926e-06 - val_accuracy: 1.0000
Epoch 174/200
44/44 [=====] - 0s 7ms/step - loss: 0.0068 - SparseCatCrossentropy: 0.0067 - accuracy: 0.9971 - val_loss: 2.1307e-06 - val_SparseCatCrossentropy: 2.0711e-06 - val_accuracy: 1.0000
Epoch 175/200
44/44 [=====] - 0s 7ms/step - loss: 0.0076 - SparseCatCrossentropy: 0.0074 - accuracy: 0.9971 - val_loss: 1.8635e-06 - val_SparseCatCrossentropy: 1.8114e-06 - val_accuracy: 1.0000
Epoch 176/200
44/44 [=====] - 0s 7ms/step - loss: 0.0127 - SparseCatCrossentropy: 0.0124 - accuracy: 0.9971 - val_loss: 2.8075e-06 - val_SparseCatCrossentropy: 2.7290e-06 - val_accuracy: 1.0000
Epoch 177/200
44/44 [=====] - 0s 7ms/step - loss: 0.0150 - SparseCatCrossentropy: 0.0147 - accuracy: 0.9971 - val_loss: 1.1073e-05 - val_SparseCatCrossentropy: 1.0764e-05 - val_accuracy: 1.0000
Epoch 178/200
44/44 [=====] - 0s 6ms/step - loss: 0.0168 - SparseCatCrossentropy: 0.0165 - accuracy: 0.9964 - val_loss: 0.0027 - val_SparseCatCrossentropy: 0.0027 - val_accuracy: 0.9983
Epoch 179/200
44/44 [=====] - 0s 7ms/step - loss: 0.0088 - SparseCatCrossentropy: 0.0086 - accuracy: 0.9971 - val_loss: 0.0152 - val_SparseCatCrossentropy: 0.0147 - val_accuracy: 0.9949
Epoch 180/200
44/44 [=====] - 0s 7ms/step - loss: 0.0073 - SparseCatCrossentropy: 0.0071 - accuracy: 0.9971 - val_loss: 2.8230e-06 - val_SparseCatCrossentropy: 2.7441e-06 - val_accuracy: 1.0000
Epoch 181/200
44/44 [=====] - 0s 7ms/step - loss: 0.0139 - SparseCatCrossentropy: 0.0136 - accuracy: 0.9956 - val_loss: 2.6307e-06 - val_SparseCatCrossentropy: 2.5571e-06 - val_accuracy: 1.0000
Epoch 182/200
44/44 [=====] - 0s 7ms/step - loss: 0.0173 - SparseCatCrossentropy: 0.0169 - accuracy: 0.9964 - val_loss: 4.3489e-06 - val_SparseCatCrossentropy: 4.2273e-06 - val_accuracy: 1.0000
Epoch 183/200
44/44 [=====] - 0s 7ms/step - loss: 0.0105 - SparseCatCrossentropy: 0.0103 - accuracy: 0.9978 - val_loss: 1.9514e-05 - val_SparseCatCrossentropy: 1.8968e-05 - val_accuracy: 1.0000
Epoch 184/200
44/44 [=====] - 0s 7ms/step - loss: 0.0067 -

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SparseCatCrossentropy: 0.0066 - accuracy: 0.9964 - val_loss: 4.7264e-0
6 - val_SparseCatCrossentropy: 4.5943e-06 - val_accuracy: 1.0000
Epoch 185/200
44/44 [=====] - 0s 6ms/step - loss: 0.0059 -
SparseCatCrossentropy: 0.0057 - accuracy: 0.9978 - val_loss: 3.4760e-0
6 - val_SparseCatCrossentropy: 3.3788e-06 - val_accuracy: 1.0000
Epoch 186/200
44/44 [=====] - 0s 7ms/step - loss: 0.0391 -
SparseCatCrossentropy: 0.0382 - accuracy: 0.9891 - val_loss: 2.3416e-0
4 - val_SparseCatCrossentropy: 2.2762e-04 - val_accuracy: 1.0000
Epoch 187/200
44/44 [=====] - 0s 6ms/step - loss: 0.0137 -
SparseCatCrossentropy: 0.0134 - accuracy: 0.9964 - val_loss: 1.2486e-0
5 - val_SparseCatCrossentropy: 1.2137e-05 - val_accuracy: 1.0000
Epoch 188/200
44/44 [=====] - 0s 7ms/step - loss: 0.0092 -
SparseCatCrossentropy: 0.0105 - accuracy: 0.9985 - val_loss: 4.0201e-0
5 - val_SparseCatCrossentropy: 3.9077e-05 - val_accuracy: 1.0000
Epoch 189/200
44/44 [=====] - 0s 7ms/step - loss: 0.0210 -
SparseCatCrossentropy: 0.0205 - accuracy: 0.9949 - val_loss: 1.0923e-0
Epoch 190/200
44/44 [=====] - 0s 6ms/step - loss: 0.0112 -
SparseCatCrossentropy: 0.0110 - accuracy: 0.9978 - val_loss: 1.0344e-0
5 - val_SparseCatCrossentropy: 1.0055e-05 - val_accuracy: 1.0000
Epoch 191/200
44/44 [=====] - 0s 7ms/step - loss: 0.0474 -
SparseCatCrossentropy: 0.0463 - accuracy: 0.9906 - val_loss: 1.8850e-0
4 - val_SparseCatCrossentropy: 1.8323e-04 - val_accuracy: 1.0000
Epoch 192/200
44/44 [=====] - 0s 6ms/step - loss: 0.0405 -
SparseCatCrossentropy: 0.0396 - accuracy: 0.9891 - val_loss: 3.6662e-0
5 - val_SparseCatCrossentropy: 3.5637e-05 - val_accuracy: 1.0000
Epoch 193/200
44/44 [=====] - 0s 6ms/step - loss: 0.0073 -
SparseCatCrossentropy: 0.0071 - accuracy: 0.9971 - val_loss: 4.6879e-0
6 - val_SparseCatCrossentropy: 4.5568e-06 - val_accuracy: 1.0000
Epoch 194/200
44/44 [=====] - 0s 7ms/step - loss: 0.0122 -
SparseCatCrossentropy: 0.0119 - accuracy: 0.9956 - val_loss: 3.5762e-0
6 - val_SparseCatCrossentropy: 3.4762e-06 - val_accuracy: 1.0000
Epoch 195/200
44/44 [=====] - 0s 7ms/step - loss: 0.0191 -
SparseCatCrossentropy: 0.0187 - accuracy: 0.9949 - val_loss: 9.9199e-0
6 - val_SparseCatCrossentropy: 9.6425e-06 - val_accuracy: 1.0000
Epoch 196/200
44/44 [=====] - 0s 7ms/step - loss: 0.0238 -
SparseCatCrossentropy: 0.0233 - accuracy: 0.9956 - val_loss: 3.3333e-0
5 - val_SparseCatCrossentropy: 3.2402e-05 - val_accuracy: 1.0000
Epoch 197/200
44/44 [=====] - 0s 7ms/step - loss: 0.0267 -
SparseCatCrossentropy: 0.0263 - accuracy: 0.9949 - val_loss: 6.2759e-0
6 - val_SparseCatCrossentropy: 6.1007e-06 - val_accuracy: 1.0000
Epoch 198/200
44/44 [=====] - 0s 7ms/step - loss: 0.0579 -
SparseCatCrossentropy: 0.0566 - accuracy: 0.9855 - val_loss: 0.0058 -
```

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val_SparseCatCrossentropy: 0.0056 - val_accuracy: 0.9966
Epoch 199/200
44/44 [=====] - 0s 6ms/step - loss: 0.0280 -
SparseCatCrossentropy: 0.0274 - accuracy: 0.9920 - val_loss: 9.3566e-0
5 - val_SparseCatCrossentropy: 9.0950e-05 - val_accuracy: 1.0000
Epoch 200/200
44/44 [=====] - 0s 6ms/step - loss: 0.0145 -
SparseCatCrossentropy: 0.0142 - accuracy: 0.9949 - val_loss: 6.8940e-0
4 - val_SparseCatCrossentropy: 6.7012e-04 - val_accuracy: 1.0000
Best epoch: 4

```

notebook ends

```

In [ ]: def voc_net():

    model = models.Sequential()

    # C1 Convolutional Layer
    model.add(layers.Conv1D(filters = 3 , kernel_size=3, activation='re

    # S2 Subsampling Layer
    model.add(layers.AveragePooling1D(pool_size = 2, strides = 2, paddi

    # C3 Convolutional Layer
    model.add(layers.Conv1D(filters = 3 , kernel_size=3, activation='re

    # Flatten the CNN output to feed it with fully connected layers
    model.add(layers.Flatten())

    model.add(layers.Dense(48, activation='relu'))
    model.add(layers.Dropout(0.5))
    model.add(layers.Dense(12)) # number of dense layer would be equal

    model.compile(optimizer=tf.keras.optimizers.Adam(learning_rate=0.01
                  loss=tf.keras.losses.SparseCategoricalCrossentropy(from_log
                      metrics=[
                          tf.keras.losses.SparseCategoricalCrossentropy(
                              from_logits=True, name='SparseCatCrossentropy'),
                          'accuracy'])

    model.summary()

    return model

```

In []: