SETUP AND INSTALLATION

```
!pip install roboflow kagglehub --quiet

import os
import pandas as pd
import numpy as np
import tensorflow as tf
from roboflow import Roboflow
from sklearn.model_selection import train_test_split
from sklearn.utils import resample
from tensorflow.keras.preprocessing.image import ImageDataGenerator
import matplotlib.pyplot as plt
import cv2
from google.colab import files
from google.colab.patches import cv2_imshow

print("done..")
```

```
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     ━━━━━━━━━━━━━━━━━━━━━━━━━━━━━━━━━━━━━━━━ 1.4/1.4 MB 58.3 MB/s eta 0:00:00
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  done..
```

download datasets

```
# Dictionary to hold the paths to our downloaded data
paths = {}

try:
    # --- Roboflow Downloads ---
    from roboflow import Roboflow
    rf = Roboflow(api_key="Z2BdotJhyaVVEojm45J8") # Using the key from the original notebook

    print("--- Downloading Original Datasets ---")
    print("  -> Downloading Graffiti dataset...")
    project = rf.workspace("hruts-workspace").project("graffiti-l6az9")
    dataset = project.version(1).download("yolov8")
    paths['graffiti'] = dataset.location

    print("  -> Downloading Damaged Construction (Concrete) dataset...")
    project = rf.workspace("road-ywxxe").project("concrete-pugqq")
    dataset = project.version(3).download("yolov8")
    paths['concrete'] = dataset.location

    print("  -> Downloading Damaged Signs (HIND) dataset...")
    project = rf.workspace("road-inspection").project("damaged-signs-hind")
    dataset = project.version(2).download("yolov8")
    paths['signs_hind'] = dataset.location

    print("\n--- Downloading and Aggregating Datasets for Minority Classes ---")

    # PARKING DATASETS
    print("  -> Downloading Parking (Original)...")
    project = rf.workspace("parking-amu50").project("illegal-parking")
    dataset = project.version(5).download("yolov8")
    paths['parking_original'] = dataset.location

    print("  -> Downloading Parking (New 1)...")
    project = rf.workspace("hao-61fh1").project("illegal-parking-xtkyr")
    dataset = project.version(1).download("yolov8")
    paths['parking_new_1'] = dataset.location

    # POTHOLE DATASETS
    print("  -> Downloading Potholes (Original)...")
    project = rf.workspace("road-holes").project("road-holes-iow4h")
    dataset = project.version(1).download("yolov8")
    paths['potholes_original'] = dataset.location
```

```
    print("  -> Downloading Potholes (New 1)...")
    project = rf.workspace("evansworkspace").project("pothole-ek")
    dataset = project.version(1).download("yolov8")
    paths['potholes_new_1'] = dataset.location

    # TRASH DATASETS
    print("  -> Downloading Trash (Original)...")
    project = rf.workspace("trash-drone").project("domestic-trash-ryw1h")
    dataset = project.version(2).download("yolov8")
    paths['trash_original'] = dataset.location

    print("  -> Downloading Trash (New 1)...")
    project = rf.workspace("datacluster-labs-agryi").project("domestic-trash")
    dataset = project.version(1).download("yolov8")
    paths['trash_new_1'] = dataset.location


    print("\nAll datasets downloaded successfully!")
    for name, path in paths.items():
        print(f"  - {name}: {path}")

except Exception as e:
    print(f"\n An error occurred during download: {e}")
```

```
Extracting Dataset Version Zip to concrete-3 in yolov8:: 100%|██████████| 1992/1992 [00:01<00:00, 1790.78it/s]  -> Downloading Damaged
loading Roboflow workspace...

loading Roboflow project...
Downloading Dataset Version Zip in damaged-signs-Hind-2 to yolov8:: 100%|██████████| 86874/86874 [00:02<00:00, 37475.81it/s]

Extracting Dataset Version Zip to damaged-signs-Hind-2 in yolov8:: 100%|██████████| 4830/4830 [00:00<00:00, 5025.08it/s]
--- Downloading and Aggregating Datasets for Minority Classes ---
  -> Downloading Parking (Original)...
loading Roboflow workspace...

loading Roboflow project...
Downloading Dataset Version Zip in Illegal-Parking-5 to yolov8:: 100%|██████████| 6248/6248 [00:00<00:00, 24068.73it/s]

Extracting Dataset Version Zip to Illegal-Parking-5 in yolov8:: 100%|██████████| 220/220 [00:00<00:00, 5684.46it/s]  -> Downloading Pa
loading Roboflow workspace...

loading Roboflow project...
Downloading Dataset Version Zip in illegal-parking-1 to yolov8:: 100%|██████████| 78407/78407 [00:01<00:00, 55070.46it/s]

Extracting Dataset Version Zip to illegal-parking-1 in yolov8:: 100%|██████████| 4238/4238 [00:00<00:00, 5152.69it/s]  -> Downloading
loading Roboflow workspace...

loading Roboflow project...
Downloading Dataset Version Zip in Road-holes-1 to yolov8:: 100%|██████████| 11134/11134 [00:00<00:00, 24829.50it/s]

Extracting Dataset Version Zip to Road-holes-1 in yolov8:: 100%|██████████| 378/378 [00:00<00:00, 3208.50it/s]  -> Downloading Pothole
loading Roboflow workspace...

loading Roboflow project...
Downloading Dataset Version Zip in pothole-ek-1 to yolov8:: 100%|██████████| 28816/28816 [00:00<00:00, 47220.77it/s]

Extracting Dataset Version Zip to pothole-ek-1 in yolov8:: 100%|██████████| 1058/1058 [00:00<00:00, 5749.01it/s]
  -> Downloading Trash (Original)...
loading Roboflow workspace...
loading Roboflow project...
Downloading Dataset Version Zip in Domestic-trash-2 to yolov8:: 100%|██████████| 20020/20020 [00:00<00:00, 38659.07it/s]

Extracting Dataset Version Zip to Domestic-trash-2 in yolov8:: 100%|██████████| 508/508 [00:00<00:00, 4415.60it/s]  -> Downloading Tra
loading Roboflow workspace...

loading Roboflow project...
Downloading Dataset Version Zip in Domestic-Trash--1 to yolov8:: 100%|██████████| 399716/399716 [00:07<00:00, 51102.31it/s]

Extracting Dataset Version Zip to Domestic-Trash--1 in yolov8:: 100%|██████████| 508/508 [00:01<00:00, 367.97it/s]
```

Process dataset

```
all_data = []

def process_yolo_folder(path, label, data_list):
    """Processes folders with train/valid/test subdirectories."""
    if path is None: return # Skip if a dataset failed to download
    for split in ["train", "valid", "test"]:
        image_path = os.path.join(path, f"{split}/images")
        print(f"  -> Processing: {image_path} for label: {label}")
        try:
            if not os.path.exists(image_path):
                print(f"    --> WARNING: Path does not exist. Skipping.")
                continue
            for img_file in os.listdir(image_path):
                if img_file.lower().endswith(('.png', '.jpg', '.jpeg')):
                    data_list.append({'filepath': os.path.join(image_path, img_file), 'label': label})
        except Exception as e:
            print(f"    --> ERROR processing {path}: {e}")

# Process majority class datasets
process_yolo_folder(paths.get('graffiti'), "Vandalism_Graffiti", all_data)
process_yolo_folder(paths.get('signs_hind'), "Road_Issues_Damaged_Sign", all_data)
process_yolo_folder(paths.get('concrete'), "Infrastructure_Damage_Concrete", all_data)

# Aggregate original and new datasets for the augmented classes
process_yolo_folder(paths.get('parking_original'), "Parking_Issues_Illegal_Parking", all_data)
process_yolo_folder(paths.get('parking_new_1'), "Parking_Issues_Illegal_Parking", all_data)

process_yolo_folder(paths.get('potholes_original'), "Road_Issues_Pothole", all_data)
process_yolo_folder(paths.get('potholes_new_1'), "Road_Issues_Pothole", all_data)

# Correctly combining all three sources for Domestic Trash
process_yolo_folder(paths.get('trash_original'), "Domestic_trash", all_data)
process_yolo_folder(paths.get('trash_new_1'), "Domestic_trash", all_data)

# Create the initial raw DataFrame
df_raw = pd.DataFrame(all_data)

if not df_raw.empty:
    print("\nInitial DataFrame created successfully.")
    print(f"Total raw images found: {len(df_raw)}")
    print("\n New (Imbalanced) Label Distribution:")
    print(df_raw['label'].value_counts())
else:
    print("\nError: No data was loaded. Please check the download paths.")
```

```
  -> Processing: /content/Graffiti-1/train/images for label: Vandalism_Graffiti
  -> Processing: /content/Graffiti-1/valid/images for label: Vandalism_Graffiti
  -> Processing: /content/Graffiti-1/test/images for label: Vandalism_Graffiti
  -> Processing: /content/damaged-signs-Hind-2/train/images for label: Road_Issues_Damaged_Sign
  -> Processing: /content/damaged-signs-Hind-2/valid/images for label: Road_Issues_Damaged_Sign
  -> Processing: /content/damaged-signs-Hind-2/test/images for label: Road_Issues_Damaged_Sign
  -> Processing: /content/concrete-3/train/images for label: Infrastructure_Damage_Concrete
  -> Processing: /content/concrete-3/valid/images for label: Infrastructure_Damage_Concrete
  -> Processing: /content/concrete-3/test/images for label: Infrastructure_Damage_Concrete
  -> Processing: /content/Illegal-Parking-5/train/images for label: Parking_Issues_Illegal_Parking
  -> Processing: /content/Illegal-Parking-5/valid/images for label: Parking_Issues_Illegal_Parking
  -> Processing: /content/Illegal-Parking-5/test/images for label: Parking_Issues_Illegal_Parking
  -> Processing: /content/illegal-parking-1/train/images for label: Parking_Issues_Illegal_Parking
  -> Processing: /content/illegal-parking-1/valid/images for label: Parking_Issues_Illegal_Parking
  -> Processing: /content/illegal-parking-1/test/images for label: Parking_Issues_Illegal_Parking
  -> Processing: /content/Road-holes-1/train/images for label: Road_Issues_Pothole
  -> Processing: /content/Road-holes-1/valid/images for label: Road_Issues_Pothole
  -> Processing: /content/Road-holes-1/test/images for label: Road_Issues_Pothole
  -> Processing: /content/pothole-ek-1/train/images for label: Road_Issues_Pothole
  -> Processing: /content/pothole-ek-1/valid/images for label: Road_Issues_Pothole
  -> Processing: /content/pothole-ek-1/test/images for label: Road_Issues_Pothole
  -> Processing: /content/Domestic-trash-2/train/images for label: Domestic_trash
  -> Processing: /content/Domestic-trash-2/valid/images for label: Domestic_trash
  -> Processing: /content/Domestic-trash-2/test/images for label: Domestic_trash
  -> Processing: /content/Domestic-Trash--1/train/images for label: Domestic_trash
  -> Processing: /content/Domestic-Trash--1/valid/images for label: Domestic_trash
  -> Processing: /content/Domestic-Trash--1/test/images for label: Domestic_trash

Initial DataFrame created successfully.
```

```
Total raw images found: 8946

 New (Imbalanced) Label Distribution:
label
Road_Issues_Damaged_Sign          2409
Parking_Issues_Illegal_Parking    2217
Vandalism_Graffiti                2128
Infrastructure_Damage_Concrete     990
Road_Issues_Pothole                706
Domestic_trash                     496
Name: count, dtype: int64
```

Balanced using oversampling

```
if not df_raw.empty:
    # Find the size of the largest class from our newly aggregated data
    max_size = df_raw['label'].value_counts().max()
    print(f" Target size for each class (based on the largest) will be: {max_size}")

    # Use scikit-learn's resample() to perform oversampling
    df_balanced_list = []
    for class_label in df_raw['label'].unique():
        df_class = df_raw[df_raw['label'] == class_label]

        # If the class is already the largest, no need to resample, just add it
        if len(df_class) == max_size:
            df_balanced_list.append(df_class)
            continue

        df_class_oversampled = resample(df_class,
                                        replace=True,     # Create copies of images
                                        n_samples=max_size,
                                        random_state=42)  # for reproducibility
        df_balanced_list.append(df_class_oversampled)

    # Combine the oversampled classes into a single, balanced DataFrame
    df_balanced = pd.concat(df_balanced_list)

    print("\n New balanced label distribution:")
    print(df_balanced['label'].value_counts())
    print(f"\nTotal images for training after balancing: {len(df_balanced)}")
else:
    print("\nSkipping balancing because the initial dataframe is empty.")
```

```
 Target size for each class (based on the largest) will be: 2409

 New balanced label distribution:
label
Vandalism_Graffiti                2409
Road_Issues_Damaged_Sign          2409
Infrastructure_Damage_Concrete    2409
Parking_Issues_Illegal_Parking    2409
Road_Issues_Pothole               2409
Domestic_trash                    2409
Name: count, dtype: int64

Total images for training after balancing: 14454
```

ANONYMIZE DATA

```
import cv2
import numpy as np
import os

# --- Face Detector Setup ---
face_cascade_file = 'haarcascade_frontalface_default.xml'
if not os.path.exists(face_cascade_file):
    print("Downloading face detector model...")
    !wget -q https://raw.githubusercontent.com/opencv/opencv/master/data/haarcascades/haarcascade_frontalface_default.xml

# --- License Plate Detector Setup ---
plate_cascade_file = 'haarcascade_russian_plate_number.xml'
if not os.path.exists(plate_cascade_file):
```

```
    print("Downloading license plate detector model...")
    !wget -q https://raw.githubusercontent.com/opencv/opencv/master/data/haarcascades/haarcascade_russian_plate_number.xml

# Load both cascade classifiers
face_cascade = cv2.CascadeClassifier(face_cascade_file)
plate_cascade = cv2.CascadeClassifier(plate_cascade_file)
print("Face and license plate detectors loaded.")

def anonymize_image(img_array):
    """
    Takes a NumPy array of an image, finds faces AND license plates, blurs them,
    and returns the anonymized image array.
    """
    # Convert image to BGR for OpenCV processing
    img_bgr = cv2.cvtColor(img_array.astype(np.uint8), cv2.COLOR_RGB2BGR)
    gray = cv2.cvtColor(img_bgr, cv2.COLOR_BGR2GRAY)

    # --- 1. Detect and blur faces ---
    faces = face_cascade.detectMultiScale(gray, 1.1, 4)
    for (x, y, w, h) in faces:
        face_roi = img_bgr[y:y+h, x:x+w]
        blurred_face = cv2.GaussianBlur(face_roi, (99, 99), 30)
        img_bgr[y:y+h, x:x+w] = blurred_face

    # --- 2. Detect and blur license plates ---
    plates = plate_cascade.detectMultiScale(gray, 1.1, 4)
    for (x, y, w, h) in plates:
        plate_roi = img_bgr[y:y+h, x:x+w]
        blurred_plate = cv2.GaussianBlur(plate_roi, (99, 99), 30)
        img_bgr[y:y+h, x:x+w] = blurred_plate

    # Convert back to RGB and cast to float32 for the ImageDataGenerator
    # THIS IS THE CORRECTED LINE
    return cv2.cvtColor(img_bgr, cv2.COLOR_BGR2RGB).astype(np.float32)
```

```
Downloading face detector model...
Downloading license plate detector model...
Face and license plate detectors loaded.
```

```
from google.colab import files
import matplotlib.pyplot as plt
import cv2
import numpy as np

# A check to ensure the anonymize_image function is available
if 'anonymize_image' not in locals():
    print(" Error: The 'anonymize_image' function cell was not run. Please run it first.")
else:
    print("Please upload up to 3 images with faces or license plates to test anonymization.")
    # Upload files from your local drive
    uploaded = files.upload()

    # Process and display each uploaded image
    for filename in uploaded.keys():
        print(f"\n--- Processing '{filename}' ---")
        try:
            # Read the uploaded image using OpenCV
            img_data = uploaded[filename]
            img_array = np.frombuffer(img_data, np.uint8)
            img_bgr = cv2.imdecode(img_array, cv2.IMREAD_COLOR)

            # Convert from BGR (OpenCV default) to RGB for our function and Matplotlib
            img_rgb = cv2.cvtColor(img_bgr, cv2.COLOR_BGR2RGB)

            # Run the anonymization function
            anonymized_rgb = anonymize_image(img_rgb)

            # Display side-by-side for comparison
            plt.figure(figsize=(10, 5))

            # Original Image
            plt.subplot(1, 2, 1)
            plt.imshow(img_rgb)
            plt.title("Original Image")
            plt.axis('off')

            # Anonymized Image
```

```
        plt.subplot(1, 2, 2)
        # Convert the float array back to uint8 for correct display
        plt.imshow(anonymized_rgb.astype(np.uint8))
        plt.title("Anonymized Image")
        plt.axis('off')

        plt.show()

    except Exception as e:
        print(f"Could not process image {filename}. Error: {e}")
```

```
Please upload up to 3 images with faces or license plates to test anonymization.
```
Choose Files No file chosen Upload widget is only available when the cell has been executed in the current browser session. Please rerun this cell to enable.

```
Saving driving-highway.jpg to driving-highway.jpg
Saving NumberPlates-scaled.jpeg to NumberPlates-scaled (3).jpeg
Saving pexels-simon-robben-55958-614810.jpg to pexels-simon-robben-55958-614810 (2).jpg

--- Processing 'driving-highway.jpg' ---
```

Original Image

Anonymized Image

```
--- Processing 'NumberPlates-scaled (3).jpeg' ---
```

Original Image

Anonymized Image

```
--- Processing 'pexels-simon-robben-55958-614810 (2).jpg' ---
```

Original Image

Anonymized Image

PREPARE DATA FOR TRAINING

```
print("\nSplitting data into Train, Validation, and Test sets...")

# First, split the balanced data into a 90% block (for training+validation) and a 10% block (for testing)
train_val_df, test_df = train_test_split(
```

```
    df_balanced,
    test_size=0.10, # 10% for the final test set
    random_state=42,
    stratify=df_balanced['label']
)

# Next, split the 90% block into training and validation sets.
train_df, val_df = train_test_split(
    train_val_df,
    test_size=0.111, # This makes the validation set ~10% of the original total data
    random_state=42,
    stratify=train_val_df['label']
)

print(f"\nTotal balanced samples: {len(df_balanced)}")
print(f" -> Training samples:   {len(train_df)}")
print(f" -> Validation samples: {len(val_df)}")
print(f" -> Test samples:       {len(test_df)}")

# Create Data Generators with Augmentation and our Anonymization function
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',
    preprocessing_function=anonymize_image
)

val_test_datagen = ImageDataGenerator(
    rescale=1./255,
    preprocessing_function=anonymize_image
)

IMG_SIZE = (128, 128)
BATCH_SIZE = 64

# Create all three generators
train_generator = train_datagen.flow_from_dataframe(
    dataframe=train_df,
    x_col='filepath',
    y_col='label',
    target_size=IMG_SIZE,
    batch_size=BATCH_SIZE,
    class_mode='categorical',
    shuffle=True
)

validation_generator = val_test_datagen.flow_from_dataframe(
    dataframe=val_df,
    x_col='filepath',
    y_col='label',
    target_size=IMG_SIZE,
    batch_size=BATCH_SIZE,
    class_mode='categorical',
    shuffle=False
)

test_generator = val_test_datagen.flow_from_dataframe(
    dataframe=test_df,
    x_col='filepath',
    y_col='label',
    target_size=IMG_SIZE,
    batch_size=BATCH_SIZE,
    class_mode='categorical',
    shuffle=False
)
print("\nTrain, Validation, and Test generators created successfully with anonymization.")


# --- EXPORT THE DATAFRAME SPLITS TO CSV FILES ---
# This part goes at the end of this cell because it needs train_df, val_df, and test_df.
print("\nExporting DataFrame splits to CSV files...")
try:
```

```
    train_df.to_csv('train.csv', index=False)
    val_df.to_csv('validate.csv', index=False)
    test_df.to_csv('test.csv', index=False)
    print("train.csv, validate.csv, and test.csv have been created successfully.")
except Exception as e:
    print(f"Error exporting to CSV: {e}")
```

```
 Splitting data into Train, Validation, and Test sets...

 Total balanced samples: 14454
  -> Training samples:   11564
  -> Validation samples: 1444
  -> Test samples:       1446
 Found 11564 validated image filenames belonging to 6 classes.
 Found 1444 validated image filenames belonging to 6 classes.
 Found 1446 validated image filenames belonging to 6 classes.

 Train, Validation, and Test generators created successfully with anonymization.

 Exporting DataFrame splits to CSV files...
 train.csv, validate.csv, and test.csv have been created successfully.
```

BUILD AND COMPILE THE MODEL

```
if 'train_generator' in locals():
    print("\n  Building the CNN Model...")

    num_classes = len(df_balanced['label'].unique())
    print(f"Number of classes for output layer: {num_classes}")

    model = tf.keras.models.Sequential([
        # First Convolutional Block
        tf.keras.layers.Conv2D(32, (3, 3), activation='relu', input_shape=(128, 128, 3)),
        tf.keras.layers.MaxPooling2D(2, 2),

        # Second Convolutional Block
        tf.keras.layers.Conv2D(64, (3, 3), activation='relu'),
        tf.keras.layers.MaxPooling2D(2, 2),

        # Third Convolutional Block
        tf.keras.layers.Conv2D(128, (3, 3), activation='relu'),
        tf.keras.layers.MaxPooling2D(2, 2),

        # Dense Layers
        tf.keras.layers.Flatten(),
        tf.keras.layers.Dense(512, activation='relu'),
        tf.keras.layers.Dropout(0.5), # Dropout for regularization
        tf.keras.layers.Dense(num_classes, activation='softmax') # Softmax for multi-class
    ])

    model.compile(
        optimizer=tf.keras.optimizers.Adam(learning_rate=0.001),
        loss='categorical_crossentropy',
        metrics=['accuracy']
    )

    model.summary()
else:
    print("\nSkipping model building because data generators are not ready.")
```

```
  Building the CNN Model...
Number of classes for output layer: 6
Do not pass an `input_shape`/`input_dim` argument to a layer. When using Sequential models, prefer using an `Input(shape)` object as the
```

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, 512)	12,845,568
dropout_2 (Dropout)	(None, 512)	0
dense_5 (Dense)	(None, 6)	3,078

Total params: 12,941,894 (49.37 MB)

train model

```
if 'model' in locals():
    print("\nStarting Model Training...")

    # Callbacks for smarter training
    callbacks = [
        tf.keras.callbacks.EarlyStopping(monitor='val_loss', patience=5, restore_best_weights=True),
        tf.keras.callbacks.ModelCheckpoint('MlArtist_model.h5', monitor='val_accuracy', save_best_only=True, mode='max'),
        tf.keras.callbacks.ReduceLROnPlateau(monitor='val_loss', factor=0.2, patience=3, min_lr=1e-6)
    ]

    EPOCHS = 30 # Train epochs

    history = model.fit(
        train_generator,
        epochs=EPOCHS,
        validation_data=validation_generator,
        callbacks=callbacks
    )

else:
    print("\nSkipping training because the model was not built.")
```

```
Starting Model Training...
Your `PyDataset` class should call `super().__init__(**kwargs)` in its constructor. `**kwargs` can include `workers`, `use_multiproces
Epoch 1/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 0s 1s/step - accuracy: 0.4797 - loss: 1.3166WARNING:absl:You are saving your model as an HDF5 file via `m
181/181 ━━━━━━━━━━━━━━━━━━━━ 302s 2s/step - accuracy: 0.4804 - loss: 1.3149 - val_accuracy: 0.7735 - val_loss: 0.6322 - learning_rate:
Epoch 2/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 0s 1s/step - accuracy: 0.7471 - loss: 0.6798WARNING:absl:You are saving your model as an HDF5 file via `m
181/181 ━━━━━━━━━━━━━━━━━━━━ 288s 2s/step - accuracy: 0.7472 - loss: 0.6796 - val_accuracy: 0.8075 - val_loss: 0.5463 - learning_rate:
Epoch 3/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 299s 2s/step - accuracy: 0.7989 - loss: 0.5535 - val_accuracy: 0.7964 - val_loss: 0.6185 - learning_rate:
Epoch 4/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 0s 1s/step - accuracy: 0.8157 - loss: 0.5096WARNING:absl:You are saving your model as an HDF5 file via `m
181/181 ━━━━━━━━━━━━━━━━━━━━ 283s 2s/step - accuracy: 0.8157 - loss: 0.5096 - val_accuracy: 0.8456 - val_loss: 0.4615 - learning_rate:
Epoch 5/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 283s 2s/step - accuracy: 0.8572 - loss: 0.4026 - val_accuracy: 0.8338 - val_loss: 0.4382 - learning_rate:
Epoch 6/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 274s 2s/step - accuracy: 0.8645 - loss: 0.3741 - val_accuracy: 0.8206 - val_loss: 0.5939 - learning_rate:
Epoch 7/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 0s 1s/step - accuracy: 0.8782 - loss: 0.3482WARNING:absl:You are saving your model as an HDF5 file via `m
181/181 ━━━━━━━━━━━━━━━━━━━━ 281s 2s/step - accuracy: 0.8782 - loss: 0.3481 - val_accuracy: 0.8760 - val_loss: 0.3741 - learning_rate:
Epoch 8/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 0s 1s/step - accuracy: 0.8785 - loss: 0.3322WARNING:absl:You are saving your model as an HDF5 file via `m
181/181 ━━━━━━━━━━━━━━━━━━━━ 287s 2s/step - accuracy: 0.8785 - loss: 0.3322 - val_accuracy: 0.8774 - val_loss: 0.3936 - learning_rate:
Epoch 9/30
```

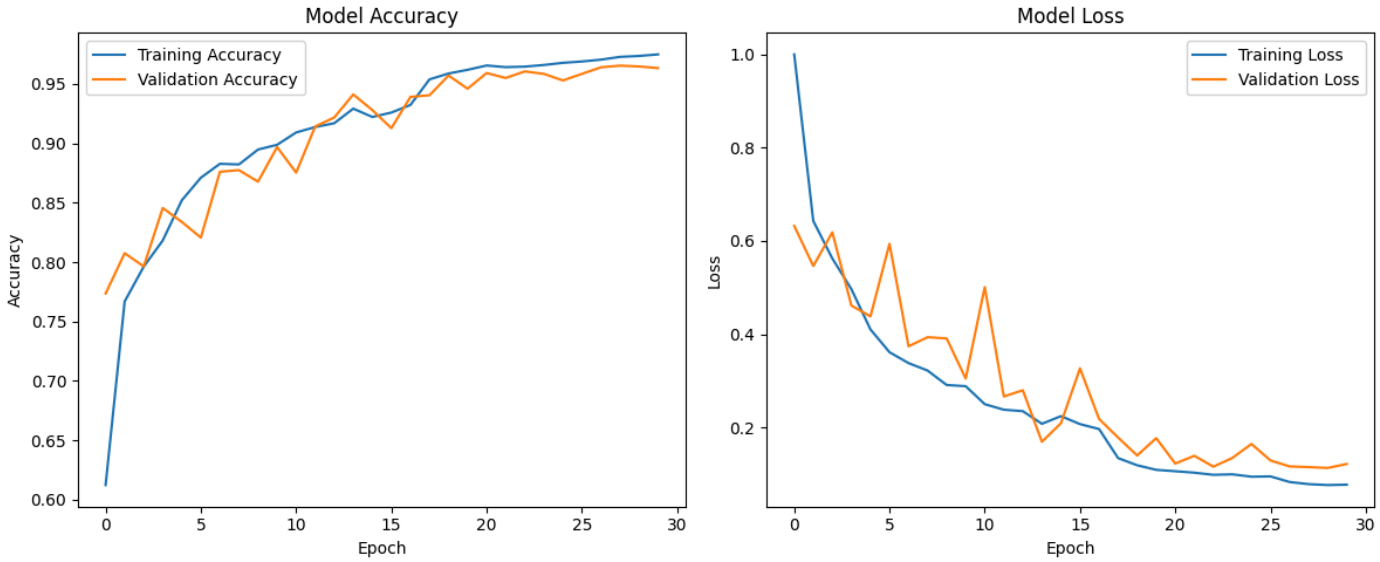
```
181/181 ━━━━━━━━━━━━━━━━━━━━ 308s 2s/step - accuracy: 0.8976 - loss: 0.2871 - val_accuracy: 0.8677 - val_loss: 0.3910 - learning_rate:
Epoch 10/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 0s 1s/step - accuracy: 0.9026 - loss: 0.2844WARNING:absl:You are saving your model as an HDF5 file via `m
181/181 ━━━━━━━━━━━━━━━━━━━━ 292s 2s/step - accuracy: 0.9026 - loss: 0.2845 - val_accuracy: 0.8968 - val_loss: 0.3049 - learning_rate:
Epoch 11/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 284s 2s/step - accuracy: 0.9012 - loss: 0.2610 - val_accuracy: 0.8753 - val_loss: 0.5010 - learning_rate:
Epoch 12/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 0s 1s/step - accuracy: 0.9125 - loss: 0.2431WARNING:absl:You are saving your model as an HDF5 file via `m
181/181 ━━━━━━━━━━━━━━━━━━━━ 295s 2s/step - accuracy: 0.9125 - loss: 0.2431 - val_accuracy: 0.9141 - val_loss: 0.2665 - learning_rate:
Epoch 13/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 0s 1s/step - accuracy: 0.9166 - loss: 0.2359WARNING:absl:You are saving your model as an HDF5 file via `m
181/181 ━━━━━━━━━━━━━━━━━━━━ 296s 2s/step - accuracy: 0.9166 - loss: 0.2359 - val_accuracy: 0.9217 - val_loss: 0.2798 - learning_rate:
Epoch 14/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 0s 1s/step - accuracy: 0.9301 - loss: 0.2135WARNING:absl:You are saving your model as an HDF5 file via `m
181/181 ━━━━━━━━━━━━━━━━━━━━ 275s 2s/step - accuracy: 0.9301 - loss: 0.2134 - val_accuracy: 0.9411 - val_loss: 0.1693 - learning_rate:
Epoch 15/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 325s 2s/step - accuracy: 0.9255 - loss: 0.2104 - val_accuracy: 0.9280 - val_loss: 0.2092 - learning_rate:
Epoch 16/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 297s 2s/step - accuracy: 0.9280 - loss: 0.2017 - val_accuracy: 0.9127 - val_loss: 0.3267 - learning_rate:
Epoch 17/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 285s 2s/step - accuracy: 0.9239 - loss: 0.2189 - val_accuracy: 0.9391 - val_loss: 0.2183 - learning_rate:
Epoch 18/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 277s 2s/step - accuracy: 0.9507 - loss: 0.1400 - val_accuracy: 0.9404 - val_loss: 0.1784 - learning_rate:
Epoch 19/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 0s 1s/step - accuracy: 0.9597 - loss: 0.1192WARNING:absl:You are saving your model as an HDF5 file via `m
181/181 ━━━━━━━━━━━━━━━━━━━━ 298s 2s/step - accuracy: 0.9597 - loss: 0.1192 - val_accuracy: 0.9571 - val_loss: 0.1400 - learning_rate:
Epoch 20/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 295s 2s/step - accuracy: 0.9588 - loss: 0.1168 - val_accuracy: 0.9460 - val_loss: 0.1771 - learning_rate:
Epoch 21/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 0s 1s/step - accuracy: 0.9657 - loss: 0.1086WARNING:absl:You are saving your model as an HDF5 file via `m
181/181 ━━━━━━━━━━━━━━━━━━━━ 276s 2s/step - accuracy: 0.9657 - loss: 0.1086 - val_accuracy: 0.9591 - val_loss: 0.1226 - learning_rate:
Epoch 22/30
181/181 ━━━━━━━━━━━━━━━━━━━━ 276s 2s/step - accuracy: 0.9645 - loss: 0.1041 - val_accuracy: 0.9550 - val_loss: 0.1302 - learning_rate:
```

EVALUATE AND VISUALIZE

```
from sklearn.metrics import classification_report

if 'history' in locals():
    print("\nPlotting training history...")

    plt.figure(figsize=(12, 5))

    # Plot Accuracy
    plt.subplot(1, 2, 1)
    plt.plot(history.history['accuracy'], label='Training Accuracy')
    plt.plot(history.history['val_accuracy'], label='Validation Accuracy')
    plt.title('Model Accuracy')
    plt.xlabel('Epoch')
    plt.ylabel('Accuracy')
    plt.legend()

    # Plot Loss
    plt.subplot(1, 2, 2)
    plt.plot(history.history['loss'], label='Training Loss')
    plt.plot(history.history['val_loss'], label='Validation Loss')
    plt.title('Model Loss')
    plt.xlabel('Epoch')
    plt.ylabel('Loss')
    plt.legend()

    plt.tight_layout()
    plt.show()

    # --- Final evaluation on the UNSEEN TEST DATA ---
    print("\nFinal evaluation on the unseen Test data:")
    # Load the best performing model saved by ModelCheckpoint
    best_model = tf.keras.models.load_model('MlArtist_model.h5')

    # Evaluate using the test_generator
    test_loss, test_accuracy = best_model.evaluate(test_generator, verbose=0)
    print(f"  -> Test Accuracy: {test_accuracy*100:.2f}%")
    print(f"  -> Test Loss: {test_loss:.4f}")

    # --- Classification Report on the UNSEEN TEST DATA ---
    print("\nClassification Report on Test Data:")
    # Get predictions from the test generator
```

```
    y_pred = best_model.predict(test_generator)
    y_pred_classes = np.argmax(y_pred, axis=1)

    # Get true labels from the test generator
    y_true = test_generator.classes

    # Get class labels
    class_labels = list(test_generator.class_indices.keys())

    print(classification_report(y_true, y_pred_classes, target_names=class_labels))

else:
    print("\nSkipping evaluation because training was not completed.")
```

```
Plotting training history...
```




```
WARNING:absl:Compiled the loaded model, but the compiled metrics have yet to be built. `model.compile_metrics` will be empty until you t

Final evaluation on the unseen Test data:
Your `PyDataset` class should call `super().__init__(**kwargs)` in its constructor. `**kwargs` can include `workers`, `use_multiprocessi
  -> Test Accuracy: 97.72%
  -> Test Loss: 0.0730

Classification Report on Test Data:
23/23 ━━━━━━━━━━━━━━━━━━━━ 30s 1s/step
                            precision    recall  f1-score   support

                Domestic_trash       0.99      1.00      1.00       241
Infrastructure_Damage_Concrete       0.97      1.00      0.99       241
Parking_Issues_Illegal_Parking       0.99      0.98      0.99       241
      Road_Issues_Damaged_Sign       1.00      0.97      0.98       241
           Road_Issues_Pothole       0.96      0.98      0.97       241
            Vandalism_Graffiti       0.95      0.94      0.95       241

                      accuracy                           0.98      1446
                     macro avg       0.98      0.98      0.98      1446
                  weighted avg       0.98      0.98      0.98      1446
```

save model as pickle

```
import pickle


pickle_filename = 'MlArtist_FinalModel.pkl'

print(f"Saving model to {pickle_filename}...")

with open(pickle_filename, 'wb') as file:
```

```
    pickle.dump(best_model, file)

print(" Model successfully saved as a pickle file.")
```

```
Saving model to MlArtist_FinalModel.pkl...
 Model successfully saved as a pickle file.
```

prediction

```
import pickle

# --- Load Model from Pickle File ---
try:
    # Define the pickle filename
    pickle_filename = 'MlArtist_FinalModel.pkl'
    print(f"Loading model from {pickle_filename}...")

    # Open the file in read-binary mode and load the model
    with open(pickle_filename, 'rb') as file:
        best_model = pickle.load(file)

    print(" Best trained model loaded successfully from pickle file.")
except Exception as e:
    print(f" Error loading model from pickle file: {e}")
    best_model = None


# --- Prediction Function ---
# This function uses the global 'anonymize_image' function defined in a previous cell.
def predict_on_upload(model_to_use, train_gen):
    if model_to_use is None:
        print("Model is not loaded. Cannot predict.")
        return

    # Create the label map from the training generator
    class_indices = train_gen.class_indices
    labels_map = {v: k for k, v in class_indices.items()}

    # Upload files
    uploaded = files.upload()
    for filename in uploaded.keys():
        print(f"\n--- Analyzing '{filename}' ---")
        try:
            # Load the image for processing
            img = tf.keras.preprocessing.image.load_img(filename, target_size=(128, 128))
            img_array_rgb = tf.keras.preprocessing.image.img_to_array(img)

            # Anonymize the image using our function (which returns a float32 array)
            anonymized_array_float = anonymize_image(img_array_rgb)

            # Prepare the image for the model (rescale and add batch dimension)
            img_batch = np.expand_dims(anonymized_array_float, axis=0)
            img_preprocessed = img_batch / 255.0  # Rescale float[0,255] to float[0,1]

            # Make the prediction
            prediction = model_to_use.predict(img_preprocessed)

            predicted_index = np.argmax(prediction[0])
            predicted_label = labels_map[predicted_index]
            confidence = np.max(prediction[0]) * 100

            main_category, sub_category = predicted_label.split('_', 1)

            # --- Display the results ---
            print("\n Anonymized Input Image:")

            # For display, convert the float array back to a uint8 BGR image for cv2_imshow
            display_img_uint8 = anonymized_array_float.astype(np.uint8)
            display_img_bgr = cv2.cvtColor(display_img_uint8, cv2.COLOR_RGB2BGR)
            cv2_imshow(display_img_bgr)

            print(f"\n Prediction Result:")
            print(f"  - Main Category: {main_category}")
            print(f"  - Sub Category:  {sub_category.replace('_', ' ')}")
```

```
            print(f"  - Confidence:    {confidence:.2f}%")

        except Exception as e:
            print(f"Error processing {filename}: {e}")


# --- Run Prediction ---
# This check ensures that the model has been loaded and the generators exist
if 'best_model' in locals() and best_model is not None and 'train_generator' in locals():
    print("\nReady to predict! Use the button below to upload an image.")
    predict_on_upload(best_model, train_generator)
else:
    print("\nCannot run prediction. Ensure the model was trained and data generators were created.")


# --- Load Model from Pickle File ---
try:
    # Define the pickle filename
    pickle_filename = 'MlArtist_FinalModel.pkl'
    print(f"Loading model from {pickle_filename}...")

    # Open the file in read-binary mode and load the model
    with open(pickle_filename, 'rb') as file:
        best_model = pickle.load(file)

    print(" Best trained model loaded successfully from pickle file.")
except Exception as e:
    print(f" Error loading model from pickle file: {e}")
    best_model = None


# --- Prediction Function ---
# This function uses the global 'anonymize_image' function defined in a previous cell.
def predict_on_upload(model_to_use, train_gen):
    if model_to_use is None:
        print("Model is not loaded. Cannot predict.")
        return

    # Create the label map from the training generator
    class_indices = train_gen.class_indices
    labels_map = {v: k for k, v in class_indices.items()}

    # Upload files
    uploaded = files.upload()
    for filename in uploaded.keys():
        print(f"\n--- Analyzing '{filename}' ---")
        try:
            # Load the image for processing
            img = tf.keras.preprocessing.image.load_img(filename, target_size=(128, 128))
            img_array_rgb = tf.keras.preprocessing.image.img_to_array(img)

            # Anonymize the image using our function (which returns a float32 array)
            anonymized_array_float = anonymize_image(img_array_rgb)

            # Prepare the image for the model (rescale and add batch dimension)
            img_batch = np.expand_dims(anonymized_array_float, axis=0)
            img_preprocessed = img_batch / 255.0  # Rescale float[0,255] to float[0,1]

            # Make the prediction
            prediction = model_to_use.predict(img_preprocessed)

            predicted_index = np.argmax(prediction[0])
            predicted_label = labels_map[predicted_index]
            confidence = np.max(prediction[0]) * 100

            main_category, sub_category = predicted_label.split('_', 1)

            # --- Display the results ---
            print("\n Anonymized Input Image:")

            # For display, convert the float array back to a uint8 BGR image for cv2_imshow
            display_img_uint8 = anonymized_array_float.astype(np.uint8)
            display_img_bgr = cv2.cvtColor(display_img_uint8, cv2.COLOR_RGB2BGR)
            cv2_imshow(display_img_bgr)

            print(f"\n Prediction Result:")
            print(f"  - Main Category: {main_category}")
```

```
            print(f"  - Sub Category:  {sub_category.replace('_', ' ')}")
            print(f"  - Confidence:    {confidence:.2f}%")

        except Exception as e:
            print(f"Error processing {filename}: {e}")


# --- Run Prediction ---
# This check ensures that the model has been loaded and the generators exist
if 'best_model' in locals() and best_model is not None and 'train_generator' in locals():
    print("\nReady to predict! Use the button below to upload an image.")
    predict_on_upload(best_model, train_generator)
else:
    print("\nCannot run prediction. Ensure the model was trained and data generators were created.")


# --- Load Model from Pickle File ---
try:
    # Define the pickle filename
    pickle_filename = 'MlArtist_FinalModel.pkl'
    print(f"Loading model from {pickle_filename}...")

    # Open the file in read-binary mode and load the model
    with open(pickle_filename, 'rb') as file:
        best_model = pickle.load(file)

    print(" Best trained model loaded successfully from pickle file.")
except Exception as e:
    print(f" Error loading model from pickle file: {e}")
    best_model = None


# --- Prediction Function ---
# This function uses the global 'anonymize_image' function defined in a previous cell.
def predict_on_upload(model_to_use, train_gen):
    if model_to_use is None:
        print("Model is not loaded. Cannot predict.")
        return

    # Create the label map from the training generator
    class_indices = train_gen.class_indices
    labels_map = {v: k for k, v in class_indices.items()}

    # Upload files
    uploaded = files.upload()
    for filename in uploaded.keys():
        print(f"\n--- Analyzing '{filename}' ---")
        try:
            # Load the image for processing
            img = tf.keras.preprocessing.image.load_img(filename, target_size=(128, 128))
            img_array_rgb = tf.keras.preprocessing.image.img_to_array(img)

            # Anonymize the image using our function (which returns a float32 array)
            anonymized_array_float = anonymize_image(img_array_rgb)

            # Prepare the image for the model (rescale and add batch dimension)
            img_batch = np.expand_dims(anonymized_array_float, axis=0)
            img_preprocessed = img_batch / 255.0  # Rescale float[0,255] to float[0,1]

            # Make the prediction
            prediction = model_to_use.predict(img_preprocessed)

            predicted_index = np.argmax(prediction[0])
            predicted_label = labels_map[predicted_index]
            confidence = np.max(prediction[0]) * 100

            main_category, sub_category = predicted_label.split('_', 1)

            # --- Display the results ---
            print("\n Anonymized Input Image:")

            # For display, convert the float array back to a uint8 BGR image for cv2_imshow
            display_img_uint8 = anonymized_array_float.astype(np.uint8)
            display_img_bgr = cv2.cvtColor(display_img_uint8, cv2.COLOR_RGB2BGR)
            cv2_imshow(display_img_bgr)

            print(f"\n Prediction Result:")
```

```
            print(f"  - Main Category: {main_category}")
            print(f"  - Sub Category:  {sub_category.replace('_', ' ')}")
            print(f"  - Confidence:    {confidence:.2f}%")

        except Exception as e:
            print(f"Error processing {filename}: {e}")


# --- Run Prediction ---
# This check ensures that the model has been loaded and the generators exist
if 'best_model' in locals() and best_model is not None and 'train_generator' in locals():
    print("\nReady to predict! Use the button below to upload an image.")
    predict_on_upload(best_model, train_generator)
else:
    print("\nCannot run prediction. Ensure the model was trained and data generators were created.")


# --- Load Model from Pickle File ---
try:
    # Define the pickle filename
    pickle_filename = 'MlArtist_FinalModel.pkl'
    print(f"Loading model from {pickle_filename}...")

    # Open the file in read-binary mode and load the model
    with open(pickle_filename, 'rb') as file:
        best_model = pickle.load(file)

    print(" Best trained model loaded successfully from pickle file.")
except Exception as e:
    print(f" Error loading model from pickle file: {e}")
    best_model = None


# --- Prediction Function ---
# This function uses the global 'anonymize_image' function defined in a previous cell.
def predict_on_upload(model_to_use, train_gen):
    if model_to_use is None:
        print("Model is not loaded. Cannot predict.")
        return

    # Create the label map from the training generator
    class_indices = train_gen.class_indices
    labels_map = {v: k for k, v in class_indices.items()}

    # Upload files
    uploaded = files.upload()
    for filename in uploaded.keys():
        print(f"\n--- Analyzing '{filename}' ---")
        try:
            # Load the image for processing
            img = tf.keras.preprocessing.image.load_img(filename, target_size=(128, 128))
            img_array_rgb = tf.keras.preprocessing.image.img_to_array(img)

            # Anonymize the image using our function (which returns a float32 array)
            anonymized_array_float = anonymize_image(img_array_rgb)

            # Prepare the image for the model (rescale and add batch dimension)
            img_batch = np.expand_dims(anonymized_array_float, axis=0)
            img_preprocessed = img_batch / 255.0  # Rescale float[0,255] to float[0,1]

            # Make the prediction
            prediction = model_to_use.predict(img_preprocessed)

            predicted_index = np.argmax(prediction[0])
            predicted_label = labels_map[predicted_index]
            confidence = np.max(prediction[0]) * 100

            main_category, sub_category = predicted_label.split('_', 1)

            # --- Display the results ---
            print("\n Anonymized Input Image:")

            # For display, convert the float array back to a uint8 BGR image for cv2_imshow
            display_img_uint8 = anonymized_array_float.astype(np.uint8)
            display_img_bgr = cv2.cvtColor(display_img_uint8, cv2.COLOR_RGB2BGR)
            cv2_imshow(display_img_bgr)

            print(f"\n Prediction Result:")
```

```
            print(f"  - Main Category: {main_category}")
            print(f"  - Sub Category:  {sub_category.replace('_', ' ')}")
            print(f"  - Confidence:    {confidence:.2f}%")

        except Exception as e:
            print(f"Error processing {filename}: {e}")


# --- Run Prediction ---
# This check ensures that the model has been loaded and the generators exist
if 'best_model' in locals() and best_model is not None and 'train_generator' in locals():
    print("\nReady to predict! Use the button below to upload an image.")
    predict_on_upload(best_model, train_generator)
else:
    print("\nCannot run prediction. Ensure the model was trained and data generators were created.")


# --- Load Model from Pickle File ---
try:
    # Define the pickle filename
    pickle_filename = 'MlArtist_FinalModel.pkl'
    print(f"Loading model from {pickle_filename}...")

    # Open the file in read-binary mode and load the model
    with open(pickle_filename, 'rb') as file:
        best_model = pickle.load(file)

    print(" Best trained model loaded successfully from pickle file.")
except Exception as e:
    print(f" Error loading model from pickle file: {e}")
    best_model = None


# --- Prediction Function ---
# This function uses the global 'anonymize_image' function defined in a previous cell.
def predict_on_upload(model_to_use, train_gen):
    if model_to_use is None:
        print("Model is not loaded. Cannot predict.")
        return

    # Create the label map from the training generator
    class_indices = train_gen.class_indices
    labels_map = {v: k for k, v in class_indices.items()}

    # Upload files
    uploaded = files.upload()
    for filename in uploaded.keys():
        print(f"\n--- Analyzing '{filename}' ---")
        try:
            # Load the image for processing
            img = tf.keras.preprocessing.image.load_img(filename, target_size=(128, 128))
            img_array_rgb = tf.keras.preprocessing.image.img_to_array(img)

            # Anonymize the image using our function (which returns a float32 array)
            anonymized_array_float = anonymize_image(img_array_rgb)

            # Prepare the image for the model (rescale and add batch dimension)
            img_batch = np.expand_dims(anonymized_array_float, axis=0)
            img_preprocessed = img_batch / 255.0  # Rescale float[0,255] to float[0,1]

            # Make the prediction
            prediction = model_to_use.predict(img_preprocessed)

            predicted_index = np.argmax(prediction[0])
            predicted_label = labels_map[predicted_index]
            confidence = np.max(prediction[0]) * 100

            main_category, sub_category = predicted_label.split('_', 1)

            # --- Display the results ---
            print("\n Anonymized Input Image:")

            # For display, convert the float array back to a uint8 BGR image for cv2_imshow
            display_img_uint8 = anonymized_array_float.astype(np.uint8)
            display_img_bgr = cv2.cvtColor(display_img_uint8, cv2.COLOR_RGB2BGR)
            cv2_imshow(display_img_bgr)
```

```
            print(f"\n Prediction Result:")
            print(f"  - Main Category: {main_category}")
            print(f"  - Sub Category:  {sub_category.replace('_', ' ')}")
            print(f"  - Confidence:    {confidence:.2f}%")

        except Exception as e:
            print(f"Error processing {filename}: {e}")


# --- Run Prediction ---
# This check ensures that the model has been loaded and the generators exist
if 'best_model' in locals() and best_model is not None and 'train_generator' in locals():
    print("\nReady to predict! Use the button below to upload an image.")
    predict_on_upload(best_model, train_generator)
else:
    print("\nCannot run prediction. Ensure the model was trained and data generators were created.")


# --- Load Model from Pickle File ---
try:
    # Define the pickle filename
    pickle_filename = 'MlArtist_FinalModel.pkl'
    print(f"Loading model from {pickle_filename}...")

    # Open the file in read-binary mode and load the model
    with open(pickle_filename, 'rb') as file:
        best_model = pickle.load(file)

    print(" Best trained model loaded successfully from pickle file.")
except Exception as e:
    print(f" Error loading model from pickle file: {e}")
    best_model = None


# --- Prediction Function ---
# This function uses the global 'anonymize_image' function defined in a previous cell.
def predict_on_upload(model_to_use, train_gen):
    if model_to_use is None:
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        return

    # Create the label map from the training generator
    class_indices = train_gen.class_indices
    labels_map = {v: k for k, v in class_indices.items()}

    # Upload files
    uploaded = files.upload()
    for filename in uploaded.keys():
        print(f"\n--- Analyzing '{filename}' ---")
        try:
            # Load the image for processing
            img = tf.keras.preprocessing.image.load_img(filename, target_size=(128, 128))
            img_array_rgb = tf.keras.preprocessing.image.img_to_array(img)

            # Anonymize the image using our function (which returns a float32 array)
            anonymized_array_float = anonymize_image(img_array_rgb)

            # Prepare the image for the model (rescale and add batch dimension)
            img_batch = np.expand_dims(anonymized_array_float, axis=0)
            img_preprocessed = img_batch / 255.0  # Rescale float[0,255] to float[0,1]

            # Make the prediction
            prediction = model_to_use.predict(img_preprocessed)

            predicted_index = np.argmax(prediction[0])
            predicted_label = labels_map[predicted_index]
            confidence = np.max(prediction[0]) * 100

            main_category, sub_category = predicted_label.split('_', 1)

            # --- Display the results ---
            print("\n Anonymized Input Image:")

            # For display, convert the float array back to a uint8 BGR image for cv2_imshow
            display_img_uint8 = anonymized_array_float.astype(np.uint8)
            display_img_bgr = cv2.cvtColor(display_img_uint8, cv2.COLOR_RGB2BGR)
            cv2_imshow(display_img_bgr)
```

```
            print(f"\n Prediction Result:")
            print(f"  - Main Category: {main_category}")
            print(f"  - Sub Category:  {sub_category.replace('_', ' ')}")
            print(f"  - Confidence:    {confidence:.2f}%")

        except Exception as e:
            print(f"Error processing {filename}: {e}")


# --- Run Prediction ---
# This check ensures that the model has been loaded and the generators exist
if 'best_model' in locals() and best_model is not None and 'train_generator' in locals():
    print("\nReady to predict! Use the button below to upload an image.")
    predict_on_upload(best_model, train_generator)
else:
    print("\nCannot run prediction. Ensure the model was trained and data generators were created.")
```

Default title text

```
# @title Default title text
# --- Load Model from Pickle File ---
try:
    # Define the pickle filename
    pickle_filename = 'MlArtist_FinalModel.pkl'
    print(f"Loading model from {pickle_filename}...")

    # Open the file in read-binary mode and load the model
    with open(pickle_filename, 'rb') as file:
        best_model = pickle.load(file)

    print(" Best trained model loaded successfully from pickle file.")
except Exception as e:
    print(f" Error loading model from pickle file: {e}")
    best_model = None


# --- Prediction Function ---
# This function uses the global 'anonymize_image' function defined in a previous cell.
def predict_on_upload(model_to_use, train_gen):
    if model_to_use is None:
        print("Model is not loaded. Cannot predict.")
        return

    # Create the label map from the training generator
    class_indices = train_gen.class_indices
    labels_map = {v: k for k, v in class_indices.items()}

    # Upload files
    uploaded = files.upload()
    for filename in uploaded.keys():
        print(f"\n--- Analyzing '{filename}' ---")
        try:
            # Load the image for processing
            img = tf.keras.preprocessing.image.load_img(filename, target_size=(128, 128))
            img_array_rgb = tf.keras.preprocessing.image.img_to_array(img)

            # Anonymize the image using our function (which returns a float32 array)
            anonymized_array_float = anonymize_image(img_array_rgb)

            # Prepare the image for the model (rescale and add batch dimension)
            img_batch = np.expand_dims(anonymized_array_float, axis=0)
            img_preprocessed = img_batch / 255.0  # Rescale float[0,255] to float[0,1]

            # Make the prediction
            prediction = model_to_use.predict(img_preprocessed)

            predicted_index = np.argmax(prediction[0])
            predicted_label = labels_map[predicted_index]
            confidence = np.max(prediction[0]) * 100

            main_category, sub_category = predicted_label.split('_', 1)

            # --- Display the results ---
            print("\n Anonymized Input Image:")
```

```
            # For display, convert the float array back to a uint8 BGR image for cv2_imshow
            display_img_uint8 = anonymized_array_float.astype(np.uint8)
            display_img_bgr = cv2.cvtColor(display_img_uint8, cv2.COLOR_RGB2BGR)
            cv2_imshow(display_img_bgr)

            print(f"\n Prediction Result:")
            print(f"  - Main Category: {main_category}")
            print(f"  - Sub Category:  {sub_category.replace('_', ' ')}")
            print(f"  - Confidence:    {confidence:.2f}%")

        except Exception as e:
            print(f"Error processing {filename}: {e}")


# --- Run Prediction ---
# This check ensures that the model has been loaded and the generators exist
if 'best_model' in locals() and best_model is not None and 'train_generator' in locals():
    print("\nReady to predict! Use the button below to upload an image.")
    predict_on_upload(best_model, train_generator)
else:
    print("\nCannot run prediction. Ensure the model was trained and data generators were created.")


# --- Load Model from Pickle File ---
try:
    # Define the pickle filename
    pickle_filename = 'MlArtist_FinalModel.pkl'
    print(f"Loading model from {pickle_filename}...")

    # Open the file in read-binary mode and load the model
    with open(pickle_filename, 'rb') as file:
        best_model = pickle.load(file)

    print(" Best trained model loaded successfully from pickle file.")
except Exception as e:
    print(f" Error loading model from pickle file: {e}")
    best_model = None


# --- Prediction Function ---
# This function uses the global 'anonymize_image' function defined in a previous cell.
def predict_on_upload(model_to_use, train_gen):
    if model_to_use is None:
        print("Model is not loaded. Cannot predict.")
        return

    # Create the label map from the training generator
    class_indices = train_gen.class_indices
    labels_map = {v: k for k, v in class_indices.items()}

    # Upload files
    uploaded = files.upload()
    for filename in uploaded.keys():
        print(f"\n--- Analyzing '{filename}' ---")
        try:
            # Load the image for processing
            img = tf.keras.preprocessing.image.load_img(filename, target_size=(128, 128))
            img_array_rgb = tf.keras.preprocessing.image.img_to_array(img)

            # Anonymize the image using our function (which returns a float32 array)
            anonymized_array_float = anonymize_image(img_array_rgb)

            # Prepare the image for the model (rescale and add batch dimension)
            img_batch = np.expand_dims(anonymized_array_float, axis=0)
            img_preprocessed = img_batch / 255.0  # Rescale float[0,255] to float[0,1]

            # Make the prediction
            prediction = model_to_use.predict(img_preprocessed)

            predicted_index = np.argmax(prediction[0])
            predicted_label = labels_map[predicted_index]
            confidence = np.max(prediction[0]) * 100

            main_category, sub_category = predicted_label.split('_', 1)

            # --- Display the results ---
            print("\n Anonymized Input Image:")
```

```
            # For display, convert the float array back to a uint8 BGR image for cv2_imshow
            display_img_uint8 = anonymized_array_float.astype(np.uint8)
            display_img_bgr = cv2.cvtColor(display_img_uint8, cv2.COLOR_RGB2BGR)
            cv2_imshow(display_img_bgr)

            print(f"\n Prediction Result:")
            print(f"  - Main Category: {main_category}")
            print(f"  - Sub Category:  {sub_category.replace('_', ' ')}")
            print(f"  - Confidence:    {confidence:.2f}%")

        except Exception as e:
            print(f"Error processing {filename}: {e}")


# --- Run Prediction ---
# This check ensures that the model has been loaded and the generators exist
if 'best_model' in locals() and best_model is not None and 'train_generator' in locals():
    print("\nReady to predict! Use the button below to upload an image.")
    predict_on_upload(best_model, train_generator)
else:
    print("\nCannot run prediction. Ensure the model was trained and data generators were created.")
```

```
Ready to predict! Use the button below to upload an image.
Choose Files No file chosen  Upload widget is only available when the cell has been executed in the current browser session. Please rerun this cell to enable.
Saving images (4).jpg to images (4).jpg

--- Analyzing 'images (4).jpg' ---
1/1 ━━━━━━━━━━━━━━━━━━━━ 0s 30ms/step

 Anonymized Input Image:
```

```
 Prediction Result:
  - Main Category: Vandalism
  - Sub Category:  Graffiti
  - Confidence:    99.57%
```

```
# --- Load Model from Pickle File ---
try:
    # Define the pickle filename
    pickle_filename = 'MlArtist_FinalModel.pkl'
    print(f"Loading model from {pickle_filename}...")

    # Open the file in read-binary mode and load the model
    with open(pickle_filename, 'rb') as file:
        best_model = pickle.load(file)

    print(" Best trained model loaded successfully from pickle file.")
except Exception as e:
    print(f" Error loading model from pickle file: {e}")
    best_model = None


# --- Prediction Function ---
# This function uses the global 'anonymize_image' function defined in a previous cell.
def predict_on_upload(model_to_use, train_gen):
    if model_to_use is None:
        print("Model is not loaded. Cannot predict.")
        return

    # Create the label map from the training generator
    class_indices = train_gen.class_indices
    labels_map = {v: k for k, v in class_indices.items()}

    # Upload files
    uploaded = files.upload()
    for filename in uploaded.keys():
        print(f"\n--- Analyzing '{filename}' ---")
        try:
            # Load the image for processing
```

```
            img = tf.keras.preprocessing.image.load_img(filename, target_size=(128, 128))
            img_array_rgb = tf.keras.preprocessing.image.img_to_array(img)

            # Anonymize the image using our function (which returns a float32 array)
            anonymized_array_float = anonymize_image(img_array_rgb)

            # Prepare the image for the model (rescale and add batch dimension)
            img_batch = np.expand_dims(anonymized_array_float, axis=0)
            img_preprocessed = img_batch / 255.0  # Rescale float[0,255] to float[0,1]

            # Make the prediction
            prediction = model_to_use.predict(img_preprocessed)

            predicted_index = np.argmax(prediction[0])
            predicted_label = labels_map[predicted_index]
            confidence = np.max(prediction[0]) * 100

            main_category, sub_category = predicted_label.split('_', 1)

            # --- Display the results ---
            print("\n Anonymized Input Image:")

            # For display, convert the float array back to a uint8 BGR image for cv2_imshow
            display_img_uint8 = anonymized_array_float.astype(np.uint8)
            display_img_bgr = cv2.cvtColor(display_img_uint8, cv2.COLOR_RGB2BGR)
            cv2_imshow(display_img_bgr)

            print(f"\n Prediction Result:")
            print(f"  - Main Category: {main_category}")
            print(f"  - Sub Category:  {sub_category.replace('_', ' ')}")
            print(f"  - Confidence:    {confidence:.2f}%")

        except Exception as e:
            print(f"Error processing {filename}: {e}")


# --- Run Prediction ---
# This check ensures that the model has been loaded and the generators exist
if 'best_model' in locals() and best_model is not None and 'train_generator' in locals():
    print("\nReady to predict! Use the button below to upload an image.")
    predict_on_upload(best_model, train_generator)
else:
    print("\nCannot run prediction. Ensure the model was trained and data generators were created.")
```

```
Ready to predict! Use the button below to upload an image.
Choose Files No file chosen  Upload widget is only available when the cell has been executed in the current browser session. Please rerun this cell to enable.
Saving IMG_5515-1-1920x1440.webp to IMG_5515-1-1920x1440.webp

--- Analyzing 'IMG_5515-1-1920x1440.webp' ---
1/1 ━━━━━━━━━━━━━━━━━━━━ 0s 30ms/step

 Anonymized Input Image:
```

```
 Prediction Result:
  - Main Category: Domestic
  - Sub Category:  trash
  - Confidence:    95.33%
```

```
# --- Load Model from Pickle File ---
try:
    # Define the pickle filename
    pickle_filename = 'MlArtist_FinalModel.pkl'
    print(f"Loading model from {pickle_filename}...")

    # Open the file in read-binary mode and load the model
    with open(pickle_filename, 'rb') as file:
        best_model = pickle.load(file)

    print(" Best trained model loaded successfully from pickle file.")
except Exception as e:
```

```
        print(f" Error loading model from pickle file: {e}")
        best_model = None


    # --- Prediction Function ---
    # This function uses the global 'anonymize_image' function defined in a previous cell.
    def predict_on_upload(model_to_use, train_gen):
        if model_to_use is None:
            print("Model is not loaded. Cannot predict.")
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        # Create the label map from the training generator
        class_indices = train_gen.class_indices
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        # Upload files
        uploaded = files.upload()
        for filename in uploaded.keys():
            print(f"\n--- Analyzing '{filename}' ---")
            try:
                # Load the image for processing
                img = tf.keras.preprocessing.image.load_img(filename, target_size=(128, 128))
                img_array_rgb = tf.keras.preprocessing.image.img_to_array(img)

                # Anonymize the image using our function (which returns a float32 array)
                anonymized_array_float = anonymize_image(img_array_rgb)

                # Prepare the image for the model (rescale and add batch dimension)
                img_batch = np.expand_dims(anonymized_array_float, axis=0)
                img_preprocessed = img_batch / 255.0  # Rescale float[0,255] to float[0,1]

                # Make the prediction
                prediction = model_to_use.predict(img_preprocessed)

                predicted_index = np.argmax(prediction[0])
                predicted_label = labels_map[predicted_index]
                confidence = np.max(prediction[0]) * 100

                main_category, sub_category = predicted_label.split('_', 1)

                # --- Display the results ---
                print("\n Anonymized Input Image:")

                # For display, convert the float array back to a uint8 BGR image for cv2_imshow
                display_img_uint8 = anonymized_array_float.astype(np.uint8)
                display_img_bgr = cv2.cvtColor(display_img_uint8, cv2.COLOR_RGB2BGR)
                cv2_imshow(display_img_bgr)

                print(f"\n Prediction Result:")
                print(f"  - Main Category: {main_category}")
                print(f"  - Sub Category:  {sub_category.replace('_', ' ')}")
                print(f"  - Confidence:    {confidence:.2f}%")

            except Exception as e:
                print(f"Error processing {filename}: {e}")


    # --- Run Prediction ---
    # This check ensures that the model has been loaded and the generators exist
    if 'best_model' in locals() and best_model is not None and 'train_generator' in locals():
        print("\nReady to predict! Use the button below to upload an image.")
        predict_on_upload(best_model, train_generator)
    else:
        print("\nCannot run prediction. Ensure the model was trained and data generators were created.")
```
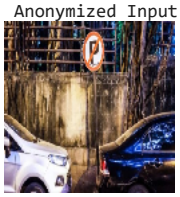

```
Ready to predict! Use the button below to upload an image.
```
Choose Files No file chosen Upload widget is only available when the cell has been executed in the current browser session. Please rerun this cell to enable.
```
Saving images (5).jpg to images (5).jpg

--- Analyzing 'images (5).jpg' ---
1/1 ━━━━━━━━━━━━━━━━━━━━ 0s 30ms/step

 Anonymized Input Image:
```

```
 Prediction Result:
  - Main Category: Vandalism
  - Sub Category:  Graffiti
```

```
# --- Load Model from Pickle File ---
try:
    # Define the pickle filename
    pickle_filename = 'MlArtist_FinalModel.pkl'
    print(f"Loading model from {pickle_filename}...")

    # Open the file in read-binary mode and load the model
    with open(pickle_filename, 'rb') as file:
        best_model = pickle.load(file)

    print(" Best trained model loaded successfully from pickle file.")
except Exception as e:
    print(f" Error loading model from pickle file: {e}")
    best_model = None


# --- Prediction Function ---
# This function uses the global 'anonymize_image' function defined in a previous cell.
def predict_on_upload(model_to_use, train_gen):
    if model_to_use is None:
        print("Model is not loaded. Cannot predict.")
        return

    # Create the label map from the training generator
    class_indices = train_gen.class_indices
    labels_map = {v: k for k, v in class_indices.items()}

    # Upload files
    uploaded = files.upload()
    for filename in uploaded.keys():
        print(f"\n--- Analyzing '{filename}' ---")
        try:
            # Load the image for processing
            img = tf.keras.preprocessing.image.load_img(filename, target_size=(128, 128))
            img_array_rgb = tf.keras.preprocessing.image.img_to_array(img)

            # Anonymize the image using our function (which returns a float32 array)
            anonymized_array_float = anonymize_image(img_array_rgb)

            # Prepare the image for the model (rescale and add batch dimension)
            img_batch = np.expand_dims(anonymized_array_float, axis=0)
            img_preprocessed = img_batch / 255.0  # Rescale float[0,255] to float[0,1]

            # Make the prediction
            prediction = model_to_use.predict(img_preprocessed)

            predicted_index = np.argmax(prediction[0])
            predicted_label = labels_map[predicted_index]
            confidence = np.max(prediction[0]) * 100

            main_category, sub_category = predicted_label.split('_', 1)

            # --- Display the results ---
            print("\n Anonymized Input Image:")
```

```
            # For display, convert the float array back to a uint8 BGR image for cv2_imshow
            display_img_uint8 = anonymized_array_float.astype(np.uint8)
            display_img_bgr = cv2.cvtColor(display_img_uint8, cv2.COLOR_RGB2BGR)
            cv2_imshow(display_img_bgr)

            print(f"\n Prediction Result:")
            print(f"  - Main Category: {main_category}")
            print(f"  - Sub Category:  {sub_category.replace('_', ' ')}")
            print(f"  - Confidence:    {confidence:.2f}%")

        except Exception as e:
            print(f"Error processing {filename}: {e}")


# --- Run Prediction ---
# This check ensures that the model has been loaded and the generators exist
if 'best_model' in locals() and best_model is not None and 'train_generator' in locals():
    print("\nReady to predict! Use the button below to upload an image.")
    predict_on_upload(best_model, train_generator)
else:
    print("\nCannot run prediction. Ensure the model was trained and data generators were created.")
```

```
Ready to predict! Use the button below to upload an image.
Choose Files No file chosen  Upload widget is only available when the cell has been executed in the current browser session. Please rerun this cell to enable.
Saving 87f4e7e6-512325_550x300_crop.jpg to 87f4e7e6-512325_550x300_crop.jpg

--- Analyzing '87f4e7e6-512325_550x300_crop.jpg' ---
1/1 ━━━━━━━━━━━━━━━━━━━━ 0s 31ms/step

 Anonymized Input Image:
```



```
 Prediction Result:
  - Main Category: Vandalism
  - Sub Category:  Graffiti
```

```
# --- Load Model from Pickle File ---
try:
    # Define the pickle filename
    pickle_filename = 'MlArtist_FinalModel.pkl'
    print(f"Loading model from {pickle_filename}...")

    # Open the file in read-binary mode and load the model
    with open(pickle_filename, 'rb') as file:
        best_model = pickle.load(file)

    print(" Best trained model loaded successfully from pickle file.")
except Exception as e:
    print(f" Error loading model from pickle file: {e}")
    best_model = None


# --- Prediction Function ---
# This function uses the global 'anonymize_image' function defined in a previous cell.
def predict_on_upload(model_to_use, train_gen):
    if model_to_use is None:
        print("Model is not loaded. Cannot predict.")
        return

    # Create the label map from the training generator
    class_indices = train_gen.class_indices
    labels_map = {v: k for k, v in class_indices.items()}

    # Upload files
    uploaded = files.upload()
    for filename in uploaded.keys():
        print(f"\n--- Analyzing '{filename}' ---")
        try:
            # Load the image for processing
            img = tf.keras.preprocessing.image.load_img(filename, target_size=(128, 128))
```

```
            img_array_rgb = tf.keras.preprocessing.image.img_to_array(img)

            # Anonymize the image using our function (which returns a float32 array)
            anonymized_array_float = anonymize_image(img_array_rgb)

            # Prepare the image for the model (rescale and add batch dimension)
            img_batch = np.expand_dims(anonymized_array_float, axis=0)
            img_preprocessed = img_batch / 255.0  # Rescale float[0,255] to float[0,1]

            # Make the prediction
            prediction = model_to_use.predict(img_preprocessed)

            predicted_index = np.argmax(prediction[0])
            predicted_label = labels_map[predicted_index]
            confidence = np.max(prediction[0]) * 100

            main_category, sub_category = predicted_label.split('_', 1)

            # --- Display the results ---
            print("\n Anonymized Input Image:")

            # For display, convert the float array back to a uint8 BGR image for cv2_imshow
            display_img_uint8 = anonymized_array_float.astype(np.uint8)
            display_img_bgr = cv2.cvtColor(display_img_uint8, cv2.COLOR_RGB2BGR)
            cv2_imshow(display_img_bgr)

            print(f"\n Prediction Result:")
            print(f"  - Main Category: {main_category}")
            print(f"  - Sub Category:  {sub_category.replace('_', ' ')}")
            print(f"  - Confidence:    {confidence:.2f}%")

        except Exception as e:
            print(f"Error processing {filename}: {e}")


# --- Run Prediction ---
# This check ensures that the model has been loaded and the generators exist
if 'best_model' in locals() and best_model is not None and 'train_generator' in locals():
    print("\nReady to predict! Use the button below to upload an image.")
    predict_on_upload(best_model, train_generator)
else:
    print("\nCannot run prediction. Ensure the model was trained and data generators were created.")


# --- Load Model from Pickle File ---
try:
    # Define the pickle filename
    pickle_filename = 'MlArtist_FinalModel.pkl'
    print(f"Loading model from {pickle_filename}...")

    # Open the file in read-binary mode and load the model
    with open(pickle_filename, 'rb') as file:
        best_model = pickle.load(file)

    print(" Best trained model loaded successfully from pickle file.")
except Exception as e:
    print(f" Error loading model from pickle file: {e}")
    best_model = None


# --- Prediction Function ---
# This function uses the global 'anonymize_image' function defined in a previous cell.
def predict_on_upload(model_to_use, train_gen):
    if model_to_use is None:
        print("Model is not loaded. Cannot predict.")
        return

    # Create the label map from the training generator
    class_indices = train_gen.class_indices
    labels_map = {v: k for k, v in class_indices.items()}

    # Upload files
    uploaded = files.upload()
    for filename in uploaded.keys():
        print(f"\n--- Analyzing '{filename}' ---")
        try:
            # Load the image for processing
```

```
img = tf.keras.preprocessing.image.load_img(filename, target_size=(128, 128))
img_array_rgb = tf.keras.preprocessing.image.img_to_array(img)

# Anonymize the image using our function (which returns a float32 array)
anonymized_array_float = anonymize_image(img_array_rgb)

# Prepare the image for the model (rescale and add batch dimension)
img_batch = np.expand_dims(anonymized_array_float, axis=0)
img_preprocessed = img_batch / 255.0  # Rescale float[0,255] to float[0,1]

# Make the prediction
prediction = model_to_use.predict(img_preprocessed)

predicted_index = np.argmax(prediction[0])
predicted_label = labels_map[predicted_index]
confidence = np.max(prediction[0]) * 100

main_category, sub_category = predicted_label.split('_', 1)

# --- Display the results ---
print("\n Anonymized Input Image:")

# For display, convert the float array back to a uint8 BGR image for cv2_imshow
display_img_uint8 = anonymized_array_float.astype(np.uint8)
display_img_bgr = cv2.cvtColor(display_img_uint8, cv2.COLOR_RGB2BGR)
cv2_imshow(display_img_bgr)

print(f"\n Prediction Result:")
print(f"  - Main Category: {main_category}")
print(f"  - Sub Category:  {sub_category.replace('_', ' ')}")
```