Proyek Klasifikasi Gambar: CATS and DOGS

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Import Semua Packages/Library yang Digunakan

```
# Install TensorFlow
!pip install tensorflow
!pip install tensorflow-text
# Install package lain yang diperlukan
!pip install opencv-python
!pip install matplotlib
!pip install pandas
!pip install numpy
!pip install scikit-learn
!pip install tensorflowjs
# Install kaggle package untuk mengunduh dataset
!pip install kaggle
# Import library
import os
import cv2
import shutil
import seaborn as sns
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
from pathlib import Path
import tensorflow as tf
from tensorflow.keras import layers, models
import tensorflowjs as tfjs
from sklearn.model_selection import train_test_split
# Check TensorFlow version
print("TensorFlow Version:", tf.__version__)
# Check if GPU is available
print("GPU Available:", tf.test.is_gpu_available())
```

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Requirement already satisfied: tensorflow in /usr/local/lib/python3.11/dist-packages (2.18.0)
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▲ Try YDF, the successor of TensorFlow Decision Forests using the same algorithms but with more features and faster training!
```

```
Old code
import tensorflow_decision_forests as tfdf

tf_ds = tfdf.keras.pd_dataframe_to_tf_dataset(ds, label="1")
model = tfdf.keras.RandomForestModel(label="1")
model.fit(tf_ds)

New code
import ydf

model = ydf.RandomForestLearner(label="1").train(ds)
```

(Learn more in the migration guide)

WARNING:tensorflow:From <ipython-input-1-3890cf556073>:35: is_gpu_available (from tensorflow.python.framework.test_util) is deprecat Instructions for updating:

Use `tf.config.list_physical_devices('GPU')` instead.

TensorFlow Version: 2.18.0

GPU Available: True

Data Preparation

Data Loading

```
# Setup Kaggle API (Anda perlu mengunggah kaggle.json)
from google.colab import files
files.upload() # Unggah file kaggle.json Anda
!mkdir -p ~/.kaggle
!cp kaggle.json ~/.kaggle/
!chmod 600 ~/.kaggle/kaggle.json
# Unduh dataset dari Kaggle
!kaggle datasets download -d shaunthesheep/microsoft-catsvsdogs-dataset
!unzip -q microsoft-catsvsdogs-dataset.zip -d dataset
# Definisikan path dataset
data_dir = '/content/dataset/PetImages'
categories = ['Cat', 'Dog']
Choose Files kaggle.json
      • kaggle.json(application/json) - 65 bytes, last modified: 4/2/2025 - 100% done
     Saving kaggle.json to kaggle.json
     Dataset URL: <a href="https://www.kaggle.com/datasets/shaunthesheep/microsoft-catsvsdogs-dataset">https://www.kaggle.com/datasets/shaunthesheep/microsoft-catsvsdogs-dataset</a>
     License(s): other
```

→ Data Preprocessing

```
# Fungsi untuk membuat daftar path gambar dan label
def create_image_dataframe(data_dir, categories):
   image_paths = []
    labels = []
    for category in categories:
        path = os.path.join(data_dir, category)
        class_num = categories.index(category) # 0 untuk Cat, 1 untuk Dog
        for img_name in os.listdir(path):
           img_path = os.path.join(path, img_name)
            # Validasi apakah file adalah gambar
            if img_name.lower().endswith(('.png', '.jpg', '.jpeg')):
                image_paths.append(img_path)
               labels.append(class_num)
            else:
                print(f"Skipped non-image file: {img_name}")
    # Buat DataFrame
    df = pd.DataFrame({
        'image_path': image_paths,
        'label': labels
    df['label_name'] = df['label'].map({0: 'Cat', 1: 'Dog'})
    return df
# Buat DataFrame
df = create_image_dataframe(data_dir, categories)
   Skipped non-image file: Thumbs.db
     Skipped non-image file: Thumbs.db
```

Daftar Nama Kelas

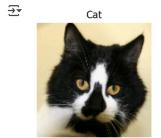
```
# Daftar nama kelas
class_names = categories
print("Class Names:", class_names)
print("Total Images:", len(df))
print("DataFrame Head:")
print(df.head())
print("Label Distribution:")
print(df['label_name'].value_counts())
→ Class Names: ['Cat', 'Dog']
     Total Images: 25000
     DataFrame Head:
```

image_path label_name

```
0 /content/dataset/PetImages/Cat/2860.jpg
1 /content/dataset/PetImages/Cat/5304.jpg
                                               0
                                                        Cat
2 /content/dataset/PetImages/Cat/4699.jpg
                                               0
                                                        Cat
 /content/dataset/PetImages/Cat/6642.jpg
                                                        Cat
   /content/dataset/PetImages/Cat/217.jpg
Label Distribution:
label name
      12500
Cat
      12500
Dog
Name: count, dtype: int64
```

Plot Sampel Gambar

```
# Fungsi untuk memuat dan menampilkan sampel gambar
def plot_sample_images(df, class_names, num_samples=5, img_size=128):
    plt.figure(figsize=(15, 5))
    sample_df = df.sample(num_samples)
    for i, row in enumerate(sample_df.itertuples()):
       img = cv2.imread(row.image_path)
        if img is None:
           continue
        img = cv2.cvtColor(img, cv2.COLOR_BGR2RGB)
        img = cv2.resize(img, (img_size, img_size))
        plt.subplot(1, num_samples, i+1)
        plt.imshow(img)
       plt.title(class_names[row.label])
       plt.axis('off')
    plt.show()
# Tampilkan sampel gambar
plot_sample_images(df, class_names)
```







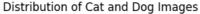


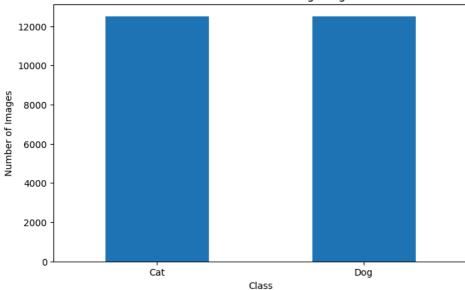


```
# Building Distribution Data
print("\n#Building Distribution Data")
label_counts = df['label_name'].value_counts()
print("Label Distribution:")
print(label_counts)

# Visualisasi distribusi data
plt.figure(figsize=(8, 5))
label_counts.plot(kind='bar')
plt.title('Distribution of Cat and Dog Images')
plt.xlabel('Class')
plt.ylabel('Number of Images')
plt.xticks(rotation=0)
plt.show()
```

#Building Distribution Data Label Distribution: label_name Cat 12500 Dog 12500 Name: count, dtype: int64





Split Dataset

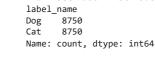
Dataset Dibagi Menjadi Train Set, Test Set dan Validation Set

```
# Import library yang diperlukan
from sklearn.model_selection import train_test_split
# Split dataset menjadi train, validation, dan test set
def split_dataset(df, train_size=0.7, val_size=0.15, test_size=0.15):
    # Pastikan proporsi total = 1
    assert train_size + val_size + test_size == 1, "Proporsi split harus berjumlah 1"
    # Split train dan temp (val + test)
    df_train, df_temp = train_test_split(
       df,
        train_size=train_size,
        stratify=df['label'],
        random_state=42
    )
    # Split temp menjadi validation dan test
    val_relative_size = val_size / (val_size + test_size)
    df_val, df_test = train_test_split(
        df_temp,
        train size=val relative size,
        stratify=df_temp['label'],
        random_state=42
    )
    return df_train, df_val, df_test
# Lakukan splitting
df_train, df_val, df_test = split_dataset(df)
# Tampilkan informasi hasil split
print("Train Set Size:", len(df_train))
print("Validation Set Size:", len(df_val))
print("Test Set Size:", len(df_test))
```

Train Set Size: 17500
Validation Set Size: 3750
Test Set Size: 3750

Count data image

```
# Tampilkan distribusi kelas di setiap set
print("\nTrain Set Label Distribution:")
print(df_train['label_name'].value_counts())
print("\nValidation Set Label Distribution:")
print(df_val['label_name'].value_counts())
print("\nTest Set Label Distribution:")
print(df_test['label_name'].value_counts())
# Visualisasi distribusi kelas
import matplotlib.pyplot as plt
def plot_split_distribution(df_train, df_val, df_test):
    plt.figure(figsize=(12, 4))
   # Train set
    plt.subplot(1, 3, 1)
    df_train['label_name'].value_counts().plot(kind='bar')
   plt.title('Train Set Distribution')
   plt.xlabel('Class')
   plt.ylabel('Count')
   plt.xticks(rotation=0)
   # Validation set
    plt.subplot(1, 3, 2)
   df_val['label_name'].value_counts().plot(kind='bar')
    plt.title('Validation Set Distribution')
    plt.xlabel('Class')
   plt.ylabel('Count')
    plt.xticks(rotation=0)
   # Test set
    plt.subplot(1, 3, 3)
   df_test['label_name'].value_counts().plot(kind='bar')
    plt.title('Test Set Distribution')
   plt.xlabel('Class')
   plt.ylabel('Count')
    plt.xticks(rotation=0)
    plt.tight_layout()
    plt.show()
# Tampilkan visualisasi distribusi
plot_split_distribution(df_train, df_val, df_test)
\overline{2}
     Train Set Label Distribution:
```

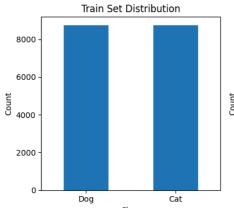


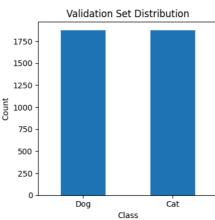
Validation Set Label Distribution: ${\tt label_name}$ 1875 Dog 1875 Cat

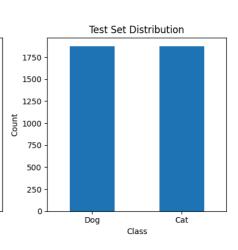
Name: count, dtype: int64

Test Set Label Distribution: label_name Dog 1875

1875 Name: count, dtype: int64







Prepare Dataset

```
# Fungsi untuk mempersiapkan DataFrame
def prepare_dataframe(df, set_name):
    # Pastikan kolom label_name adalah string (diperlukan untuk ImageDataGenerator)
   df['label_name'] = df['label_name'].astype(str)
   # Tampilkan informasi DataFrame
    print(f"\n{set_name} DataFrame Info:")
    print("Shape:", df.shape)
   print("Columns:", df.columns.tolist())
   print("Sample Data:")
   print(df.head())
   print("Label Distribution:")
   print(df['label_name'].value_counts())
# Persiapkan DataFrame untuk train, validation, dan test
df_train = prepare_dataframe(df_train, "Train")
df val = prepare dataframe(df val, "Validation")
df_test = prepare_dataframe(df_test, "Test")
# Simpan DataFrame ke file CSV (opsional, untuk debugging atau referensi)
df_train.to_csv('train_dataset.csv', index=False)
df_val.to_csv('validation_dataset.csv', index=False)
df_test.to_csv('test_dataset.csv', index=False)
print("\nDataFrames telah disimpan sebagai CSV: train_dataset.csv, validation_dataset.csv, test_dataset.csv")
     Train DataFrame Info:
     Shape: (17500, 3)
     Columns: ['image_path', 'label', 'label_name']
     Sample Data:
                                         image_path label_name
     24393 /content/dataset/PetImages/Dog/4935.jpg
                                                        1
     10884 /content/dataset/PetImages/Cat/5087.jpg
                                                                  Cat
     16419 /content/dataset/PetImages/Dog/4899.jpg
                                                                  Dog
                                                        1
           /content/dataset/PetImages/Cat/6495.jpg
                                                         0
     6596
                                                                  Cat
     12718 /content/dataset/PetImages/Dog/9335.jpg
                                                        1
                                                                  Dog
     Label Distribution:
     label_name
     Dog
           8750
     Cat
           8750
     Name: count, dtype: int64
     Validation DataFrame Info:
     Shape: (3750, 3)
     Columns: ['image_path', 'label', 'label_name']
     Sample Data:
                                          image_path label_name
            /content/dataset/PetImages/Dog/8755.jpg
     13100
                                                         1
                                                                   Dog
     9908
             /content/dataset/PetImages/Cat/2006.jpg
                                                          a
                                                                   Cat
     10301
           /content/dataset/PetImages/Cat/11286.jpg
                                                         a
                                                                   Cat
            /content/dataset/PetImages/Cat/6202.jpg
                                                          0
                                                                   Cat
     3310
     19000
             /content/dataset/PetImages/Dog/1546.jpg
                                                                   Dog
     Label Distribution:
     label_name
     Dog
           1875
           1875
     Cat
     Name: count, dtype: int64
     Test DataFrame Info:
     Shape: (3750, 3)
     Columns: ['image_path', 'label', 'label_name']
     Sample Data:
                                          image_path label_name
     23485 /content/dataset/PetImages/Dog/12288.jpg
                                                                   Dog
           /content/dataset/PetImages/Cat/11236.jpg
                                                          0
                                                                   Cat
     24765
           /content/dataset/PetImages/Dog/2794.jpg
                                                                   Dog
                                                         1
             /content/dataset/PetImages/Cat/5469.jpg
     2265
                                                         0
                                                                   Cat
     19246
            /content/dataset/PetImages/Dog/7558.ipg
                                                                   Dog
     Label Distribution:
     label_name
           1875
     Dog
     Cat
           1875
     Name: count, dtype: int64
     DataFrames telah disimpan sebagai CSV: train_dataset.csv, validation_dataset.csv, test_dataset.csv
```

Image Data Generator

```
# Import library yang diperlukan
from tensorflow.keras.preprocessing.image import ImageDataGenerator
# Definisikan parameter
IMG SIZE = 128 # Ukuran gambar
BATCH_SIZE = 32 # Ukuran batch untuk efisiensi memori
# Buat ImageDataGenerator untuk train dengan augmentasi
train_datagen = ImageDataGenerator(
    rescale=1./255, # Normalisasi gambar
    rotation_range=20, # Rotasi acak hingga 20 derajat
    width_shift_range=0.2, # Pergeseran lebar
   height_shift_range=0.2, # Pergeseran tinggi
    shear_range=0.2, # Transformasi shear
   zoom_range=0.2, # Zoom acak
   horizontal_flip=True,  # Flip horizontal
    fill_mode='nearest' # Cara mengisi piksel kosong
# Buat ImageDataGenerator untuk validation dan test (tanpa augmentasi, hanya normalisasi)
val_test_datagen = ImageDataGenerator(
    rescale=1./255 # Normalisasi gambar
# Buat generator untuk train set
train_generator = train_datagen.flow_from_dataframe(
   dataframe=df_train,
   x_col='image_path',
   y_col='label_name',
    target_size=(IMG_SIZE, IMG_SIZE),
   batch_size=BATCH_SIZE,
    class_mode='binary', # Karena klasifikasi biner (Cat vs Dog)
   shuffle=True
)
# Buat generator untuk validation set
validation_generator = val_test_datagen.flow_from_dataframe(
   dataframe=df_val,
   x_col='image_path',
   y_col='label_name',
   target size=(IMG SIZE, IMG SIZE),
   batch_size=BATCH_SIZE,
   class_mode='binary',
   shuffle=False
# Buat generator untuk test set
test_generator = val_test_datagen.flow_from_dataframe(
    dataframe=df_test,
   x_col='image_path',
   y_col='label_name',
   target_size=(IMG_SIZE, IMG_SIZE),
    batch_size=BATCH_SIZE,
   class mode='binary',
   shuffle=False
# Tampilkan informasi generator
print("Train Generator Classes:", train_generator.class_indices)
print("Validation Generator Classes:", validation_generator.class_indices)
print("Test Generator Classes:", test_generator.class_indices)
print(f"Train Samples: {train_generator.samples}")
print(f"Validation Samples: {validation_generator.samples}")
print(f"Test Samples: {test_generator.samples}")
# Visualisasi beberapa gambar dari train generator (dengan augmentasi)
import matplotlib.pyplot as plt
def plot_augmented_images(generator, num_samples=5):
    # Ambil satu batch gambar
    images, labels = next(generator)
    class names = list(generator.class indices.keys())
    plt.figure(figsize=(15, 5))
    for i in range(min(num_samples, len(images))):
        plt.subplot(1, num_samples, i+1)
        plt.imshow(images[i])
        plt.title(class_names[int(labels[i])])
        plt.axis('off')
    plt.show()
# Tampilkan sampel gambar yang telah diaugmentasi dari train generator
```

print("\nSample Augmented Images from Train Generator:")
plot_augmented_images(train_generator)

Found 17500 validated image filenames belonging to 2 classes. Found 3750 validated image filenames belonging to 2 classes. Found 3750 validated image filenames belonging to 2 classes. Train Generator Classes: {'Cat': 0, 'Dog': 1} Validation Generator Classes: {'Cat': 0, 'Dog': 1} Test Generator Classes: {'Cat': 0, 'Dog': 1} Train Samples: 17500 Validation Samples: 3750 Test Samples: 3750

Sample Augmented Images from Train Generator:











Modelling

```
# Definisikan parameter
IMG_SIZE = 128  # Sesuai dengan tahap 5
NUM_CLASSES = 1 # Karena klasifikasi biner (output sigmoid)
# Buat arsitektur CNN
model = models.Sequential([
   # Layer 1: Konvolusi + Pooling
    layers.Conv2D(32, (3, 3), activation='relu', input_shape=(IMG_SIZE, IMG_SIZE, 3)),
   layers.MaxPooling2D((2, 2)),
   # Layer 2: Konvolusi + Pooling
   layers.Conv2D(64, (3, 3), activation='relu'),
   layers.MaxPooling2D((2, 2)),
   # Layer 3: Konvolusi + Pooling
   layers.Conv2D(128, (3, 3), activation='relu'),
   layers.MaxPooling2D((2, 2)),
   # Flatten untuk mengubah ke vektor
   layers.Flatten(),
   # Fully connected layers
   layers.Dense(128, activation='relu'),
    layers.Dropout(0.5), # Dropout untuk mencegah overfitting
    layers.Dense(NUM_CLASSES, activation='sigmoid') # Output biner
])
# Kompilasi model
model.compile(
   optimizer='adam',
    loss='binary_crossentropy',
   metrics=['accuracy']
)
# Tampilkan ringkasan model
model.summary()
```

→ Model: "sequential_2"

Layer (type)	Output Shape	Param #
conv2d_6 (Conv2D)	(None, 126, 126, 32)	896
max_pooling2d_6 (MaxPooling2D)	(None, 63, 63, 32)	0
conv2d_7 (Conv2D)	(None, 61, 61, 64)	18,496
max_pooling2d_7 (MaxPooling2D)	(None, 30, 30, 64)	0
conv2d_8 (Conv2D)	(None, 28, 28, 128)	73,856
max_pooling2d_8 (MaxPooling2D)	(None, 14, 14, 128)	0
flatten_2 (Flatten)	(None, 25088)	0
dense_4 (Dense)	(None, 128)	3,211,392
dropout_2 (Dropout)	(None, 128)	0
dense_5 (Dense)	(None, 1)	129

Total params: 3,304,769 (12.61 MB) Trainable params: 3,304,769 (12.61 MB)

∨ Implementasi Callback

```
# Import library yang diperlukan
from\ tensorflow. keras. callbacks\ import\ Early Stopping,\ Model Checkpoint,\ Reduce LROn Plateau
# Definisikan direktori untuk menyimpan model sementara
checkpoint_dir = 'checkpoints'
# Definisikan callback
callbacks = [
   # EarlyStopping: Hentikan training jika val_accuracy tidak membaik
   EarlyStopping(
       monitor='val_accuracy',
       patience=5,
        verbose=1.
       restore best weights=True
   ),
    # ModelCheckpoint: Simpan model terbaik dalam format .keras
   ModelCheckpoint(
        filepath=os.path.join(checkpoint_dir, 'checkpoint.keras'),
       monitor='val_accuracy',
       save_best_only=True,
   ),
   # ReduceLROnPlateau: Kurangi learning rate jika val_accuracy stagnan
    ReduceLROnPlateau(
       monitor='val_accuracy',
        factor=0.2,
       patience=3,
       min_lr=1e-6,
        verbose=1
   )
]
# Buat direktori checkpoint jika belum ada
os.makedirs(checkpoint_dir, exist_ok=True)
# Tampilkan informasi callback
print("Callbacks yang akan digunakan:")
for callback in callbacks:
   print(f"- {callback.__class__.__name__}}")
print(f"\nModel sementara akan disimpan di '{checkpoint_dir}/checkpoint.keras'.")
print("Model akhir akan disimpan dalam format SavedModel di direktori 'saved_model' setelah pelatihan.")
→ Callbacks yang akan digunakan:
     - EarlyStopping
     - ModelCheckpoint
     - ReduceLROnPlateau
     Model sementara akan disimpan di 'checkpoints/checkpoint.keras'.
```

Training Model

Model akhir akan disimpan dalam format SavedModel di direktori 'saved_model' setelah pelatihan.

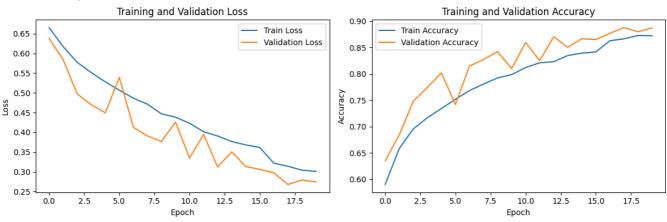
```
# Import library yang diperlukan
from tensorflow.keras.preprocessing.image import ImageDataGenerator
from PIL import Image
# Fungsi untuk memvalidasi file gambar
def is_valid_image(file_path):
   try:
        img = Image.open(file_path)
        img.verify() # Verifikasi integritas file
        img.close()
        return True
    except Exception as e:
       print(f"Invalid image file: {file_path} - {str(e)}")
# Filter DataFrame untuk hanya menyertakan file gambar yang valid
def filter_valid_images(df):
   valid rows = []
   invalid_files = []
    for idx, row in df.iterrows():
        if is_valid_image(row['image_path']):
            valid_rows.append(row)
        else:
            invalid_files.append(row['image_path'])
    valid_df = pd.DataFrame(valid_rows, columns=df.columns)
    print(f"Total invalid files skipped: {len(invalid_files)}")
    if invalid files:
       print("Sample invalid files:", invalid_files[:5])
    return valid df
# Terapkan filter ke DataFrame (train, validation, test)
print("Filtering invalid images...")
df_train = filter_valid_images(df_train)
df_val = filter_valid_images(df_val)
df_test = filter_valid_images(df_test)
# Perbarui generator dengan DataFrame yang sudah difilter
train_datagen = ImageDataGenerator(
   rescale=1./255,
   rotation_range=20,
   width_shift_range=0.2,
   height_shift_range=0.2,
   shear_range=0.2,
   zoom_range=0.2,
   horizontal flip=True.
   fill mode='nearest'
val_test_datagen = ImageDataGenerator(rescale=1./255)
train_generator = train_datagen.flow_from_dataframe(
   dataframe=df train,
   x_col='image_path',
   y_col='label_name',
   target_size=(128, 128),
   batch_size=32,
   class_mode='binary',
   shuffle=True
validation_generator = val_test_datagen.flow_from_dataframe(
   dataframe=df_val,
   x_col='image_path',
   y_col='label_name'
   target_size=(128, 128),
   batch_size=32,
   class_mode='binary',
   shuffle=False
)
→ Filtering invalid images...
     /usr/local/lib/python .11/dist-packages/PIL/TiffImagePlugin.py:950: UserWarning: Truncated File Read
       warnings.warn(str(msg))
     Invalid image file: /content/dataset/PetImages/Dog/11702.jpg - cannot identify image file '/content/dataset/PetImages/Dog/11702.jpg
     Total invalid files skipped: 1
     Sample invalid files: ['/content/dataset/PetImages/Dog/11702.jpg']
     Invalid image file: /content/dataset/PetImages/Cat/666.jpg - cannot identify image file '/content/dataset/PetImages/Cat/666.jpg'
     Total invalid files skipped: 1
     Sample invalid files: ['/content/dataset/PetImages/Cat/666.jpg']
     Total invalid files skipped: 0
     Found 17499 validated image filenames belonging to 2 classes.
```

Found 3749 validated image filenames belonging to 2 classes.

```
# Definisikan parameter training
EPOCHS = 20
# Latih model
history = model.fit(
   train_generator,
   epochs=EPOCHS,
   validation_data=validation_generator,
   callbacks=callbacks,
   verbose=1
# Simpan model dalam format SavedModel setelah pelatihan
saved_model_dir = 'saved_model'
try:
   model.save(saved_model_dir, save_format='tf')
   print(f"\nModel telah disimpan dalam format SavedModel di '{saved_model_dir}'.")
   # Verifikasi isi direktori
   print(f"Isi {saved_model_dir}:")
   for item in os.listdir(saved_model_dir):
       print(f"- {item}")
except Exception as e:
   print(f"Error saat menyimpan SavedModel: {e}")
# Tampilkan ringkasan hasil training
print("\nTraining selesai!")
print("Akurasi terbaik pada validation set:", max(history.history['val_accuracy']))
# Visualisasi loss dan akurasi
def plot_training_history(history):
   plt.figure(figsize=(12, 4))
   # Plot loss
   plt.subplot(1, 2, 1)
   plt.plot(history.history['loss'], label='Train Loss')
   plt.plot(history.history['val_loss'], label='Validation Loss')
   plt.title('Training and Validation Loss')
   plt.xlabel('Epoch')
   plt.ylabel('Loss')
   plt.legend()
   # Plot akurasi
   plt.subplot(1, 2, 2)
   plt.plot(history.history['accuracy'], label='Train Accuracy')
   plt.plot(history.history['val_accuracy'], label='Validation Accuracy')
   plt.title('Training and Validation Accuracy')
   plt.xlabel('Epoch')
   plt.ylabel('Accuracy')
   plt.legend()
   plt.tight_layout()
    plt.show()
# Tampilkan plot hasil training
plot_training_history(history)
```

```
🕁 /usr/local/lib/python3.11/dist-packages/keras/src/trainers/data_adapters/py_dataset_adapter.py:121: UserWarning: Your `PyDataset` cl
      self._warn_if_super_not_called()
    Epoch 1/20
    519/547
                                - 4s 175ms/step - accuracy: 0.5621 - loss: 0.6781/usr/local/lib/python3.11/dist-packages/PIL/TiffImagePlu
      warnings.warn(str(msg))
                                - 0s 177ms/step - accuracy: 0.5635 - loss: 0.6774
    547/547
    Epoch 1: val_accuracy improved from -inf to 0.63510, saving model to checkpoints/checkpoint.keras
                                - 112s 193ms/step - accuracy: 0.5636 - loss: 0.6774 - val_accuracy: 0.6351 - val_loss: 0.6376 - learning
    547/547
    Epoch 2/20
    547/547 -
                                - 0s 186ms/step - accuracy: 0.6525 - loss: 0.6248
    Epoch 2: val_accuracy improved from 0.63510 to 0.68418, saving model to checkpoints/checkpoint.keras
    547/547 -
                                - 141s 198ms/step - accuracy: 0.6525 - loss: 0.6248 - val_accuracy: 0.6842 - val_loss: 0.5842 - learning
    Epoch 3/20
    547/547
                                - 0s 178ms/step - accuracy: 0.6788 - loss: 0.5880
    Epoch 3: val_accuracy improved from 0.68418 to 0.74820, saving model to checkpoints/checkpoint.keras
                                - 103s 188ms/step - accuracy: 0.6788 - loss: 0.5879 - val_accuracy: 0.7482 - val_loss: 0.4975 - learning
    547/547
    Fnoch 4/20
                                - 0s 174ms/step - accuracy: 0.7109 - loss: 0.5579
    547/547 -
    Epoch 4: val_accuracy improved from 0.74820 to 0.77407, saving model to checkpoints/checkpoint.keras
    547/547 -
                                - 106s 193ms/step - accuracy: 0.7109 - loss: 0.5579 - val_accuracy: 0.7741 - val_loss: 0.4700 - learning
    Epoch 5/20
                                - 0s 172ms/step - accuracy: 0.7268 - loss: 0.5350
    547/547 -
    Epoch 5: val_accuracy improved from 0.77407 to 0.80181, saving model to checkpoints/checkpoint.keras
    547/547
                                - 100s 183ms/step - accuracy: 0.7268 - loss: 0.5349 - val_accuracy: 0.8018 - val_loss: 0.4494 - learning
    Epoch 6/20
    547/547
                                0s 169ms/step - accuracy: 0.7464 - loss: 0.5081
    Epoch 6: val accuracy did not improve from 0.80181
                                - 98s 180ms/step - accuracy: 0.7464 - loss: 0.5081 - val accuracy: 0.7418 - val loss: 0.5392 - learning r
    547/547
    Epoch 7/20
    547/547
                                - 0s 168ms/step - accuracy: 0.7720 - loss: 0.4872
    Epoch 7: val_accuracy improved from 0.80181 to 0.81488, saving model to checkpoints/checkpoint.keras
    547/547
                                - 98s 179ms/step - accuracy: 0.7720 - loss: 0.4872 - val_accuracy: 0.8149 - val_loss: 0.4128 - learning_r
    Epoch 8/20
    547/547
                                - 0s 171ms/step - accuracy: 0.7777 - loss: 0.4720
    Epoch 8: val_accuracy improved from 0.81488 to 0.82715, saving model to checkpoints/checkpoint.keras
    547/547
                                - 100s 182ms/step - accuracy: 0.7777 - loss: 0.4720 - val accuracy: 0.8272 - val loss: 0.3908 - learning
    Epoch 9/20
    547/547 -
                                - 0s 168ms/step - accuracy: 0.7938 - loss: 0.4451
     \hbox{Epoch 9: val\_accuracy improved from 0.82715 to 0.84236, saving model to checkpoints/checkpoint.} \\ keras
                                - 98s 179ms/step - accuracy: 0.7938 - loss: 0.4451 - val_accuracy: 0.8424 - val_loss: 0.3767 - learning_r
    547/547
    Epoch 10/20
    547/547
                                - 0s 168ms/step - accuracy: 0.8006 - loss: 0.4415
    Epoch 10: val_accuracy did not improve from 0.84236
    547/547
                                - 98s 179ms/step - accuracy: 0.8006 - loss: 0.4414 - val_accuracy: 0.8101 - val_loss: 0.4261 - learning_r
    Epoch 11/20
    547/547
                                - 0s 170ms/step - accuracy: 0.8123 - loss: 0.4204
    Epoch 11: val_accuracy improved from 0.84236 to 0.85970, saving model to checkpoints/checkpoint.keras
                                - 99s 181ms/step - accuracy: 0.8123 - loss: 0.4204 - val_accuracy: 0.8597 - val_loss: 0.3349 - learning_r
    547/547
    Epoch 12/20
    547/547 -
                                - 0s 170ms/step - accuracy: 0.8187 - loss: 0.4066
    Epoch 12: val_accuracy did not improve from 0.85970
                                - 99s 181ms/step - accuracy: 0.8187 - loss: 0.4066 - val_accuracy: 0.8250 - val_loss: 0.3947 - learning_r
    547/547
    Epoch 13/20
    547/547
                                - 0s 170ms/step - accuracy: 0.8246 - loss: 0.3875
    Epoch 13: val_accuracy improved from 0.85970 to 0.87063, saving model to checkpoints/checkpoint.keras
    547/547
                                - 99s 182ms/step - accuracy: 0.8246 - loss: 0.3876 - val_accuracy: 0.8706 - val_loss: 0.3120 - learning_r
    Epoch 14/20
    547/547
                                - 0s 171ms/step - accuracy: 0.8352 - loss: 0.3755
    Epoch 14: val accuracy did not improve from 0.87063
                                - 99s 181ms/step - accuracy: 0.8352 - loss: 0.3755 - val_accuracy: 0.8504 - val_loss: 0.3507 - learning_r
    547/547
    Epoch 15/20
    547/547
                                - 0s 168ms/step - accuracy: 0.8381 - loss: 0.3710
    Epoch 15: val_accuracy did not improve from 0.87063
    547/547 -
                                - 98s 179ms/step - accuracy: 0.8381 - loss: 0.3710 - val_accuracy: 0.8666 - val_loss: 0.3132 - learning_r
    Epoch 16/20
    547/547 -
                                - 0s 167ms/step - accuracy: 0.8417 - loss: 0.3610
    Epoch 16: val_accuracy did not improve from 0.87063
    Epoch 16: ReduceLROnPlateau reducing learning rate to 0.00020000000949949026.
                                - 96s 176ms/step - accuracy: 0.8417 - loss: 0.3610 - val_accuracy: 0.8650 - val_loss: 0.3062 - learning_r
    547/547
    Enoch 17/20
    547/547 -
                                - 0s 170ms/step - accuracy: 0.8584 - loss: 0.3343
    Epoch 17: val_accuracy improved from 0.87063 to 0.87703, saving model to checkpoints/checkpoint.keras
    547/547
                                - 99s 180ms/step - accuracy: 0.8584 - loss: 0.3343 - val_accuracy: 0.8770 - val_loss: 0.2974 - learning_r
    Epoch 18/20
    547/547
                                - 0s 169ms/step - accuracy: 0.8659 - loss: 0.3152
    Epoch 18: val_accuracy improved from 0.87703 to 0.88770, saving model to checkpoints/checkpoint.keras
    547/547
                                - 98s 179ms/step - accuracy: 0.8659 - loss: 0.3152 - val_accuracy: 0.8877 - val_loss: 0.2679 - learning_r
    Epoch 19/20
    547/547
                                 0s 170ms/step - accuracy: 0.8719 - loss: 0.3053
    Epoch 19: val_accuracy did not improve from 0.88770
                                - 98s 179ms/step - accuracy: 0.8719 - loss: 0.3053 - val_accuracy: 0.8800 - val_loss: 0.2792 - learning_r
    547/547
    Epoch 20/20
    547/547
                                - 0s 171ms/step - accuracy: 0.8689 - loss: 0.3042
    Epoch 20: val_accuracy did not improve from 0.88770
                                - 104s 190ms/step - accuracy: 0.8689 - loss: 0.3042 - val_accuracy: 0.8872 - val_loss: 0.2744 - learning
    547/547
    Restoring model weights from the end of the best epoch: 18.
    Error saat menyimpan SavedModel: The `save_format` argument is deprecated in Keras 3. Please remove this argument and pass a file page 1.
```

Akurasi terbaik pada validation set: 0.8877033591270447



```
# Simpan model dalam format .keras (cadangan)
keras_model_path = 'model.keras'
try:
   model.save(keras_model_path)
    print(f"\nModel telah disimpan dalam format .keras di '{keras_model_path}'.")
except Exception as e:
   print(f"Error saat menyimpan model .keras: {e}")
# Simpan model dalam format SavedModel
saved_model_dir = 'saved_model'
    tf.saved_model.save(model, saved_model_dir)
    print(f"Model telah disimpan dalam format SavedModel di '{saved_model_dir}'.")
    # Verifikasi isi direktori
    print(f"Isi {saved_model_dir}:")
    for item in os.listdir(saved_model_dir):
       print(f"- {item}")
except Exception as e:
    print(f"Error saat menyimpan SavedModel: {e}")
₹
     Model telah disimpan dalam format .keras di 'model.keras'.
     Model telah disimpan dalam format SavedModel di 'saved_model'.
     Isi saved_model:
     - saved_model.pb
     - variables
     - assets
```

Evaluasi dan Visualisasi

- fingerprint.pb

```
# Import library evaluasi
from sklearn.metrics import confusion_matrix, classification_report
# Evaluasi model pada test set
test_loss, test_accuracy = model.evaluate(test_generator, verbose=1)
print(f"\nTest Loss: {test_loss:.4f}")
print(f"Test Accuracy: {test_accuracy:.4f}")
# Prediksi pada test set
test_generator.reset() # Reset generator untuk memastikan urutan benar
y_pred = model.predict(test_generator)
y_pred_classes = (y_pred > 0.5).astype(int).flatten() # Konversi probabilitas ke kelas (0 atau 1)
y_true = test_generator.classes # Label sebenarnya dari test_generator
# Buat confusion matrix
cm = confusion_matrix(y_true, y_pred_classes)
class_names = list(test_generator.class_indices.keys()) # ['Cat', 'Dog']
# Visualisasi confusion matrix
plt.figure(figsize=(8, 6))
sns.heatmap(cm, annot=True, fmt='d', cmap='Blues', xticklabels=class_names, yticklabels=class_names)
plt.title('Confusion Matrix')
plt.xlabel('Predicted')
```

```
plt.ylabel('True')
plt.show()
# Classification report
print("\nClassification Report:")
\verb|print(classification_report(y_true, y_pred_classes, target_names=class_names))| \\
# Visualisasi beberapa prediksi pada test set
def plot_sample_predictions(generator, y_true, y_pred_classes, class_names, num_samples=5):
    generator.reset() # Reset generator
    images, labels = next(generator) # Ambil batch pertama
    indices = np.random.choice(len(images), num_samples, replace=False)
    plt.figure(figsize=(15, 5))
    for i, idx in enumerate(indices):
       plt.subplot(1, num_samples, i+1)
       plt.imshow(images[idx])
       true_label = class_names[int(labels[idx])]
       pred_label = class_names[y_pred_classes[idx]]
        title = f"True: {true_label}\nPred: {pred_label}"
       plt.title(title, color='green' if true_label == pred_label else 'red')
       plt.axis('off')
    plt.tight_layout()
    plt.show()
# Tampilkan beberapa prediksi
print("\nSample Predictions on Test Set:")
\verb|plot_sample_predictions| (test_generator, y_true, y_pred_classes, class_names)| \\
```

```
→ 118/118
                                - 12s 98ms/step - accuracy: 0.8880 - loss: 0.2623
    Test Loss: 0.2754
    Test Accuracy: 0.8859
    118/118 -
                                 - 6s 45ms/step
                                   Confusion Matrix
                                                                                       1600
                                                                                      1400
                          1605
                                                           270
        Cat
                                                                                       1200
                                                                                      1000
     True
                                                                                      800
                                                                                      - 600
        D0g -
                          158
                                                           1717
                                                                                      - 400
                                                                                     - 200
                           Cat
                                                           Dog
```

Classification Report:

	precision	recall	f1-score	support
Cat	0.91	0.86	0.88	1875
Dog	0.86	0.92	0.89	1875
8				
accuracy			0.89	3750
macro avg	0.89	0.89	0.89	3750
weighted avg	0.89	0.89	0.89	3750

Sample Predictions on Test Set:





Predicted







```
# Definisikan path SavedModel
saved_model_dir = 'saved_model'
# Verifikasi keberadaan SavedModel
if not os.path.exists(saved_model_dir):
    raise FileNotFoundError(f"Direktori SavedModel '{saved_model_dir}' tidak ditemukan.")
# Konversi model ke format TFLite
try:
    converter = tf.lite.TFLiteConverter.from_saved_model(saved_model_dir)
    tflite_model = converter.convert()
    print("Model SavedModel berhasil dikonversi ke TFLite.")
except Exception as e:
    print(f"Error saat mengonversi model ke TFLite: {e}")
    raise
# Simpan model TFLite ke file
tflite_model_path = 'model.tflite'
with open(tflite_model_path, 'wb') as f:
    f.write(tflite_model)
```

```
# Tampilkan ukuran file TFLite
tflite_size = os.path.getsize(tflite_model_path) / (1024 * 1024) # Ukuran dalam MB
print(f"\nModel TFLite telah disimpan sebagai '{tflite_model_path}'")
print(f"Ukuran file TFLite: {tflite_size:.2f} MB")

# Verifikasi model TFLite
interpreter = tf.lite.Interpreter(model_path=tflite_model_path)
interpreter.allocate_tensors()
print("Model TFLite berhasil diverifikasi.")
```

Model SavedModel berhasil dikonversi ke TFLite.

Model TFLite telah disimpan sebagai 'model.tflite'
Ukuran file TFLite: 0.01 MB
Model TFLite berhasil diverifikasi.

Konversi Model

TFLite

```
# Bagian 1: Verifikasi Model TFLite
tflite_model_path = 'model.tflite'
try:
    # Muat dan verifikasi model TFLite
    interpreter = tf.lite.Interpreter(model_path=tflite_model_path)
    interpreter.allocate tensors()
    print("Model TFLite berhasil dimuat dan diverifikasi.")
    # Tampilkan detail input dan output
    input_details = interpreter.get_input_details()
    output_details = interpreter.get_output_details()
    print("Input Details:", input_details)
    print("Output Details:", output_details)
except Exception as e:
    print(f"Error saat memuat model TFLite: {e}")
→ Model TFLite berhasil dimuat dan diverifikasi.
      Input Details: [{'name': 'serving_default_inputs:0', 'index': 0, 'shape': array([ 1, 128, 128, 3], dtype=int32), 'shape_signature Output Details: [{'name': 'StatefulPartitionedCall:0', 'index': 45, 'shape': array([1, 1], dtype=int32), 'shape_signature': array([
```

TFJS

```
# Bagian 2: Konversi Model ke TensorFlow.js
saved_model_dir = 'saved_model'

try:

# Konversi langsung dari SavedModel ke TFJS

tfjs.converters.convert_tf_saved_model(saved_model_dir, tfjs_model_dir)

print(f"\nModel TensorFlow.js telah disimpan di direktori '{tfjs_model_dir}'")

# Tampilkan isi direktori TFJS

print("Isi direktori TFJS:")

for file in os.listdir(tfjs_model_dir):
    print(f"- {file}")

except Exception as e:
    print(f"Error saat mengonversi model ke TFJS: {e}")
```

Model TensorFlow.js telah disimpan di direktori 'tfjs_model' Isi direktori TFJS:
- group1-shard1of4.bin
- model.json
- group1-shard4of4.bin
- group1-shard2of4.bin
- group1-shard3of4.bin

ZIP Model TFJS

```
# Bagian 3: Kompresi folder tfjs_model menjadi ZIP
tfjs_zip_path = 'tfjs_model.zip'
try:
    shutil.make_archive('tfjs_model', 'zip', tfjs_model_dir)
    print(f"\nFolder '{tfjs_model_dir}' telah dikompresi menjadi '{tfjs_zip_path}'")
except Exception as e:
```

```
print(f"Error saat mengompresi folder TFJS: {e}")

# Tampilkan ukuran file TFLite dan direktori TFJS
tflite_size = os.path.getsize(tflite_model_path) / (1024 * 1024) # Ukuran dalam MB
print(f"\nUkuran file TFLite: {tflite_size:.2f} MB")

tfjs_size = sum(os.path.getsize(os.path.join(tfjs_model_dir, f)) for f in os.listdir(tfjs_model_dir)) / (1024 * 1024)
print(f"Ukuran total direktori TFJS: {tfjs_size:.2f} MB")

tfjs_zip_size = os.path.getsize(tfjs_zip_path) / (1024 * 1024) # Ukuran dalam MB
print(f"Ukuran file ZIP TFJS: {tfjs_zip_size:.2f} MB")

Folder 'tfjs_model' telah dikompresi menjadi 'tfjs_model.zip'
```

Download Model

Ukuran file TFLite: 0.01 MB

Ukuran total direktori TFJS: 12.62 MB Ukuran file ZIP TFJS: 11.81 MB

```
# Import library yang diperlukan
from google.colab import files
import zipfile
# Definisikan path file dan direktori
saved model dir = 'saved model'
tfjs_model_dir = 'tfjs_model'
keras_model_path = 'model.keras'
tflite_model_path = 'model.tflite'
test_dataset_path = 'test_dataset.csv'
train_dataset_path = 'train_dataset.csv'
validation_dataset_path = 'validation_dataset.csv'
output_zip = 'faizalriza_savedModel.zip'
# Verifikasi keberadaan file dan direktori
print("Memeriksa keberadaan file dan direktori untuk di-zip:")
files to zip = [
   (saved_model_dir, "direktori"),
    (tfjs_model_dir, "direktori"),
    (keras_model_path, "file"),
    (tflite_model_path, "file"),
    (test_dataset_path, "file"),
    (train_dataset_path, "file"),
    (validation_dataset_path, "file")
1
all_files_exist = True
for path, type_ in files_to_zip:
    if os.path.exists(path):
       print(f"- {path} ({type_}) ditemukan.")
        if type_ == "direktori":
            print(f" Isi {path}:")
            for item in os.listdir(path):
               print(f" - {item}")
    else:
        print(f"- {path} ({type_}) tidak ditemukan!")
        all_files_exist = False
if not all_files_exist:
    print("\nPeringatan: Beberapa file/direktori tidak ditemukan. Proses kompresi tetap akan dilanjutkan dengan file yang ada.")
# Buat file ZIP
try:
    print(f"\nMengompresi file ke '{output_zip}'...")
    with zipfile.ZipFile(output_zip, 'w', zipfile.ZIP_DEFLATED) as zipf:
        # Tambahkan folder saved_model
        if os.path.exists(saved_model_dir):
            for root, _, files in os.walk(saved_model_dir):
                for file in files:
                    file_path = os.path.join(root, file)
                    arcname = os.path.relpath(file_path, start=os.path.dirname(saved_model_dir))
                    zipf.write(file_path, arcname)
            print(f"- {saved_model_dir} ditambahkan ke ZIP.")
        # Tambahkan folder tfjs_model
        if os.path.exists(tfjs_model_dir):
            for root, _, files in os.walk(tfjs_model_dir):
                for file in files:
                    file_path = os.path.join(root, file)
```

```
arcname = os.path.relpath(file_path, start=os.path.dirname(tfjs_model_dir))
                    zipf.write(file path, arcname)
            print(f"- {tfjs_model_dir} ditambahkan ke ZIP.")
        # Tambahkan file individu
        for file_path in [keras_model_path, tflite_model_path, test_dataset_path, train_dataset_path, validation_dataset_path]:
            if os.path.exists(file_path):
               arcname = os.path.basename(file path)
                zipf.write(file_path, arcname)
               print(f"- {file_path} ditambahkan ke ZIP.")
    # Tampilkan ukuran file ZIP
    zip_size = os.path.getsize(output_zip) / (1024 * 1024) # Ukuran dalam MB
    print(f"\nFile '{output_zip}' berhasil dibuat.")
    print(f"Ukuran file ZIP: {zip_size:.2f} MB")
except Exception as e:
    print(f"Error saat mengompresi file: {e}")
    raise
# Unduh file ZIP
    print(f"\nMengunduh '{output_zip}'...")
    files.download(output_zip)
except Exception as e:
   print(f"Error saat mengunduh {output_zip}: {e}")
Memeriksa keberadaan file dan direktori untuk di-zip:
      saved_model (direktori) ditemukan.
       Isi saved_model:
         - saved model.pb
         - variables
         - assets
         - fingerprint.pb
     - tfjs_model (direktori) ditemukan.
       Isi tfjs_model:
         - group1-shard1of4.bin
         - model.json
         - group1-shard4of4.bin
         - group1-shard2of4.bin
          group1-shard3of4.bin
     - model.keras (file) ditemukan.
     - model.tflite (file) ditemukan.
     - test dataset.csv (file) ditemukan.
     - train dataset.csv (file) ditemukan.
     - validation_dataset.csv (file) ditemukan.
     Mengompresi file ke 'faizalriza_savedModel.zip'...
     - saved_model ditambahkan ke ZIP.
     - tfjs_model ditambahkan ke ZIP.
     - model.keras ditambahkan ke ZIP.
     - model.tflite ditambahkan ke ZIP.
     - test_dataset.csv ditambahkan ke ZIP.
     - train dataset.csv ditambahkan ke ZIP.
     - validation_dataset.csv ditambahkan ke ZIP.
     File 'faizalriza_savedModel.zip' berhasil dibuat.
     Ukuran file ZIP: 66.45 MB
     Mengunduh 'faizalriza_savedModel.zip'...
     Error saat mengunduh faizalriza_savedModel.zip: 'list' object has no attribute 'download'
```

Implementasi Model

```
#periksa signature savedModel
saved_model_dir = 'saved_model'
loaded = tf.saved_model.load(saved_model_dir)
print(list(loaded.signatures.keys()))
print(loaded.signatures['serving_default'].structured_input_signature)
print(loaded.signatures['serving_default'].structured_outputs)
→ ['serving_default']
     ((), {'inputs': TensorSpec(shape=(None, 128, 128, 3), dtype=tf.float32, name='inputs')})
     {'output_0': TensorSpec(shape=(None, 1), dtype=tf.float32, name='output_0')}
# Import library yang diperlukan
import tensorflow as tf
import numpy as np
import matplotlib.pyplot as plt
from google.colab import files
import cv2
from PIL import Image
```

```
# Definisikan path SavedModel
saved_model_dir = 'saved_model'
# Verifikasi keberadaan SavedModel
if not os.path.exists(saved_model_dir):
    raise FileNotFoundError(f"Direktori SavedModel '{saved_model_dir}' tidak ditemukan.")
# Periksa isi direktori SavedModel
print(f"Isi direktori {saved_model_dir}:")
for item in os.listdir(saved model dir):
    print(f"- {item}")
# Periksa signature SavedModel
try:
    loaded_model = tf.saved_model.load(saved_model_dir)
    signatures = list(loaded_model.signatures.keys())
    print("\nSignature yang tersedia:", signatures)
    if 'serving_default' in signatures:
        print("Input signature:", loaded_model.signatures['serving_default'].structured_input_signature)
print("Output signature:", loaded_model.signatures['serving_default'].structured_outputs)
    else:
       print("Peringatan: Signature 'serving_default' tidak ditemukan!")
except Exception as e:
    print(f"Error saat memeriksa signature SavedModel: {e}")
# Muat model dari format SavedModel sebagai inference layer
try:
    inference_layer = tf.keras.layers.TFSMLayer(saved_model_dir, call_endpoint='serving_default')
    print("Model SavedModel berhasil dimuat sebagai inference layer.")
except Exception as e:
    print(f"Error saat memuat model SavedModel: {e}")
    raise
# Definisikan parameter
IMG_SIZE = 128  # Ukuran gambar sesuai pelatihan
class_names = ['Cat', 'Dog'] # Mapping kelas
# Fungsi untuk memproses gambar baru
def preprocess_image(image_path):
    try:
        # Baca gambar dengan OpenCV
        img = cv2.imread(image_path)
        if img is None:
            raise ValueError("Gagal membaca gambar.")
        # Konversi ke RGB (OpenCV menggunakan BGR)
        img = cv2.cvtColor(img, cv2.COLOR_BGR2RGB)
        # Ubah ukuran ke 128x128
        img = cv2.resize(img, (IMG_SIZE, IMG_SIZE))
        # Normalisasi (0-1)
        img = img / 255.0
        # Tambahkan dimensi batch (1, 128, 128, 3)
        img = np.expand_dims(img, axis=0).astype(np.float32)
        # Validasi bentuk input
        if img.shape != (1, IMG_SIZE, IMG_SIZE, 3):
            raise ValueError(f"Bentuk input tidak valid: {img.shape}. Harus (1, {IMG_SIZE}, {IMG_SIZE}, 3).")
        print(f"Bentuk input tensor: {img.shape}, dtype: {img.dtype}")
        return img
    except Exception as e:
        print(f"Error saat memproses gambar: {e}")
        return None
# Fungsi untuk memprediksi dan menampilkan hasil
```