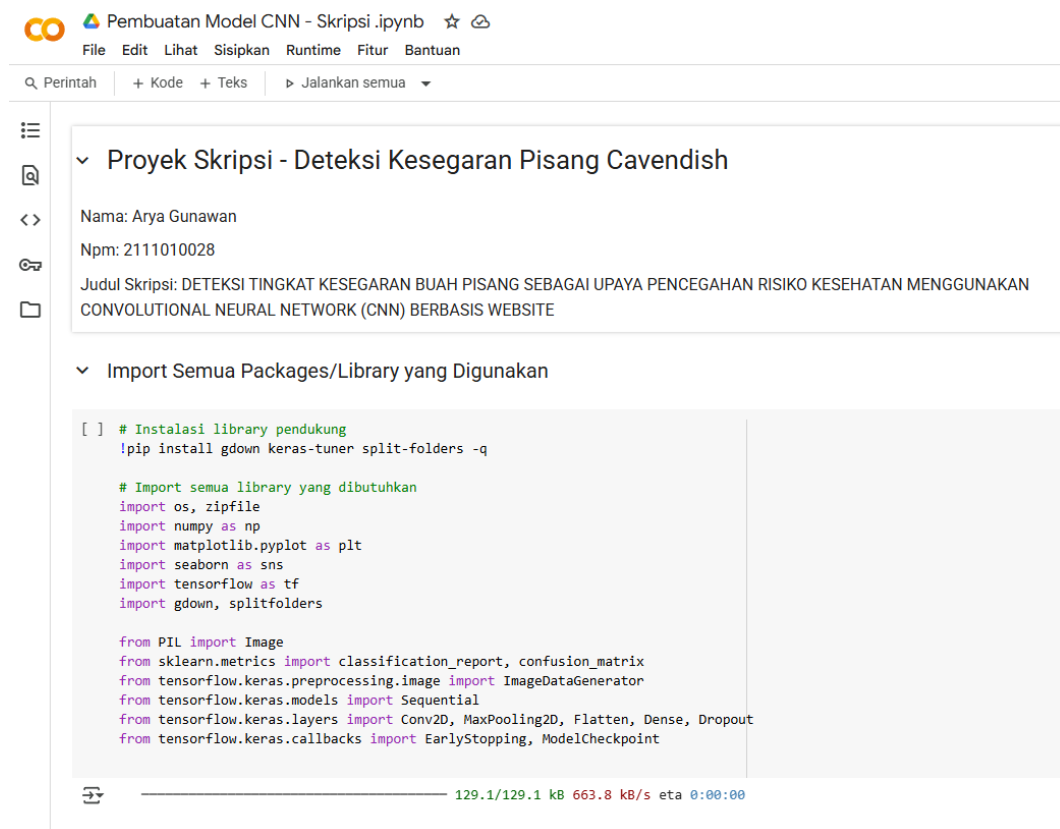


LAMPIRAN

Lampiran 1

Kode Python Membuat Model CNN



The screenshot shows a Jupyter Notebook interface. The title bar reads "Pembuatan Model CNN - Skripsi .ipynb". Below the title bar is a menu bar with "File", "Edit", "Lihat", "Sisipkan", "Runtime", "Fitur", and "Bantuan". A toolbar below the menu bar includes "Perintah", "+ Kode", "+ Teks", and "▶ Jalankan semua". The left sidebar contains icons for a menu, search, expand/collapse, search, and file explorer. The main content area has two sections:

- ▼ Proyek Skripsi - Deteksi Kesegaran Pisang Cavendish**
 - Nama: Arya Gunawan
 - Npm: 2111010028
 - Judul Skripsi: DETEKSI TINGKAT KESEGERAN BUAH PISANG SEBAGAI UPAYA PENCEGAHAN RISIKO KESEHATAN MENGGUNAKAN CONVOLUTIONAL NEURAL NETWORK (CNN) BERBASIS WEBSITE
- ▼ Import Semua Packages/Library yang Digunakan**

The code cell under the second section contains the following Python code:

```
[ ] # Instalasi library pendukung
!pip install gdown keras-tuner split-folders -q

# Import semua library yang dibutuhkan
import os, zipfile
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
import tensorflow as tf
import gdown, splitfolders

from PIL import Image
from sklearn.metrics import classification_report, confusion_matrix
from tensorflow.keras.preprocessing.image import ImageDataGenerator
from tensorflow.keras.models import Sequential
from tensorflow.keras.layers import Conv2D, MaxPooling2D, Flatten, Dense, Dropout
from tensorflow.keras.callbacks import EarlyStopping, ModelCheckpoint
```

At the bottom of the code cell, a progress bar shows "129.1/129.1 kB 663.8 kB/s eta 0:00:00".

▼ Data Preparation

Data Loading

Download dan Ekstraksi Dataset

```
# Unduh dataset dari Google Drive
file_id = "1WoBmbnmIDfz0svVB1g8VZ2GUYGZ8Gxlg"
output_file = "Dataset_Pisang_Cavendish.zip"
gdown.download(f"https://drive.google.com/uc?id={file_id}", output_file, quiet=False)

# Ekstrak file zip
with zipfile.ZipFile(output_file, 'r') as zip_ref:
    zip_ref.extractall("Dataset_Pisang")

Downloading...
From (original): https://drive.google.com/uc?id=1WoBmbnmIDfz0svVB1g8VZ2GUYGZ8Gxlg
From (redirected): https://drive.google.com/uc?id=1WoBmbnmIDfz0svVB1g8VZ2GUYGZ8Gxlg&confirm=t&uiid=cee36158-a8d8-4de8-bd6a-0378b49548b7
To: /content/Dataset_Pisang_Cavendish.zip
100%|██████████| 336M/336M [00:04<00:00, 75.5MB/s]
```

Cek Jumlah Gambar per Kelas

```
[ ] dataset_path = "Dataset_Pisang/Dataset_Pisang_Cavendish"
for class_name in os.listdir(dataset_path):
    class_path = os.path.join(dataset_path, class_name)
    print(f"{class_name}: {len(os.listdir(class_path))} images")
```

```
matang: 249 images
segar: 264 images
busuk: 261 images
mentah: 256 images
```

segar: 264 images

Sample Gambar Dataset

```
import os
import matplotlib.pyplot as plt
import gdown, zipfile, random

# --- Visualisasi 4 gambar acak per kelas ---
for class_name in os.listdir(dataset_path):
    class_path = os.path.join(dataset_path, class_name)
    sample_imgs = random.sample(os.listdir(class_path), 4) # ambil 4 gambar acak

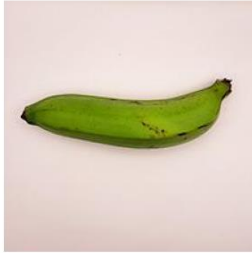
    fig, axes = plt.subplots(1, 4, figsize=(12, 4))
    fig.suptitle(f"Contoh Dataset - {class_name}", fontsize=14)

    for idx, img_file in enumerate(sample_imgs):
        img_path = os.path.join(class_path, img_file)
        img = plt.imread(img_path)
        axes[idx].imshow(img)
        axes[idx].set_title(f"{class_name} {idx+1}")
        axes[idx].axis("off")

    plt.tight_layout()
    plt.show()
```

Contoh Dataset - mentah

mentah 1



mentah 2



mentah 3



mentah 4



Contoh Dataset - busuk

busuk 1



busuk 2



busuk 3

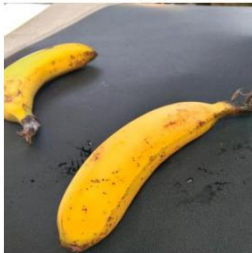


busuk 4

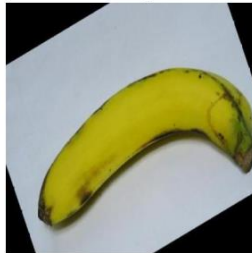


Contoh Dataset - matang

matang 1



matang 2



matang 3



matang 4



Contoh Dataset - segar

segar 1



segar 2



segar 3



segar 4



☰ ▼ Pra-Pemrosesan Data (Preprocessing)



```
[ ] # Parameter dasar gambar
img_height, img_width = 150, 150
batch_size = 32

# Inisialisasi ImageDataGenerator dengan normalisasi piksel
datagen = ImageDataGenerator(rescale=1./255)
```

Split Data

```
[ ] # Membagi dataset menjadi train (70%), val (15%), dan test (15%)
splitfolders.ratio("Dataset_Pisang/Dataset Pisang Cavendish", output="dataset_split",
                  seed=42, ratio=(.7, .15, .15), move=True)

# Load dataset ke dalam generator
train_data = datagen.flow_from_directory(
    "dataset_split/train", target_size=(img_height, img_width),
    batch_size=batch_size, class_mode='categorical', shuffle=True
)

val_data = datagen.flow_from_directory(
    "dataset_split/val", target_size=(img_height, img_width),
    batch_size=batch_size, class_mode='categorical', shuffle=True
)

test_data = datagen.flow_from_directory(
    "dataset_split/test", target_size=(img_height, img_width),
    batch_size=batch_size, class_mode='categorical', shuffle=False
)
```

🔄 Copying files: 1030 files [00:00, 20959.82 files/s] Found 719 images belonging to 4 classes.
Found 153 images belonging to 4 classes.
Found 158 images belonging to 4 classes.



▼ Perancangan CNN

```
[ ] # Arsitektur CNN
model = Sequential([
    Conv2D(32, (3, 3), activation='relu', input_shape=(img_height, img_width, 3)),
    MaxPooling2D(2, 2),
    Conv2D(64, (3, 3), activation='relu'),
    MaxPooling2D(2, 2),
    Conv2D(128, (3, 3), activation='relu'),
    MaxPooling2D(2, 2),
    Flatten(),
    Dense(128, activation='relu'),
    Dropout(0.5),
    Dense(train_data.num_classes, activation='softmax')
])
```

🔗 /usr/local/lib/python3.11/dist-packages/keras/src/layers/convolutional/base_conv.py:107: UserWarning: super().__init__(activity_regularizer=activity_regularizer, **kwargs)

▼ Pelatihan dan Validasi Model CNN

```
[ ] # Compile Model
model.compile(optimizer='adam', loss='categorical_crossentropy', metrics=['accuracy'])

# Konfigurasi callback
callbacks = [
    EarlyStopping(patience=5, restore_best_weights=True),
    ModelCheckpoint("best_model.h5", save_best_only=True)
]

# Train model
history = model.fit(
    train_data,
    validation_data=val_data,
    epochs=30,
    callbacks=callbacks
)
```


 Evaluasi Model

```
[ ] # Evaluasi akurasi pada test set
test_loss, test_acc = model.evaluate(test_data)
print(f"Test Accuracy: {test_acc*100:.2f}%")
```

5/5 ----- 5s 1s/step - accuracy: 0.9945 - loss: 0.0176
Test Accuracy: 98.73%

```
# Prediksi dan evaluasi lanjutan
y_pred = model.predict(test_data)
y_pred_classes = np.argmax(y_pred, axis=1)
y_true = test_data.classes

# Confusion Matrix
conf_matrix = confusion_matrix(y_true, y_pred_classes)
plt.figure(figsize=(6,6))
sns.heatmap(conf_matrix, annot=True, fmt="d",
             xticklabels=test_data.class_indices,
             yticklabels=test_data.class_indices, cmap="Blues")

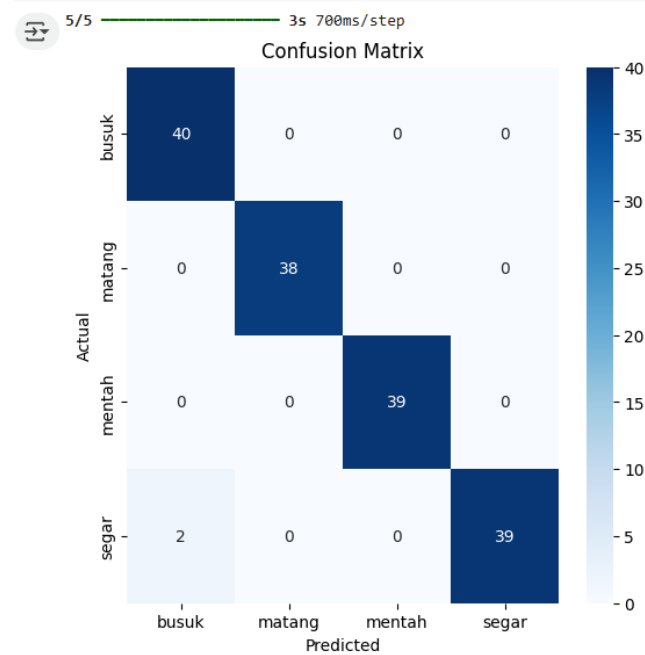
plt.xlabel("Predicted")
plt.ylabel("Actual")
plt.title("Confusion Matrix")
plt.show()

# Classification Report
print(classification_report(y_true, y_pred_classes, target_names=list(test_data.class_indices.keys())))
```

5/5 3s 700ms/step

Confusion Matrix

🔍 Perintah + Kode + Teks ▶ Jalankan semua ▼



	precision	recall	f1-score	support
busuk	0.95	1.00	0.98	40
matang	1.00	1.00	1.00	38
mentah	1.00	1.00	1.00	39
segar	1.00	0.95	0.97	41
accuracy			0.99	158
macro avg	0.99	0.99	0.99	158
weighted avg	0.99	0.99	0.99	158

Simpan Model

```
[ ] model.save("model_pisang.h5")
```

WARNING:absl:You are saving your model as an HDF5 file via `model.save()` or `keras.saving.save\_model(model)`. This fi

Visualisasi Akurasi

```
[ ] # Visualisasi kurva akurasi pelatihan dan validasi
plt.plot(history.history['accuracy'], label='Train Accuracy')
plt.plot(history.history['val_accuracy'], label='Validation Accuracy')
plt.legend()
plt.title('Training vs Validation Accuracy')
plt.xlabel('Epoch')
plt.ylabel('Accuracy')
plt.show()
```

Training vs Validation Accuracy

Epoch	Train Accuracy	Validation Accuracy
0	0.40	0.75
1	0.65	0.85
2	0.75	0.78
3	0.85	0.95
4	0.92	0.98
5	0.95	0.98
6	0.96	0.95
7	0.96	0.92
8	0.97	0.95
9	0.98	0.98
10	0.98	0.95
11	0.99	0.98
12	0.99	1.00
13	0.99	1.00
14	0.99	1.00
15	0.99	1.00
16	0.99	1.00
17	0.99	1.00
18	0.99	1.00
19	0.99	1.00
20	0.99	1.00
21	0.99	1.00
22	0.99	0.98
23	0.99	0.99
24	1.00	1.00
25	1.00	1.00

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Lampiran 2

Implementasi Website

