

Import and Install Required Libraries

```
# =====  
# Standard Library  
# =====  
import os  
import sys  
import math  
import gc  
import random  
import pickle  
from pathlib import Path  
from functools import partial  
from pprint import pprint  
from tqdm import tqdm  
  
# =====  
# Third-Party Libraries  
# =====  
import numpy as np  
import pandas as pd  
import cv2  
import matplotlib.pyplot as plt  
import seaborn as sns  
import albumentations as A  
import joblib  
  
# =====  
# TensorFlow / Keras  
# =====  
import tensorflow as tf  
from tensorflow.keras.optimizers import AdamW  
from tensorflow.keras import layers, Model, Input, mixed_precision  
from tensorflow.keras.models import Sequential  
from tensorflow.keras.layers import Dense, Dropout, BatchNormalization  
from tensorflow.keras.applications import EfficientNetB4  
from tensorflow.keras.applications.efficientnet import  
preprocess_input  
from tensorflow.keras.optimizers import Adam  
from tensorflow.keras.callbacks import (  
    Callback,  
    EarlyStopping,  
    ReduceLROnPlateau,  
    ModelCheckpoint  
)  
  
from tensorflow.keras.utils import to_categorical, custom_object_scope
```

```

# Enable XLA Compilation
tf.config.optimizer.set_jit(True)

# EfficientNetV2S fallback import
try:
    from tensorflow.keras.applications import EfficientNetV2S
except Exception:
    from tensorflow.keras.applications.efficientnet_v2 import
    EfficientNetV2S

# =====
# Scikit-Learn
# =====
from sklearn.model_selection import train_test_split
from sklearn.preprocessing import StandardScaler
from sklearn.metrics import (
    accuracy_score,
    f1_score,
    classification_report,
    confusion_matrix,
    precision_score,
    recall_score
)
from sklearn.utils import class_weight
from sklearn.ensemble import GradientBoostingClassifier
from sklearn.linear_model import LogisticRegression
from sklearn.decomposition import PCA
from sklearn.metrics import silhouette_score

# =====
# Mixed Precision
# =====
mixed_precision.set_global_policy("mixed_float16")

# =====
# Train ML Models on GPU
# =====
from cuml.linear_model import LogisticRegression
import cupy as cp

```

Merge Cluster information with Metadata and Verify

```

# Load your original metadata and cluster results
df_meta =
pd.read_csv('/kaggle/input/coral-metrics-and-clusters/metadata.csv')

```

```

df_clusters =
pd.read_csv('/kaggle/input/coral-metrics-and-clusters/coral_clusters.c
sv')

# Merge cluster information with metadata
df_with_clusters = df_meta.merge(df_clusters, on='image_path',
how='left')

# Verify the merge
print(f"Original metadata shape: {df_meta.shape}")
print(f"Cluster data shape: {df_clusters.shape}")
print(f"Merged data shape: {df_with_clusters.shape}")
print(f"Missing clusters: {df_with_clusters['cluster'].isna().sum()}")

# Display sample with clusters
print("\nSample data with clusters:")
display(df_with_clusters.sample(10))

```

Original metadata shape: (39044, 4)
Cluster data shape: (39044, 2)
Merged data shape: (39044, 5)
Missing clusters: 0

Sample data with clusters:

	image_path \
6507	/kaggle/input/coral-condition-dataset/coral_im...
17284	/kaggle/input/coral-condition-dataset/coral_im...
3577	/kaggle/input/coral-condition-dataset/coral_im...
16734	/kaggle/input/coral-condition-dataset/coral_im...
21592	/kaggle/input/coral-condition-dataset/coral_im...
1166	/kaggle/input/coral-condition-dataset/coral_im...
6896	/kaggle/input/coral-condition-dataset/coral_im...
9595	/kaggle/input/coral-condition-dataset/coral_im...
18302	/kaggle/input/coral-condition-dataset/coral_im...
24895	/kaggle/input/coral-condition-dataset/coral_im...

	filename	folder	source	cluster
6507	HWB_0029_12_20230926_0026_31.jpg	clipped	dry	4
17284	SKI_0004_00_20230817_0007_15.jpg	clipped	dry	0
3577	ALK_0030_11_20230927_0059_23.jpg	clipped	dry	2
16734	SKI_0004_00_20230817_0013_33.jpg	clipped	dry	2
21592	CBK_0001_00_20230804_0006_24.jpg	clipped	dry	4
1166	SWP_0025_00_20230919_0010_18.jpg	clipped	dry	2
6896	HWB_0029_12_20230926_0009_26.jpg	clipped	dry	0
9595	HWB_0029_12_20230926_0067_4.jpg	clipped	dry	0
18302	SKI_0004_00_20230817_0095_17.jpg	clipped	dry	2
24895	TCB_0003_00_20230816_0066_8.jpg	clipped	dry	4

```
# Check cluster distribution in the merged data
print("\nCluster distribution in merged data:")
df_with_clusters['cluster'].value_counts().sort_index()
```

Cluster distribution in merged data:

```
cluster
0      9379
1      2785
2     14780
3      5175
4      6925
Name: count, dtype: int64
```

```
# Save the enhanced dataset
df_with_clusters.to_csv('/kaggle/working/metadata_with_clusters.csv',
index=False)
print(f"\nSaved enhanced dataset to:
/kaggle/working/metadata_with_clusters.csv")
```

Saved enhanced dataset to: /kaggle/working/metadata_with_clusters.csv

```
df_with_clusters.info
```

```
<bound method DataFrame.info of
image_path \
0      /kaggle/input/coral-condition-dataset/coral_im...
1      /kaggle/input/coral-condition-dataset/coral_im...
2      /kaggle/input/coral-condition-dataset/coral_im...
3      /kaggle/input/coral-condition-dataset/coral_im...
4      /kaggle/input/coral-condition-dataset/coral_im...
...
39039  /kaggle/input/coral-condition-dataset/coral_im...
39040  /kaggle/input/coral-condition-dataset/coral_im...
39041  /kaggle/input/coral-condition-dataset/coral_im...
39042  /kaggle/input/coral-condition-dataset/coral_im...
39043  /kaggle/input/coral-condition-dataset/coral_im...
```

	filename	folder	source	cluster
0	SWP_0025_00_20230919_0020.jpg	20230919_SWP	dry	2
1	SWP_0025_00_20230919_0001.jpg	20230919_SWP	dry	2
2	SWP_0025_00_20230919_0031.jpg	20230919_SWP	dry	2
3	SWP_0025_00_20230919_0022.jpg	20230919_SWP	dry	2
4	SWP_0025_00_20230919_0029.jpg	20230919_SWP	dry	2

...
39039	SKI_0033_00_20240103_0022_11.jpg	cropped	wet	4
39040	SKI_0033_00_20240103_0027_35.jpg	cropped	wet	2
39041	SKI_0033_00_20240103_0007_6.jpg	cropped	wet	1
39042	SKI_0033_00_20240103_0009_5.jpg	cropped	wet	4
39043	SKI_0033_00_20240103_0022_28.jpg	cropped	wet	2

[39044 rows x 5 columns]>

df_with_clusters.sample(25)

	image_path \			
23096	/kaggle/input/coral-condition-dataset/coral_im...			
9117	/kaggle/input/coral-condition-dataset/coral_im...			
16294	/kaggle/input/coral-condition-dataset/coral_im...			
20053	/kaggle/input/coral-condition-dataset/coral_im...			
33907	/kaggle/input/coral-condition-dataset/coral_im...			
22624	/kaggle/input/coral-condition-dataset/coral_im...			
22384	/kaggle/input/coral-condition-dataset/coral_im...			
11200	/kaggle/input/coral-condition-dataset/coral_im...			
160	/kaggle/input/coral-condition-dataset/coral_im...			
27921	/kaggle/input/coral-condition-dataset/coral_im...			
26683	/kaggle/input/coral-condition-dataset/coral_im...			
5496	/kaggle/input/coral-condition-dataset/coral_im...			
27434	/kaggle/input/coral-condition-dataset/coral_im...			
26482	/kaggle/input/coral-condition-dataset/coral_im...			
5447	/kaggle/input/coral-condition-dataset/coral_im...			
34954	/kaggle/input/coral-condition-dataset/coral_im...			
5946	/kaggle/input/coral-condition-dataset/coral_im...			
6044	/kaggle/input/coral-condition-dataset/coral_im...			
24852	/kaggle/input/coral-condition-dataset/coral_im...			
20636	/kaggle/input/coral-condition-dataset/coral_im...			
27929	/kaggle/input/coral-condition-dataset/coral_im...			
15065	/kaggle/input/coral-condition-dataset/coral_im...			
24604	/kaggle/input/coral-condition-dataset/coral_im...			
13475	/kaggle/input/coral-condition-dataset/coral_im...			
14279	/kaggle/input/coral-condition-dataset/coral_im...			

	filename	folder	source	cluster
23096	TCB_0003_00_20230816_0097_14.jpg	clipped	dry	1
9117	HWB_0029_12_20230926_0019_20.jpg	clipped	dry	2

16294	SKI_0004_00_20230817_0057_19.jpg	clipped	dry	4
20053	SKI_0004_00_20230817_0013_7.jpg	clipped	dry	2
33907	CBK_0038_00_20240124_0035_24.jpg	cropped	wet	2
22624	TCB_0003_00_20230816_0095_15.jpg	clipped	dry	1
22384	TCB_0003_00_20230816_0063.jpg	20230816_TCB	dry	2
11200	HNM_0031_00_20230928_0012_34.jpg	clipped	dry	3
160	SWP_0025_00_20230919_0037_24.jpg	clipped	dry	2
27921	HWB_0037_12_20240122_0066_15.jpg	cropped	wet	3
26683	HWB_0037_12_20240122_0044_34.jpg	cropped	wet	3
5496	20230412_0003_13.jpg	clipped	dry	3
27434	HWB_0037_12_20240122_0008_28.jpg	cropped	wet	2
26482	HWB_0037_12_20240122_0053_3.jpg	cropped	wet	4
5447	20230412_0030_11.jpg	clipped	dry	3
34954	CBK_0038_00_20240124_0068_21.jpg	cropped	wet	2
5946	20230412_0021_2.jpg	clipped	dry	2
6044	20230412_0008_19.jpg	clipped	dry	0
24852	TCB_0003_00_20230816_0039_14.jpg	clipped	dry	4
20636	CBK_0001_00_20230804_0081_23.jpg	clipped	dry	4
27929	HWB_0037_12_20240122_0043_1.jpg	cropped	wet	2
15065	TTB_0002_00_20230815_0008_33.jpg	clipped	dry	0
24604	TCB_0003_00_20230816_0005_21.jpg	clipped	dry	4
13475	HNM_0031_00_20230928_0042_19.jpg	clipped	dry	2
14279	AOM_0032_00_20230929_0009_12.jpg	clipped	dry	2

Merge cluster metrics

```
# Add cluster color metrics information
metrics_df =
```

```
pd.read_csv('/kaggle/input/coral-metrics-and-clusters/cluster_color_metrics.csv')
```

```
# Rename columns to distinguish cluster-level metrics
```

```
metrics_df_renamed = metrics_df.rename(columns={
    'mean_brightness': 'cluster_mean_brightness',
    'mean_saturation': 'cluster_mean_saturation',
    'mean_luminance_std': 'cluster_mean_luminance_std'
}).drop('n_images', axis=1) # Drop n_images as it's redundant
```

```
# Merge cluster metrics
```

```
df_complete = df_with_clusters.merge(metrics_df_renamed, on='cluster',
how='left')
```

```
print(f"Complete dataset shape: {df_complete.shape}")
```

```
print("\nColumns in complete dataset:")
```

```
df_complete.columns.tolist()
```

```
Complete dataset shape: (39044, 8)
```

```
Columns in complete dataset:
```

```
['image_path',
 'filename',
 'folder',
 'source',
 'cluster',
 'cluster_mean_brightness',
 'cluster_mean_saturation',
 'cluster_mean_luminance_std']
```

```
# Save the complete analysis dataset
```

```
df_complete.to_csv('/kaggle/working/coral_dataset_with_clusters_and_metrics.csv', index=False)
```

```
print(f"\nSaved complete dataset to:
/kaggle/working/coral_dataset_with_clusters_and_metrics.csv")
```

```
Saved complete dataset to:
```

```
/kaggle/working/coral_dataset_with_clusters_and_metrics.csv
```

```
df_complete.sample(25)
```

```
image_path \
26946 /kaggle/input/coral-condition-dataset/coral_im...
31124 /kaggle/input/coral-condition-dataset/coral_im...
38084 /kaggle/input/coral-condition-dataset/coral_im...
6686 /kaggle/input/coral-condition-dataset/coral_im...
9550 /kaggle/input/coral-condition-dataset/coral_im...
7680 /kaggle/input/coral-condition-dataset/coral_im...
28434 /kaggle/input/coral-condition-dataset/coral_im...
```

```

26935 /kaggle/input/coral-condition-dataset/coral_im...
38736 /kaggle/input/coral-condition-dataset/coral_im...
19156 /kaggle/input/coral-condition-dataset/coral_im...
24651 /kaggle/input/coral-condition-dataset/coral_im...
13300 /kaggle/input/coral-condition-dataset/coral_im...
2435 /kaggle/input/coral-condition-dataset/coral_im...
29311 /kaggle/input/coral-condition-dataset/coral_im...
761 /kaggle/input/coral-condition-dataset/coral_im...
16624 /kaggle/input/coral-condition-dataset/coral_im...
37196 /kaggle/input/coral-condition-dataset/coral_im...
22263 /kaggle/input/coral-condition-dataset/coral_im...
23 /kaggle/input/coral-condition-dataset/coral_im...
28824 /kaggle/input/coral-condition-dataset/coral_im...
10559 /kaggle/input/coral-condition-dataset/coral_im...
16318 /kaggle/input/coral-condition-dataset/coral_im...
20710 /kaggle/input/coral-condition-dataset/coral_im...
23568 /kaggle/input/coral-condition-dataset/coral_im...
38624 /kaggle/input/coral-condition-dataset/coral_im...

```

	filename	folder	source
cluster \			
26946	HWB_0037_12_20240122_0021_21.jpg	cropped	wet
4			
31124	ALK_0035_00_20240118_0017_21.jpg	cropped	wet
2			
38084	SKI_0033_00_20240103_0012.jpg	20240103_SKI_done	wet
2			
6686	HWB_0029_12_20230926_0084_12.jpg	clipped	dry
0			
9550	HWB_0029_12_20230926_0035_26.jpg	clipped	dry
4			
7680	HWB_0029_12_20230926_0058_18.jpg	clipped	dry
2			
28434	HWB_0037_12_20240122_0071_27.jpg	cropped	wet
0			
26935	HWB_0037_12_20240122_0043_18.jpg	cropped	wet
2			
38736	SKI_0033_00_20240103_0013_13.jpg	cropped	wet
4			
19156	SKI_0004_00_20230817_0080_13.jpg	clipped	dry
2			
24651	TCB_0003_00_20230816_0076_22.jpg	clipped	dry
3			
13300	HNM_0031_00_20230928_0075_14.jpg	clipped	dry
3			
2435	ALK_0030_11_20230927_0029_19.jpg	clipped	dry
2			
29311	SIN_0040_00_20240129_0052_4.jpg	cropped	wet
4			

761 2	SWP_0025_00_20230919_0010_12.jpg	clipped	dry
16624 2	SKI_0004_00_20230817_0018_9.jpg	clipped	dry
37196 2	CBK_0039_00_20240126_0026_12.jpg	cropped	wet
22263 4	CBK_0001_00_20230804_0069_28.jpg	clipped	dry
23 2	SWP_0025_00_20230919_0025.jpg	20230919_SWP	dry
28824 4	HWB_0037_12_20240122_0052_17.jpg	cropped	wet
10559 0	HWB_0029_12_20230926_0068_28.jpg	clipped	dry
16318 0	SKI_0004_00_20230817_0016_10.jpg	clipped	dry
20710 4	CBK_0001_00_20230804_0017_4.jpg	clipped	dry
23568 2	TCB_0003_00_20230816_0084_17.jpg	clipped	dry
38624 4	SKI_0033_00_20240103_0022_6.jpg	cropped	wet

	cluster_mean_brightness	cluster_mean_saturation	\
26946	0.498285	0.275200	
31124	0.346147	0.331251	
38084	0.346147	0.331251	
6686	0.213652	0.430153	
9550	0.498285	0.275200	
7680	0.346147	0.331251	
28434	0.213652	0.430153	
26935	0.346147	0.331251	
38736	0.498285	0.275200	
19156	0.346147	0.331251	
24651	0.439220	0.337231	
13300	0.439220	0.337231	
2435	0.346147	0.331251	
29311	0.498285	0.275200	
761	0.346147	0.331251	
16624	0.346147	0.331251	
37196	0.346147	0.331251	
22263	0.498285	0.275200	
23	0.346147	0.331251	
28824	0.498285	0.275200	
10559	0.213652	0.430153	
16318	0.213652	0.430153	
20710	0.498285	0.275200	
23568	0.346147	0.331251	
38624	0.498285	0.275200	

	cluster_mean_luminance_std
26946	0.147476
31124	0.143388
38084	0.143388
6686	0.107641
9550	0.147476
7680	0.143388
28434	0.107641
26935	0.143388
38736	0.147476
19156	0.143388
24651	0.129777
13300	0.129777
2435	0.143388
29311	0.147476
761	0.143388
16624	0.143388
37196	0.143388
22263	0.147476
23	0.143388
28824	0.147476
10559	0.107641
16318	0.107641
20710	0.147476
23568	0.143388
38624	0.147476

Cross-tabulation: clusters vs sources

```
# Cross-tabulation: clusters vs sources
cluster_source_ct = pd.crosstab(df_with_clusters['cluster'],
df_with_clusters['source'])
print("Cluster distribution across dry/wet sources:")
cluster_source_ct
```

Cluster distribution across dry/wet sources:

source	dry	wet
cluster		
0	5704	3675
1	1888	897
2	9744	5036
3	4423	752
4	4541	2384

Cross-tabulation: clusters vs folders

```
cluster_folder_ct = pd.crosstab(df_with_clusters['cluster'],
df_with_clusters['folder'])
print("\nTop folders in each cluster (showing top 5 folders per
cluster):")
for cluster_id in sorted(df_with_clusters['cluster'].unique()):
    cluster_data = df_with_clusters[df_with_clusters['cluster'] ==
cluster_id]
    top_folders = cluster_data['folder'].value_counts().head(5)
    print(f"\nCluster {cluster_id}:")
    for folder, count in top_folders.items():
        print(f"    {folder}: {count} images")
```

Top folders in each cluster (showing top 5 folders per cluster):

Cluster 0:

clipped: 5694 images
cropped: 3655 images
20240118_ALK_done: 8 images
20240126_CBK_done: 6 images
20230926_HWB: 4 images

Cluster 1:

clipped: 1877 images
cropped: 895 images
20230804_CBK: 11 images
20240119_SKI_done: 1 images
20240103_SKI_done: 1 images

Cluster 2:

clipped: 9251 images
cropped: 4751 images
20230817_SKI: 101 images
20230926_HWB: 100 images
20230816_TCB: 99 images

Cluster 3:

clipped: 4299 images
cropped: 738 images
20230927_ALK: 29 images
20230928_HNM: 24 images
20230421_preliminary_survey: 22 images

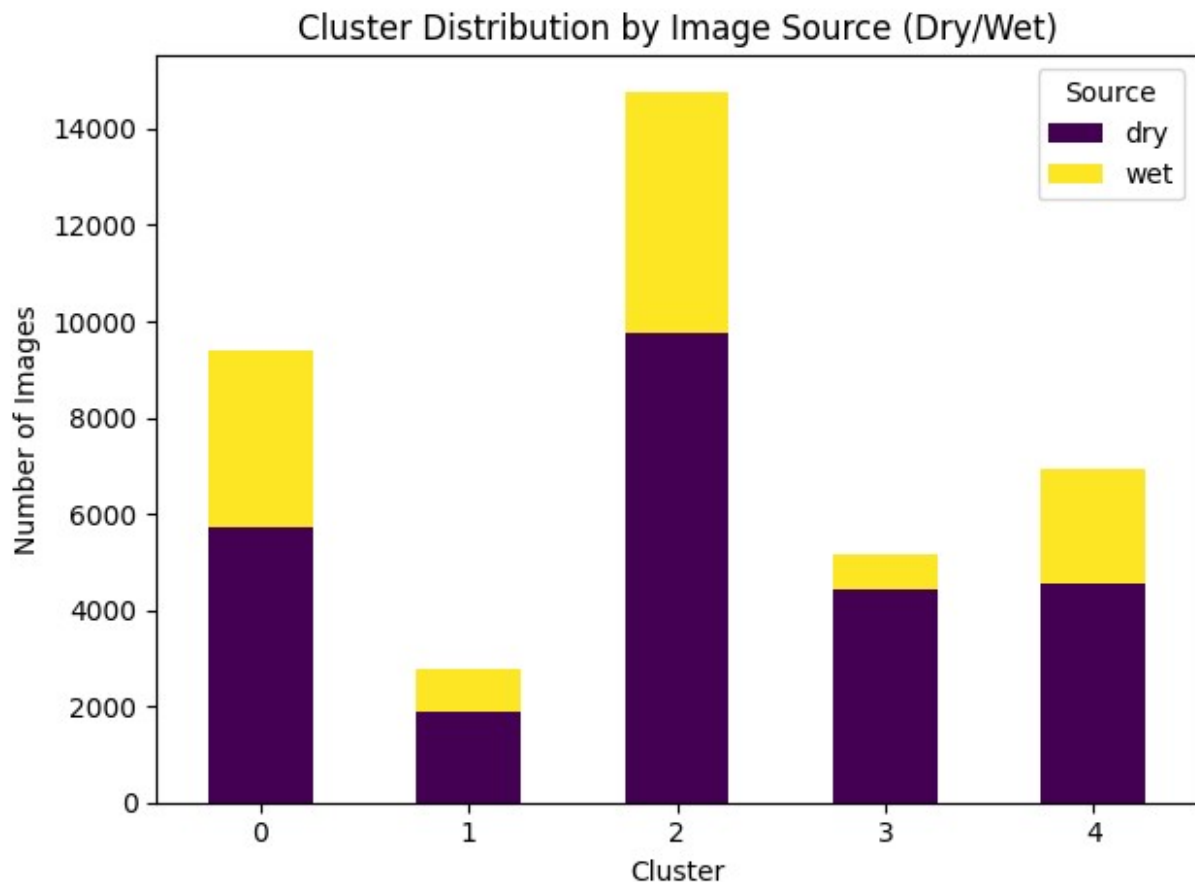
Cluster 4:

clipped: 4425 images
cropped: 2351 images
20230804_CBK: 59 images

20230817_SKI: 36 images
20240103_SKI_done: 15 images

```
# Visualization: Cluster distribution by source
plt.figure(figsize=(10, 6))
cluster_source_ct.plot(kind='bar', stacked=True, colormap='viridis')
plt.title('Cluster Distribution by Image Source (Dry/Wet)')
plt.xlabel('Cluster')
plt.ylabel('Number of Images')
plt.legend(title='Source')
plt.xticks(rotation=0)
plt.tight_layout()
plt.savefig('/kaggle/working/cluster_distribution_by_source.png',
            dpi=200)
plt.show()
```

<Figure size 1000x600 with 0 Axes>



Data Preparation and Splitting

```
# Prepare data
X =
np.load('/kaggle/input/coral-metrics-and-clusters/coral_features.npy')

df_complete =
pd.read_csv('/kaggle/working/coral_dataset_with_clusters_and_metrics.csv')

# Use clusters as labels (since you want to predict/validate clusters)
y = df_complete['cluster'].values

# Split data - stratify to maintain cluster distribution
X_train, X_temp, y_train, y_temp = train_test_split(
    X, y, test_size=0.3, random_state=42, stratify=y
)
X_val, X_test, y_val, y_test = train_test_split(
    X_temp, y_temp, test_size=0.5, random_state=42, stratify=y_temp
)

print(f"Training set: {X_train.shape[0]} samples")
print(f"Validation set: {X_val.shape[0]} samples")
print(f"Test set: {X_test.shape[0]} samples")

# Convert labels to categorical for neural network
num_classes = len(np.unique(y))
y_train_cat = to_categorical(y_train, num_classes=num_classes)
y_val_cat = to_categorical(y_val, num_classes=num_classes)
y_test_cat = to_categorical(y_test, num_classes=num_classes)

Training set: 27330 samples
Validation set: 5857 samples
Test set: 5857 samples
```

Build a Simple Neural Network Classifier

```
def create_simple_nn_model(input_dim, num_classes):
    model = Sequential([
        Dense(512, activation='relu', input_shape=(input_dim,)),
        BatchNormalization(),
        Dropout(0.3),

        Dense(256, activation='relu'),
        BatchNormalization(),
        Dropout(0.3),

        Dense(128, activation='relu'),
```

```

        BatchNormalization(),
        Dropout(0.2),

        Dense(64, activation='relu'),
        Dropout(0.2),

        Dense(num_classes, activation='softmax')
    ])

    return model

# Create model
model = create_simple_nn_model(X.shape[1], num_classes)
model.compile(
    optimizer=Adam(learning_rate=0.001),
    loss='categorical_crossentropy',
    metrics=['accuracy']
)

model.summary()

/usr/local/lib/python3.11/dist-packages/keras/src/layers/core/
dense.py:87: UserWarning: Do not pass an `input_shape`/`input_dim`
argument to a layer. When using Sequential models, prefer using an
`Input(shape)` object as the first layer in the model instead.
  super().__init__(activity_regularizer=activity_regularizer,
**kwargs)
I0000 00:00:1763861220.951818      48 gpu_device.cc:2022] Created
device /job:localhost/replica:0/task:0/device:GPU:0 with 13942 MB
memory: -> device: 0, name: Tesla T4, pci bus id: 0000:00:04.0,
compute capability: 7.5
I0000 00:00:1763861220.952610      48 gpu_device.cc:2022] Created
device /job:localhost/replica:0/task:0/device:GPU:1 with 13942 MB
memory: -> device: 1, name: Tesla T4, pci bus id: 0000:00:05.0,
compute capability: 7.5

```

Model: "sequential"

Layer (type) Param #	Output Shape	
dense (Dense) 655,872	(None, 512)	
batch_normalization 2,048	(None, 512)	

	(BatchNormalization)		
0	dropout (Dropout)	(None, 512)	
131,328	dense_1 (Dense)	(None, 256)	
1,024	batch_normalization_1	(None, 256)	
	(BatchNormalization)		
0	dropout_1 (Dropout)	(None, 256)	
32,896	dense_2 (Dense)	(None, 128)	
512	batch_normalization_2	(None, 128)	
	(BatchNormalization)		
0	dropout_2 (Dropout)	(None, 128)	
8,256	dense_3 (Dense)	(None, 64)	
0	dropout_3 (Dropout)	(None, 64)	
325	dense_4 (Dense)	(None, 5)	

Total params: 832,261 (3.17 MB)

Trainable params: 830,469 (3.17 MB)

Non-trainable params: 1,792 (7.00 KB)

Train with Callbacks for Efficient GPU Usage

```
# Callbacks to prevent overfitting and optimize training
callbacks = [
    EarlyStopping(monitor='val_loss', patience=10,
restore_best_weights=True),
    ReduceLROnPlateau(monitor='val_loss', factor=0.5, patience=5,
min_lr=1e-7),
    tf.keras.callbacks.ModelCheckpoint(
        '/kaggle/working/simple_nn_classifier.h5',
        monitor='val_accuracy',
        save_best_only=True,
        mode='max'
    )
]
```

```
# Train the model
history = model.fit(
    X_train, y_train_cat,
    batch_size=128, # Adjust based on GPU memory
    epochs=100,
    validation_data=(X_val, y_val_cat),
    callbacks=callbacks,
    verbose=1
)
```

Epoch 1/100

WARNING: All log messages before absl::InitializeLog() is called are written to STDERR

I0000 00:00:1763861225.083611 122 service.cc:148] XLA service 0x7b85680074a0 initialized for platform CUDA (this does not guarantee that XLA will be used). Devices:

I0000 00:00:1763861225.085052 122 service.cc:156] StreamExecutor device (0): Tesla T4, Compute Capability 7.5

I0000 00:00:1763861225.085071 122 service.cc:156] StreamExecutor device (1): Tesla T4, Compute Capability 7.5

I0000 00:00:1763861225.147231 122 cuda_dnn.cc:529] Loaded cuDNN version 90300

I0000 00:00:1763861225.288806 122 device_compiler.h:188] Compiled cluster using XLA! This line is logged at most once for the lifetime of the process.

214/214 ————— 0s 25ms/step - accuracy: 0.3159 - loss: 1.5968

WARNING:absl:You are saving your model as an HDF5 file via
`model.save()` or `keras.saving.save_model(model)`. This file format
is considered legacy. We recommend using instead the native Keras
format, e.g. `model.save('my_model.keras')` or
`keras.saving.save_model(model, 'my_model.keras')`.

214/214 _____ 15s 32ms/step - accuracy: 0.3164 - loss:
1.5962 - val_accuracy: 0.3785 - val_loss: 1.4988 - learning_rate:
0.0010

Epoch 2/100

214/214 _____ 1s 3ms/step - accuracy: 0.5154 - loss:
1.2922 - val_accuracy: 0.3765 - val_loss: 1.5079 - learning_rate:
0.0010

Epoch 3/100

214/214 _____ 1s 3ms/step - accuracy: 0.5445 - loss:
1.2418 - val_accuracy: 0.3348 - val_loss: 1.4166 - learning_rate:
0.0010

Epoch 4/100

214/214 _____ 1s 4ms/step - accuracy: 0.5548 - loss:
1.2231 - val_accuracy: 0.2566 - val_loss: 1.6214 - learning_rate:
0.0010

Epoch 5/100

206/214 _____ 0s 3ms/step - accuracy: 0.5542 - loss:
1.2211

WARNING:absl:You are saving your model as an HDF5 file via
`model.save()` or `keras.saving.save_model(model)`. This file format
is considered legacy. We recommend using instead the native Keras
format, e.g. `model.save('my_model.keras')` or
`keras.saving.save_model(model, 'my_model.keras')`.

214/214 _____ 1s 4ms/step - accuracy: 0.5545 - loss:
1.2209 - val_accuracy: 0.3935 - val_loss: 2.1431 - learning_rate:
0.0010

Epoch 6/100

204/214 _____ 0s 3ms/step - accuracy: 0.5711 - loss:
1.2021

WARNING:absl:You are saving your model as an HDF5 file via
`model.save()` or `keras.saving.save_model(model)`. This file format
is considered legacy. We recommend using instead the native Keras
format, e.g. `model.save('my_model.keras')` or
`keras.saving.save_model(model, 'my_model.keras')`.

214/214 _____ 1s 4ms/step - accuracy: 0.5708 - loss:
1.2022 - val_accuracy: 0.4439 - val_loss: 1.5558 - learning_rate:
0.0010

Epoch 7/100

214/214 _____ 1s 4ms/step - accuracy: 0.5725 - loss:
1.1940 - val_accuracy: 0.2290 - val_loss: 1.5583 - learning_rate:

```
0.0010
Epoch 8/100
214/214 _____ 1s 4ms/step - accuracy: 0.5652 - loss:
1.2117 - val_accuracy: 0.3483 - val_loss: 1.3937 - learning_rate:
0.0010
Epoch 9/100
214/214 _____ 1s 4ms/step - accuracy: 0.5770 - loss:
1.1926 - val_accuracy: 0.2691 - val_loss: 1.5440 - learning_rate:
0.0010
Epoch 10/100
214/214 _____ 1s 4ms/step - accuracy: 0.5749 - loss:
1.1969 - val_accuracy: 0.1059 - val_loss: 1.8392 - learning_rate:
0.0010
Epoch 11/100
214/214 _____ 1s 4ms/step - accuracy: 0.5802 - loss:
1.1857 - val_accuracy: 0.3550 - val_loss: 1.4103 - learning_rate:
0.0010
Epoch 12/100
214/214 _____ 1s 4ms/step - accuracy: 0.5702 - loss:
1.2028 - val_accuracy: 0.1636 - val_loss: 1.6293 - learning_rate:
0.0010
Epoch 13/100
214/214 _____ 1s 4ms/step - accuracy: 0.5716 - loss:
1.1939 - val_accuracy: 0.2969 - val_loss: 1.4467 - learning_rate:
0.0010
Epoch 14/100
205/214 _____ 0s 3ms/step - accuracy: 0.5801 - loss:
1.1836
```

WARNING:absl:You are saving your model as an HDF5 file via
`model.save()` or `keras.saving.save_model(model)`. This file format
is considered legacy. We recommend using instead the native Keras
format, e.g. `model.save('my_model.keras')` or
`keras.saving.save_model(model, 'my_model.keras')`.

```
214/214 _____ 1s 4ms/step - accuracy: 0.5800 - loss:
1.1837 - val_accuracy: 0.4762 - val_loss: 1.3186 - learning_rate:
5.0000e-04
Epoch 15/100
214/214 _____ 1s 4ms/step - accuracy: 0.5786 - loss:
1.1852 - val_accuracy: 0.3222 - val_loss: 1.4703 - learning_rate:
5.0000e-04
Epoch 16/100
214/214 _____ 1s 4ms/step - accuracy: 0.5851 - loss:
1.1813 - val_accuracy: 0.4458 - val_loss: 1.3346 - learning_rate:
5.0000e-04
Epoch 17/100
214/214 _____ 1s 4ms/step - accuracy: 0.5858 - loss:
1.1773 - val_accuracy: 0.2040 - val_loss: 1.6585 - learning_rate:
5.0000e-04
```

Epoch 18/100
205/214 _____ 0s 3ms/step - accuracy: 0.5795 - loss:
1.1861

WARNING:absl:You are saving your model as an HDF5 file via
`model.save()` or `keras.saving.save_model(model)`. This file format
is considered legacy. We recommend using instead the native Keras
format, e.g. `model.save('my_model.keras')` or
`keras.saving.save_model(model, 'my_model.keras')`.

214/214 _____ 1s 4ms/step - accuracy: 0.5796 - loss:
1.1859 - val_accuracy: 0.5155 - val_loss: 1.2298 - learning_rate:
5.0000e-04

Epoch 19/100

214/214 _____ 1s 4ms/step - accuracy: 0.5876 - loss:
1.1731 - val_accuracy: 0.3486 - val_loss: 1.4320 - learning_rate:
5.0000e-04

Epoch 20/100

203/214 _____ 0s 3ms/step - accuracy: 0.5820 - loss:
1.1800

WARNING:absl:You are saving your model as an HDF5 file via
`model.save()` or `keras.saving.save_model(model)`. This file format
is considered legacy. We recommend using instead the native Keras
format, e.g. `model.save('my_model.keras')` or
`keras.saving.save_model(model, 'my_model.keras')`.

214/214 _____ 1s 4ms/step - accuracy: 0.5819 - loss:
1.1803 - val_accuracy: 0.5419 - val_loss: 1.2123 - learning_rate:
5.0000e-04

Epoch 21/100

214/214 _____ 1s 4ms/step - accuracy: 0.5788 - loss:
1.1834 - val_accuracy: 0.4832 - val_loss: 1.3342 - learning_rate:
5.0000e-04

Epoch 22/100

214/214 _____ 1s 4ms/step - accuracy: 0.5878 - loss:
1.1811 - val_accuracy: 0.3893 - val_loss: 1.4068 - learning_rate:
5.0000e-04

Epoch 23/100

214/214 _____ 1s 4ms/step - accuracy: 0.5850 - loss:
1.1854 - val_accuracy: 0.5242 - val_loss: 1.2324 - learning_rate:
5.0000e-04

Epoch 24/100

214/214 _____ 1s 4ms/step - accuracy: 0.5886 - loss:
1.1736 - val_accuracy: 0.4400 - val_loss: 1.4004 - learning_rate:
5.0000e-04

Epoch 25/100

214/214 _____ 1s 4ms/step - accuracy: 0.5859 - loss:
1.1725 - val_accuracy: 0.3620 - val_loss: 1.5085 - learning_rate:
5.0000e-04

Epoch 26/100
214/214 _____ 1s 4ms/step - accuracy: 0.5801 - loss:
1.1852 - val_accuracy: 0.5296 - val_loss: 1.2378 - learning_rate:
2.5000e-04

Epoch 27/100
214/214 _____ 1s 4ms/step - accuracy: 0.5891 - loss:
1.1727 - val_accuracy: 0.5250 - val_loss: 1.2430 - learning_rate:
2.5000e-04

Epoch 28/100
214/214 _____ 1s 4ms/step - accuracy: 0.5933 - loss:
1.1605 - val_accuracy: 0.4924 - val_loss: 1.2837 - learning_rate:
2.5000e-04

Epoch 29/100
205/214 _____ 0s 3ms/step - accuracy: 0.5855 - loss:
1.1676

WARNING:absl:You are saving your model as an HDF5 file via
`model.save()` or `keras.saving.save_model(model)`. This file format
is considered legacy. We recommend using instead the native Keras
format, e.g. `model.save('my_model.keras')` or
`keras.saving.save_model(model, 'my_model.keras')`.

214/214 _____ 1s 4ms/step - accuracy: 0.5854 - loss:
1.1681 - val_accuracy: 0.5542 - val_loss: 1.2031 - learning_rate:
2.5000e-04

Epoch 30/100
205/214 _____ 0s 3ms/step - accuracy: 0.5848 - loss:
1.1785

WARNING:absl:You are saving your model as an HDF5 file via
`model.save()` or `keras.saving.save_model(model)`. This file format
is considered legacy. We recommend using instead the native Keras
format, e.g. `model.save('my_model.keras')` or
`keras.saving.save_model(model, 'my_model.keras')`.

214/214 _____ 1s 4ms/step - accuracy: 0.5849 - loss:
1.1784 - val_accuracy: 0.6104 - val_loss: 1.1583 - learning_rate:
2.5000e-04

Epoch 31/100
214/214 _____ 1s 4ms/step - accuracy: 0.5857 - loss:
1.1730 - val_accuracy: 0.5977 - val_loss: 1.1598 - learning_rate:
2.5000e-04

Epoch 32/100
214/214 _____ 1s 4ms/step - accuracy: 0.5868 - loss:
1.1758 - val_accuracy: 0.4605 - val_loss: 1.2976 - learning_rate:
2.5000e-04

Epoch 33/100
214/214 _____ 1s 4ms/step - accuracy: 0.5885 - loss:
1.1702 - val_accuracy: 0.4195 - val_loss: 1.3751 - learning_rate:
2.5000e-04

```

Epoch 34/100
214/214 _____ 1s 4ms/step - accuracy: 0.5856 - loss:
1.1731 - val_accuracy: 0.4420 - val_loss: 1.3492 - learning_rate:
2.5000e-04
Epoch 35/100
214/214 _____ 1s 4ms/step - accuracy: 0.5833 - loss:
1.1795 - val_accuracy: 0.5498 - val_loss: 1.2213 - learning_rate:
2.5000e-04
Epoch 36/100
214/214 _____ 1s 4ms/step - accuracy: 0.5836 - loss:
1.1798 - val_accuracy: 0.5945 - val_loss: 1.1611 - learning_rate:
1.2500e-04
Epoch 37/100
214/214 _____ 1s 4ms/step - accuracy: 0.5856 - loss:
1.1715 - val_accuracy: 0.5197 - val_loss: 1.2398 - learning_rate:
1.2500e-04
Epoch 38/100
214/214 _____ 1s 4ms/step - accuracy: 0.5865 - loss:
1.1784 - val_accuracy: 0.5137 - val_loss: 1.2424 - learning_rate:
1.2500e-04
Epoch 39/100
214/214 _____ 1s 4ms/step - accuracy: 0.5885 - loss:
1.1662 - val_accuracy: 0.5516 - val_loss: 1.2353 - learning_rate:
1.2500e-04
Epoch 40/100
214/214 _____ 1s 4ms/step - accuracy: 0.5856 - loss:
1.1738 - val_accuracy: 0.5189 - val_loss: 1.2419 - learning_rate:
1.2500e-04

```

Comprehensive Model Evaluation

```

# Load the Simple NN Classifier trained model
model.load_weights('/kaggle/working/simple_nn_classifier.h5')

```

```

# Predictions
y_pred_proba = model.predict(X_test)
y_pred = np.argmax(y_pred_proba, axis=1)

```

```

184/184 _____ 1s 4ms/step

```

```

# Classification Report
print("Classification Report of Simple NN Model:")
print(classification_report(y_test, y_pred))

```

```

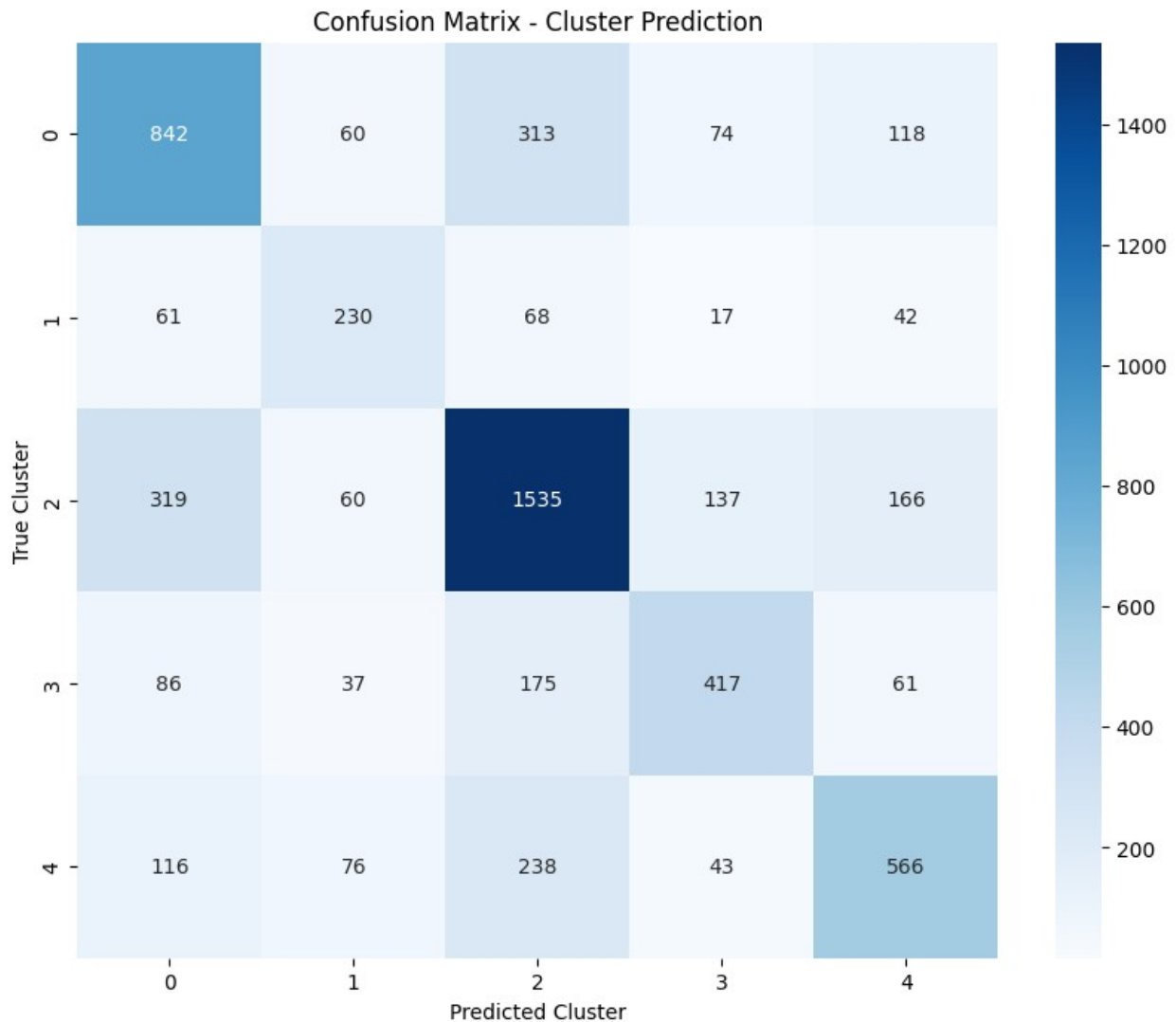
Classification Report of Simple NN Model:

```

	precision	recall	f1-score	support
0	0.59	0.60	0.59	1407

1	0.50	0.55	0.52	418	
2	0.66	0.69	0.68	2217	
3	0.61	0.54	0.57	776	
4	0.59	0.54	0.57	1039	
accuracy				0.61	5857
macro avg	0.59	0.58	0.59	5857	
weighted avg	0.61	0.61	0.61	5857	

```
# Confusion Matrix
plt.figure(figsize=(10, 8))
cm = confusion_matrix(y_test, y_pred)
sns.heatmap(cm, annot=True, fmt='d', cmap='Blues')
plt.title('Confusion Matrix - Cluster Prediction')
plt.ylabel('True Cluster')
plt.xlabel('Predicted Cluster')
plt.savefig('/kaggle/working/confusion_matrix.png', dpi=200)
plt.show()
```



Load the Previous Pipeline Outputs obtained from the Actual Data

```
# -----
# Robust pipeline using your existing outputs
# - Uses precomputed features + cluster labels as targets when no
#   human labels exist
# - Trains: (A) Feature-based classifier (fast) (B) Image-based fine-
#   tuned EfficientNetV2-S (strong)
# - Saves artifacts to /kaggle/working/
# -----
# ---- Paths (these are the outputs you saved earlier) ----
WORK = Path("/kaggle/working")
INPUT = Path("/kaggle/input/coral-metrics-and-clusters")
```

```

features_fp = INPUT / "coral_features.npy"
valid_paths_fp = INPUT / "valid_paths.csv"
clusters_fp = INPUT / "coral_clusters.csv"
metadata_fp = INPUT / "metadata.csv"
cluster_metrics_fp = INPUT / "cluster_color_metrics.csv"
tsne_fp = INPUT / "tsne_results.npy"

# Check files presence
for p in [features_fp, valid_paths_fp, clusters_fp]:
    if not p.exists():
        raise FileNotFoundError(f"Required file not found: {p}. This
script expects the files you produced earlier.")

print("Found required outputs.")

Found required outputs.

# Load
features = np.load(str(features_fp))
valid_paths = pd.read_csv(str(valid_paths_fp))['image_path'].tolist()
df_clusters = pd.read_csv(str(clusters_fp))

print("Features shape:", features.shape)
print("Valid paths len:", len(valid_paths))
print("Clusters shape:", df_clusters.shape)

Features shape: (39044, 1280)
Valid paths len: 39044
Clusters shape: (39044, 2)

# Map: image_path -> cluster label
df_clusters_map = df_clusters.set_index('image_path')
['cluster'].to_dict()
# Build dataset aligned to features list
aligned_labels = []
aligned_paths = []
for p in valid_paths:
    if p in df_clusters_map:
        aligned_labels.append(int(df_clusters_map[p]))
        aligned_paths.append(p)
    else:
        # fallback: skip if missing
        aligned_labels.append(-1)
        aligned_paths.append(p)
aligned_labels = np.array(aligned_labels)
# Remove any -1 entries (shouldn't happen given your earlier pipeline)
keep_mask = aligned_labels >= 0
features = features[keep_mask]
aligned_labels = aligned_labels[keep_mask]
aligned_paths = [p for i, p in enumerate(aligned_paths) if

```



```

keep_mask[i]]

print("Aligned features:", features.shape, "Aligned labels:",
      aligned_labels.shape)

Aligned features: (39044, 1280) Aligned labels: (39044,)

# Quick stats
n_classes = int(aligned_labels.max()) + 1
print("Pseudo-targets: clustering yielded", n_classes, "classes.")
print(pd.Series(aligned_labels).value_counts().sort_index())

Pseudo-targets: clustering yielded 5 classes.
0      9379
1      2785
2     14780
3      5175
4      6925
Name: count, dtype: int64

```

Baseline Traditional ML Model Training and Evaluation (Logistic Regression using GPU)

```

# -----
# 1) Baseline: Feature-based classifier (fast, strong)
# We'll train a simple pipeline (StandardScaler + LogisticRegression)
# -----
print("\n=== TRAIN: Feature-based classifier ===")
X = features
y = aligned_labels

=== TRAIN: Feature-based classifier ===

# split
X_train, X_val, y_train, y_val = train_test_split(X, y,
                                                    test_size=0.18, random_state=42, stratify=y)

# Scale
scaler = StandardScaler()
X_train_s = scaler.fit_transform(X_train)
X_val_s = scaler.transform(X_val)

# Move data to GPU
X_train_gpu = cp.asarray(X_train_s)
y_train_gpu = cp.asarray(y_train)

MAX_ITERS = 1000

```

```
print("Training LogisticRegression on GPU with single progress  
bar...")
```

```
# Progress bar (time-based approximation)
```

```
pbar = tqdm(total=MAX_ITERS, desc="GPU Logistic Regression",  
unit="iter")
```

```
# Start fit in background
```

```
model = LogisticRegression(max_iter=MAX_ITERS)  
model.fit(X_train_gpu, y_train_gpu)
```

```
# Update the bar to 100%
```

```
pbar.update(MAX_ITERS)  
pbar.close()
```

Training LogisticRegression on GPU with single progress bar...

GPU Logistic Regression: 0%| | 0/1000 [00:14<?, ?iter/s]

[2025-11-23 01:34:48.164] [CUML] [warning] L-BFGS: max iterations
reached

[2025-11-23 01:34:48.165] [CUML] [warning] Maximum iterations reached
before solver is converged. To increase model accuracy you can
increase the number of iterations (max_iter) or improve the scaling of
the input data.

```
# -----
```

```
# Validation Predictions (GPU -> CPU)
```

```
# -----
```

```
X_val_gpu = cp.asarray(X_val_s)  
y_pred_gpu = model.predict(X_val_gpu)  
yv_lr = cp.asnumpy(y_pred_gpu)
```

```
# -----
```

```
# Metrics
```

```
# -----
```

```
print("LR val acc:", accuracy_score(y_val, yv_lr))  
print("macro F1:", f1_score(y_val, yv_lr, average='macro'))
```

```
print("\nLogistic Regression Classification Report:")
```

```
print(classification_report(y_val, yv_lr))
```

LR val acc: 0.9883323847467274

macro F1: 0.9855681895094073

Logistic Regression Classification Report:

	precision	recall	f1-score	support
--	-----------	--------	----------	---------

0	0.99	0.99	0.99	1688
1	0.98	0.98	0.98	501
2	0.99	0.99	0.99	2660
3	0.98	0.98	0.98	932
4	0.99	0.98	0.99	1247
accuracy			0.99	7028
macro avg	0.99	0.98	0.99	7028
weighted avg	0.99	0.99	0.99	7028

```
# Save baseline
joblib.dump(
    {
        'scaler': scaler,
        'model_params': model.get_params()
    },
    WORK / "feature_logreg_pipeline.joblib"
)

print("Saved scaler and logistic regression params.")
Saved scaler and logistic regression params.
```

Image-based EfficientNetV2-S Model Training, Finetuning and Evaluation

```
# -----
# Strong image-based model (EfficientNetV2-S -> train to predict
clusters)
# Use cluster labels as pseudo-targets so you obtain an image model
ready for later re-training with true labels
# -----
print("\n=== TRAIN: Image-based EfficientNetV2-S (predicting cluster
IDs as targets) ===")

# prepare labels in one-hot for categorical crossentropy
y_onehot = to_categorical(aligned_labels, num_classes=n_classes)

# train/val split aligned with features -> reuse indices
# We'll compute indices from aligned_paths; create map of path->index
for train_test_split earlier
# Simple way: resplit using the same seed and stratify:
# train/val split
train_idx, val_idx = train_test_split(
    range(len(aligned_paths)),
    test_size=0.18,
```

```

        random_state=42,
        stratify=aligned_labels
    )
    train_paths = [aligned_paths[i] for i in train_idx]
    val_paths = [aligned_paths[i] for i in val_idx]
    y_train = y_onehot[train_idx]
    y_val = y_onehot[val_idx]

    print("Train images:", len(train_paths), "Val images:",
          len(val_paths))

=== TRAIN: Image-based EfficientNetV2-S (predicting cluster IDs as
targets) ===
Train images: 32016 Val images: 7028

```

Pipeline Preparation for Image Model Training

```

# -----
# Dataset pipeline
# -----
IMG_SIZE = 384
BATCH = 24
AUTOTUNE = tf.data.AUTOTUNE

def preprocess_image(path, label, training=True):
    # pure TF ops
    img = tf.io.read_file(path)
    img = tf.image.decode_jpeg(img, channels=3)
    img = tf.image.convert_image_dtype(img, tf.float32)

    if training:
        # First resize to >= IMG_SIZE
        img = tf.image.resize(img, [IMG_SIZE + 20, IMG_SIZE + 20])

        # Now safe to crop
        img = tf.image.random_crop(img, [IMG_SIZE, IMG_SIZE, 3])

        img = tf.image.random_flip_left_right(img)
        img = tf.image.random_flip_up_down(img)
        img = tf.image.random_brightness(img, 0.08)
        img = tf.image.random_contrast(img, 0.9, 1.1)
    else:
        img = tf.image.resize(img, [IMG_SIZE, IMG_SIZE])

    # EfficientNet scaling
    img = (img - 0.5) * 2.0

```

```

# Ensure float32
label = tf.cast(label, tf.float32)

return img, label

def make_ds(paths, labels, training=True, batch=BATCH):
    ds = tf.data.Dataset.from_tensor_slices((paths, labels))
    if training:
        ds = ds.shuffle(4096)

    ds = ds.map(
        lambda p, l: preprocess_image(p, l, training),
        num_parallel_calls=AUTOTUNE
    )

    # ds = ds.batch(batch).prefetch(AUTOTUNE)
    ds = ds.batch(batch)
    ds = ds.prefetch(AUTOTUNE)
    return ds

train_ds = make_ds(train_paths, y_train, training=True)
val_ds    = make_ds(val_paths, y_val, training=False)

```

Build EfficientnetV2S Model, Freeze backbone, Train Head and Evaluation

```

def build_image_model(num_classes):
    inp = Input(shape=(IMG_SIZE, IMG_SIZE, 3), name='image')
    base = EfficientNetV2S(include_top=False, weights='imagenet',
input_tensor=inp, pooling='avg')
    x = base.output
    x = layers.Dropout(0.35)(x)
    x = layers.Dense(512, activation='relu')(x)
    x = layers.BatchNormalization()(x)
    x = layers.Dropout(0.25)(x)
    out = layers.Dense(num_classes, activation='softmax',
dtype='float32')(x)
    model = Model(inp, out)
    return model

img_model = build_image_model(n_classes)
img_model.summary()

Model: "functional"

```

Layer (type)	Output Shape	Param #	Connected to
image (InputLayer)	(None, 384, 384, 3)	0	-
rescaling (Rescaling)	(None, 384, 384, 3)	0	image[0][0]
stem_conv (Conv2D)	(None, 192, 192, 24)	648	rescaling[0]
stem_bn (BatchNormalization)	(None, 192, 192, 24)	96	stem_conv[0]
stem_activation (Activation)	(None, 192, 192, 24)	0	stem_bn[0][0]
block1a_project_conv (Conv2D)	(None, 192, 192, 24)	5,184	stem_activation[0]
block1a_project_bn (BatchNormalization)	(None, 192, 192, 24)	96	block1a_project_conv[0]
block1a_project_activation (Activation)	(None, 192, 192, 24)	0	block1a_project_bn[0]

block1a_add (Add)	(None, 192, 192,	0	
block1a_project_...			
	24)		
stem_activation[...			
block1b_project_co...	(None, 192, 192,	5,184	
block1a_add[0][0]			
(Conv2D)	24)		
block1b_project_bn	(None, 192, 192,	96	
block1b_project_...			
(BatchNormalizatio...	24)		
block1b_project_ac...	(None, 192, 192,	0	
block1b_project_...			
(Activation)	24)		
block1b_drop	(None, 192, 192,	0	
block1b_project_...			
(Dropout)	24)		
block1b_add (Add)	(None, 192, 192,	0	
block1b_drop[0][...			
	24)		
block1a_add[0][0]			
block2a_expand_conv	(None, 96, 96,	20,736	
block1b_add[0][0]			
(Conv2D)	96)		
block2a_expand_bn	(None, 96, 96,	384	
block2a_expand_c...			
(BatchNormalizatio...	96)		

block2a_expand_act...	(None, 96, 96,	0	
block2a_expand_b...	(Activation)	96)	
block2a_project_co...	(None, 96, 96,	4,608	
block2a_expand_a...	(Conv2D)	48)	
block2a_project_bn	(None, 96, 96,	192	
block2a_project_...	(BatchNormalizatio...	48)	
block2b_expand_conv	(None, 96, 96,	82,944	
block2a_project_...	(Conv2D)	192)	
block2b_expand_bn	(None, 96, 96,	768	
block2b_expand_c...	(BatchNormalizatio...	192)	
block2b_expand_act...	(None, 96, 96,	0	
block2b_expand_b...	(Activation)	192)	
block2b_project_co...	(None, 96, 96,	9,216	
block2b_expand_a...	(Conv2D)	48)	
block2b_project_bn	(None, 96, 96,	192	
block2b_project_...	(BatchNormalizatio...	48)	

block2b_drop block2b_project_...	(None, 96, 96,	0	
(Dropout)	48)		
block2b_add (Add) block2b_drop[0][...	(None, 96, 96,	0	
	48)		
block2a_project_...			
block2c_expand_conv block2b_add[0][0]	(None, 96, 96,	82,944	
(Conv2D)	192)		
block2c_expand_bn block2c_expand_c...	(None, 96, 96,	768	
(BatchNormalizatio...	192)		
block2c_expand_act... block2c_expand_b...	(None, 96, 96,	0	
(Activation)	192)		
block2c_project_co... block2c_expand_a...	(None, 96, 96,	9,216	
(Conv2D)	48)		
block2c_project_bn block2c_project_...	(None, 96, 96,	192	
(BatchNormalizatio...	48)		
block2c_drop block2c_project_...	(None, 96, 96,	0	
(Dropout)	48)		

block2c_add (Add)	(None, 96, 96,	0
block2c_drop[0][...]	48)	
block2b_add[0][0]		
block2d_expand_conv	(None, 96, 96,	82,944
block2c_add[0][0]	(Conv2D)	192)
block2d_expand_bn	(None, 96, 96,	768
block2d_expand_c...	(BatchNormalizatio...	192)
block2d_expand_act...	(None, 96, 96,	0
block2d_expand_b...	(Activation)	192)
block2d_project_co...	(None, 96, 96,	9,216
block2d_expand_a...	(Conv2D)	48)
block2d_project_bn	(None, 96, 96,	192
block2d_project_...	(BatchNormalizatio...	48)
block2d_drop	(None, 96, 96,	0
block2d_project_...	(Dropout)	48)
block2d_add (Add)	(None, 96, 96,	0
block2d_drop[0][...]	48)	
block2c_add[0][0]		
block3a_expand_conv	(None, 48, 48,	82,944

block2d_add[0][0]	(Conv2D)	192)		
<hr/>				
block3a_expand_bn	(None, 48, 48,		768	
block3a_expand_c...	(BatchNormalizatio...	192)		
<hr/>				
block3a_expand_act...	(None, 48, 48,		0	
block3a_expand_b...	(Activation)	192)		
<hr/>				
block3a_project_co...	(None, 48, 48,		12,288	
block3a_expand_a...	(Conv2D)	64)		
<hr/>				
block3a_project_bn	(None, 48, 48,		256	
block3a_project_...	(BatchNormalizatio...	64)		
<hr/>				
block3b_expand_conv	(None, 48, 48,		147,456	
block3a_project_...	(Conv2D)	256)		
<hr/>				
block3b_expand_bn	(None, 48, 48,		1,024	
block3b_expand_c...	(BatchNormalizatio...	256)		
<hr/>				
block3b_expand_act...	(None, 48, 48,		0	
block3b_expand_b...	(Activation)	256)		
<hr/>				
block3b_project_co...	(None, 48, 48,		16,384	
block3b_expand_a...				

(Conv2D)	64)		
block3b_project_bn	(None, 48, 48,	256	
block3b_project_... (BatchNormalizatio...	64)		
block3b_drop	(None, 48, 48,	0	
block3b_project_... (Dropout)	64)		
block3b_add (Add)	(None, 48, 48,	0	
block3b_drop[0][... block3a_project_...	64)		
block3c_expand_conv	(None, 48, 48,	147,456	
block3b_add[0][0] (Conv2D)	256)		
block3c_expand_bn	(None, 48, 48,	1,024	
block3c_expand_c... (BatchNormalizatio...	256)		
block3c_expand_act...	(None, 48, 48,	0	
block3c_expand_b... (Activation)	256)		
block3c_project_co...	(None, 48, 48,	16,384	
block3c_expand_a... (Conv2D)	64)		
block3c_project_bn	(None, 48, 48,	256	
block3c_project_... (BatchNormalizatio...	64)		

block3c_drop block3c_project_...	(None, 48, 48, 64)	0	
block3c_add (Add) block3c_drop[0][...]	(None, 48, 48, 64)	0	
block3b_add[0][0]			
block3d_expand_conv block3c_add[0][0]	(None, 48, 48, 256)	147,456	
block3d_expand_bn block3d_expand_c...	(None, 48, 48, 256)	1,024	
block3d_expand_act... block3d_expand_b...	(None, 48, 48, 256)	0	
block3d_project_co... block3d_expand_a...	(None, 48, 48, 64)	16,384	
block3d_project_bn block3d_project_...	(None, 48, 48, 64)	256	
block3d_drop block3d_project_...	(None, 48, 48, 64)	0	

block3d_add (Add)	(None, 48, 48,	0	
block3d_drop[0][...]	64)		
block3c_add[0][0]			
block4a_expand_conv	(None, 48, 48,	16,384	
block3d_add[0][0]	(Conv2D)	256)	
block4a_expand_bn	(None, 48, 48,	1,024	
block4a_expand_c...	(BatchNormalizatio...	256)	
block4a_expand_act...	(None, 48, 48,	0	
block4a_expand_b...	(Activation)	256)	
block4a_dwconv2	(None, 24, 24,	2,304	
block4a_expand_a...	(DepthwiseConv2D)	256)	
block4a_bn	(None, 24, 24,	1,024	
block4a_dwconv2[...	(BatchNormalizatio...	256)	
block4a_activation	(None, 24, 24,	0	block4a_bn[0]
[0]	(Activation)	256)	
block4a_se_squeeze	(None, 256)	0	
block4a_activati...	(GlobalAveragePool...		

block4a_se_reshape	(None, 1, 1, 256)	0
block4a_se_squee... (Reshape)		
block4a_se_reduce	(None, 1, 1, 16)	4,112
block4a_se_resha... (Conv2D)		
block4a_se_expand	(None, 1, 1, 256)	4,352
block4a_se_reduc... (Conv2D)		
block4a_se_excite	(None, 24, 24,	0
block4a_activati... (Multiply)	256)	
block4a_se_expan...		
block4a_project_co...	(None, 24, 24,	32,768
block4a_se_excit... (Conv2D)	128)	
block4a_project_bn	(None, 24, 24,	512
block4a_project_... (BatchNormalizatio...	128)	
block4b_expand_conv	(None, 24, 24,	65,536
block4a_project_... (Conv2D)	512)	
block4b_expand_bn	(None, 24, 24,	2,048
block4b_expand_c... (BatchNormalizatio...	512)	
block4b_expand_act...	(None, 24, 24,	0

block4b_expand_b...	(Activation)	512)		
block4b_dwconv2	(None, 24, 24,		4,608	
block4b_expand_a...	(DepthwiseConv2D)	512)		
block4b_bn	(None, 24, 24,		2,048	
block4b_dwconv2[...	(BatchNormalizatio...	512)		
block4b_activation	(None, 24, 24,		0	block4b_bn[0]
[0]	(Activation)	512)		
block4b_se_squeeze	(None, 512)		0	
block4b_activati...	(GlobalAveragePool...			
block4b_se_reshape	(None, 1, 1, 512)		0	
block4b_se_squee...	(Reshape)			
block4b_se_reduce	(None, 1, 1, 32)		16,416	
block4b_se_resha...	(Conv2D)			
block4b_se_expand	(None, 1, 1, 512)		16,896	
block4b_se_reduc...	(Conv2D)			
block4b_se_excite	(None, 24, 24,		0	
block4b_activati...				

(Multiply)	512)		
block4b_se_expan...			
block4b_project_co...	(None, 24, 24,	65,536	
block4b_se_excit...			
(Conv2D)	128)		
block4b_project_bn	(None, 24, 24,	512	
block4b_project_...			
(BatchNormalizatio...	128)		
block4b_drop	(None, 24, 24,	0	
block4b_project_...			
(Dropout)	128)		
block4b_add (Add)	(None, 24, 24,	0	
block4b_drop[0][...			
	128)		
block4a_project_...			
block4c_expand_conv	(None, 24, 24,	65,536	
block4b_add[0][0]			
(Conv2D)	512)		
block4c_expand_bn	(None, 24, 24,	2,048	
block4c_expand_c...			
(BatchNormalizatio...	512)		
block4c_expand_act...	(None, 24, 24,	0	
block4c_expand_b...			
(Activation)	512)		
block4c_dwconv2	(None, 24, 24,	4,608	
block4c_expand_a...			
(DepthwiseConv2D)	512)		

block4c_bn	(None, 24, 24,	2,048	
block4c_dwconv2[...	(BatchNormalizatio... 512)		
block4c_activation	(None, 24, 24,	0	block4c_bn[0]
[0]	(Activation) 512)		
block4c_se_squeeze	(None, 512)	0	
block4c_activati...	(GlobalAveragePool...		
block4c_se_reshape	(None, 1, 1, 512)	0	
block4c_se_squee...	(Reshape)		
block4c_se_reduce	(None, 1, 1, 32)	16,416	
block4c_se_resha...	(Conv2D)		
block4c_se_expand	(None, 1, 1, 512)	16,896	
block4c_se_reduc...	(Conv2D)		
block4c_se_excite	(None, 24, 24,	0	
block4c_activati...	(Multiply) 512)		
block4c_se_expan...			
block4c_project_co...	(None, 24, 24,	65,536	
block4c_se_excit...	(Conv2D) 128)		

block4c_project_bn block4c_project_...	(None, 24, 24, (BatchNormalizatio...	512	
(BatchNormalizatio...	128)		
block4c_drop block4c_project_...	(None, 24, 24, (Dropout)	0	
(Dropout)	128)		
block4c_add (Add) block4c_drop[0][... block4b_add[0][0]	(None, 24, 24, 128)	0	
block4d_expand_conv block4c_add[0][0]	(None, 24, 24, (Conv2D)	65,536	
(Conv2D)	512)		
block4d_expand_bn block4d_expand_c...	(None, 24, 24, (BatchNormalizatio...	2,048	
(BatchNormalizatio...	512)		
block4d_expand_act... block4d_expand_b...	(None, 24, 24, (Activation)	0	
(Activation)	512)		
block4d_dwconv2 block4d_expand_a...	(None, 24, 24, (DepthwiseConv2D)	4,608	
(DepthwiseConv2D)	512)		
block4d_bn block4d_dwconv2[... block4d_dwconv2[...	(None, 24, 24, (BatchNormalizatio...	2,048	
(BatchNormalizatio...	512)		

block4d_activation [0]	(None, 24, 24,	0	block4d_bn[0]
(Activation)	512)		
block4d_se_squeeze block4d_activati...	(None, 512)	0	
(GlobalAveragePool...			
block4d_se_reshape block4d_se_squee...	(None, 1, 1, 512)	0	
(Reshape)			
block4d_se_reduce block4d_se_resha...	(None, 1, 1, 32)	16,416	
(Conv2D)			
block4d_se_expand block4d_se_reduc...	(None, 1, 1, 512)	16,896	
(Conv2D)			
block4d_se_excite block4d_activati...	(None, 24, 24,	0	
(Multiply)	512)		
block4d_se_expan...			
block4d_project_co... block4d_se_excit...	(None, 24, 24,	65,536	
(Conv2D)	128)		
block4d_project_bn block4d_project_...	(None, 24, 24,	512	
(BatchNormalizatio...	128)		

block4d_drop block4d_project_... (Dropout)	(None, 24, 24, 128)	0	
block4d_add (Add) block4d_drop[0][... block4c_add[0][0]	(None, 24, 24, 128)	0	
block4e_expand_conv block4d_add[0][0] (Conv2D)	(None, 24, 24, 512)	65,536	
block4e_expand_bn block4e_expand_c... (BatchNormalizatio...	(None, 24, 24, 512)	2,048	
block4e_expand_act... block4e_expand_b... (Activation)	(None, 24, 24, 512)	0	
block4e_dwconv2 block4e_expand_a... (DepthwiseConv2D)	(None, 24, 24, 512)	4,608	
block4e_bn block4e_dwconv2[... (BatchNormalizatio...	(None, 24, 24, 512)	2,048	
block4e_activation [0] (Activation)	(None, 24, 24, 512)	0	block4e_bn[0]
block4e_se_squeeze	(None, 512)	0	

block4e_activati...	(GlobalAveragePool...		
block4e_se_reshape	(None, 1, 1, 512)	0	
block4e_se_squee...	(Reshape)		
block4e_se_reduce	(None, 1, 1, 32)	16,416	
block4e_se_resha...	(Conv2D)		
block4e_se_expand	(None, 1, 1, 512)	16,896	
block4e_se_reduc...	(Conv2D)		
block4e_se_excite	(None, 24, 24,	0	
block4e_activati...	(Multiply)	512)	
block4e_se_expan...			
block4e_project_co...	(None, 24, 24,	65,536	
block4e_se_excit...	(Conv2D)	128)	
block4e_project_bn	(None, 24, 24,	512	
block4e_project_...	(BatchNormalizatio...	128)	
block4e_drop	(None, 24, 24,	0	
block4e_project_...	(Dropout)	128)	
block4e_add (Add)	(None, 24, 24,	0	
block4e_drop[0][...			

block4d_add[0][0]	128)		
block4f_expand_conv	(None, 24, 24,	65,536	
block4e_add[0][0]	(Conv2D)	512)	
block4f_expand_bn	(None, 24, 24,	2,048	
block4f_expand_c...	(BatchNormalizatio...	512)	
block4f_expand_act...	(None, 24, 24,	0	
block4f_expand_b...	(Activation)	512)	
block4f_dwconv2	(None, 24, 24,	4,608	
block4f_expand_a...	(DepthwiseConv2D)	512)	
block4f_bn	(None, 24, 24,	2,048	
block4f_dwconv2[...	(BatchNormalizatio...	512)	
block4f_activation	(None, 24, 24,	0	block4f_bn[0]
[0]	(Activation)	512)	
block4f_se_squeeze	(None, 512)	0	
block4f_activati...	(GlobalAveragePool...		
block4f_se_reshape	(None, 1, 1, 512)	0	
block4f_se_squee...	(Reshape)		

block4f_se_reduce	(None, 1, 1, 32)	16,416	
block4f_se_resha...			
(Conv2D)			
block4f_se_expand	(None, 1, 1, 512)	16,896	
block4f_se_reduc...			
(Conv2D)			
block4f_se_excite	(None, 24, 24,	0	
block4f_activati...			
(Multiply)	512)		
block4f_se_expan...			
block4f_project_co...	(None, 24, 24,	65,536	
block4f_se_excit...			
(Conv2D)	128)		
block4f_project_bn	(None, 24, 24,	512	
block4f_project_...			
(BatchNormalizatio...	128)		
block4f_drop	(None, 24, 24,	0	
block4f_project_...			
(Dropout)	128)		
block4f_add (Add)	(None, 24, 24,	0	
block4f_drop[0][...			
	128)		
block4e_add[0][0]			
block5a_expand_conv	(None, 24, 24,	98,304	
block4f_add[0][0]			
(Conv2D)	768)		

block5a_expand_bn	(None, 24, 24,	3,072		
block5a_expand_c...	(BatchNormalizatio...	768)		
block5a_expand_act...	(None, 24, 24,	0		
block5a_expand_b...	(Activation)	768)		
block5a_dwconv2	(None, 24, 24,	6,912		
block5a_expand_a...	(DepthwiseConv2D)	768)		
block5a_bn	(None, 24, 24,	3,072		
block5a_dwconv2[...	(BatchNormalizatio...	768)		
block5a_activation	(None, 24, 24,	0	block5a_bn[0]	
[0]	(Activation)	768)		
block5a_se_squeeze	(None, 768)	0		
block5a_activati...	(GlobalAveragePool...			
block5a_se_reshape	(None, 1, 1, 768)	0		
block5a_se_squee...	(Reshape)			
block5a_se_reduce	(None, 1, 1, 32)	24,608		
block5a_se_resha...	(Conv2D)			

block5a_se_expand block5a_se_reduc...	(None, 1, 1, 768)	25,344	
(Conv2D)			
block5a_se_excite block5a_activati...	(None, 24, 24,	0	
(Multiply)	768)		
block5a_se_expan...			
block5a_project_co...	(None, 24, 24,	122,880	
block5a_se_excit...	(Conv2D)	160)	
block5a_project_bn	(None, 24, 24,	640	
block5a_project_...	(BatchNormalizatio...	160)	
block5b_expand_conv	(None, 24, 24,	153,600	
block5a_project_...	(Conv2D)	960)	
block5b_expand_bn	(None, 24, 24,	3,840	
block5b_expand_c...	(BatchNormalizatio...	960)	
block5b_expand_act...	(None, 24, 24,	0	
block5b_expand_b...	(Activation)	960)	
block5b_dwconv2	(None, 24, 24,	8,640	
block5b_expand_a...	(DepthwiseConv2D)	960)	
block5b_bn	(None, 24, 24,	3,840	

block5b_dwconv2[...	(BatchNormalizatio...	960)		
block5b_activation	(None, 24, 24,		0	block5b_bn[0]
[0]	(Activation)	960)		
block5b_se_squeeze	(None, 960)		0	
block5b_activati...	(GlobalAveragePool...			
block5b_se_reshape	(None, 1, 1, 960)		0	
block5b_se_squee...	(Reshape)			
block5b_se_reduce	(None, 1, 1, 40)		38,440	
block5b_se_resha...	(Conv2D)			
block5b_se_expand	(None, 1, 1, 960)		39,360	
block5b_se_reduc...	(Conv2D)			
block5b_se_excite	(None, 24, 24,		0	
block5b_activati...	(Multiply)	960)		
block5b_se_expan...				
block5b_project_co...	(None, 24, 24,		153,600	
block5b_se_excit...	(Conv2D)	160)		
block5b_project_bn	(None, 24, 24,		640	
block5b_project_...				

(BatchNormalizatio...	160)		
block5b_drop	(None, 24, 24,	0	
block5b_project_...	(Dropout)	160)	
block5b_add (Add)	(None, 24, 24,	0	
block5b_drop[0][...		160)	
block5a_project_...			
block5c_expand_conv	(None, 24, 24,	153,600	
block5b_add[0][0]	(Conv2D)	960)	
block5c_expand_bn	(None, 24, 24,	3,840	
block5c_expand_c...	(BatchNormalizatio...	960)	
block5c_expand_act...	(None, 24, 24,	0	
block5c_expand_b...	(Activation)	960)	
block5c_dwconv2	(None, 24, 24,	8,640	
block5c_expand_a...	(DepthwiseConv2D)	960)	
block5c_bn	(None, 24, 24,	3,840	
block5c_dwconv2[...	(BatchNormalizatio...	960)	
block5c_activation	(None, 24, 24,	0	block5c_bn[0]
[0]	(Activation)	960)	

block5c_se_squeeze	(None, 960)	0	
block5c_activation_1	(GlobalAveragePool...		
block5c_se_reshape	(None, 1, 1, 960)	0	
block5c_se_squeeze_1	(Reshape)		
block5c_se_reduce	(None, 1, 1, 40)	38,440	
block5c_se_reshape_1	(Conv2D)		
block5c_se_expand	(None, 1, 1, 960)	39,360	
block5c_se_reduce_1	(Conv2D)		
block5c_se_excite	(None, 24, 24,	0	
block5c_activation_2	(Multiply)	960)	
block5c_se_expand_1			
block5c_project_conv	(None, 24, 24,	153,600	
block5c_se_excite_1	(Conv2D)	160)	
block5c_project_bn	(None, 24, 24,	640	
block5c_project_1	(BatchNormalizatio...	160)	
block5c_drop	(None, 24, 24,	0	
block5c_project_2	(Dropout)	160)	

block5c_add (Add)	(None, 24, 24,	0	
block5c_drop[0][...	160)		
block5b_add[0][0]			
block5d_expand_conv	(None, 24, 24,	153,600	
block5c_add[0][0]	(Conv2D)	960)	
block5d_expand_bn	(None, 24, 24,	3,840	
block5d_expand_c...	(BatchNormalizatio...	960)	
block5d_expand_act...	(None, 24, 24,	0	
block5d_expand_b...	(Activation)	960)	
block5d_dwconv2	(None, 24, 24,	8,640	
block5d_expand_a...	(DepthwiseConv2D)	960)	
block5d_bn	(None, 24, 24,	3,840	
block5d_dwconv2[...	(BatchNormalizatio...	960)	
block5d_activation	(None, 24, 24,	0	block5d_bn[0]
[0]	(Activation)	960)	
block5d_se_squeeze	(None, 960)	0	
block5d_activati...	(GlobalAveragePool...		

block5d_se_reshape	(None, 1, 1, 960)	0
block5d_se_squee...	(Reshape)	
block5d_se_reduce	(None, 1, 1, 40)	38,440
block5d_se_resha...	(Conv2D)	
block5d_se_expand	(None, 1, 1, 960)	39,360
block5d_se_reduc...	(Conv2D)	
block5d_se_excite	(None, 24, 24,	0
block5d_activati...	(Multiply)	960)
block5d_se_expan...		
block5d_project_co...	(None, 24, 24,	153,600
block5d_se_excit...	(Conv2D)	160)
block5d_project_bn	(None, 24, 24,	640
block5d_project_...	(BatchNormalizatio...	160)
block5d_drop	(None, 24, 24,	0
block5d_project_...	(Dropout)	160)
block5d_add (Add)	(None, 24, 24,	0
block5d_drop[0][...		160)
block5c_add[0][0]		

block5e_expand_conv block5d_add[0][0]	(None, 24, 24, 960)	153,600	
block5e_expand_bn block5e_expand_c...	(None, 24, 24, 960)	3,840	
block5e_expand_act... block5e_expand_b...	(None, 24, 24, 960)	0	
block5e_dwconv2 block5e_expand_a...	(None, 24, 24, 960)	8,640	
block5e_bn block5e_dwconv2[...	(None, 24, 24, 960)	3,840	
block5e_activation [0]	(None, 24, 24, 960)	0	block5e_bn[0]
block5e_se_squeeze block5e_activati...	(None, 960)	0	
block5e_se_reshape block5e_se_squee...	(None, 1, 1, 960)	0	
block5e_se_reduce	(None, 1, 1, 40)	38,440	

block5e_se_resha... (Conv2D)			
block5e_se_expand block5e_se_reduc... (Conv2D)	(None, 1, 1, 960)	39,360	
block5e_se_excite block5e_activati... (Multiply)	(None, 24, 24, 960)	0	
block5e_se_expan...			
block5e_project_co... block5e_se_excit... (Conv2D)	(None, 24, 24, 160)	153,600	
block5e_project_bn block5e_project_... (BatchNormalizatio...	(None, 24, 24, 160)	640	
block5e_drop block5e_project_... (Dropout)	(None, 24, 24, 160)	0	
block5e_add (Add) block5e_drop[0][... block5d_add[0][0]	(None, 24, 24, 160)	0	
block5f_expand_conv block5e_add[0][0] (Conv2D)	(None, 24, 24, 960)	153,600	
block5f_expand_bn block5f_expand_c...	(None, 24, 24, 3,840)		

(BatchNormalization)	960		
block5f_expand_activation	(None, 24, 24, 1)	0	
block5f_expand_block5f_activation	(Activation)	960	
block5f_dwconv2	(None, 24, 24, 1)	8,640	
block5f_expand_block5f_dwconv2	(DepthwiseConv2D)	960	
block5f_bn	(None, 24, 24, 1)	3,840	
block5f_dwconv2_block5f_bn	(BatchNormalization)	960	
block5f_activation	(None, 24, 24, 1)	0	block5f_bn[0]
block5f_activation_block5f_activation	(Activation)	960	
block5f_se_squeeze	(None, 960)	0	
block5f_activation_block5f_se_squeeze	(GlobalAveragePooling2D)		
block5f_se_reshape	(None, 1, 1, 960)	0	
block5f_se_squeeze_block5f_se_reshape	(Reshape)		
block5f_se_reduce	(None, 1, 1, 40)	38,440	
block5f_se_reshape_block5f_se_reduce	(Conv2D)		
block5f_se_expand	(None, 1, 1, 960)	39,360	
block5f_se_reduce_block5f_se_expand	(Conv2D)		

block5f_se_excite	(None, 24, 24,	0	
block5f_activati...	(Multiply)	960)	
block5f_se_expan...			
block5f_project_co...	(None, 24, 24,	153,600	
block5f_se_excit...	(Conv2D)	160)	
block5f_project_bn	(None, 24, 24,	640	
block5f_project_...	(BatchNormalizatio...	160)	
block5f_drop	(None, 24, 24,	0	
block5f_project_...	(Dropout)	160)	
block5f_add (Add)	(None, 24, 24,	0	
block5f_drop[0][...		160)	
block5e_add[0][0]			
block5g_expand_conv	(None, 24, 24,	153,600	
block5f_add[0][0]	(Conv2D)	960)	
block5g_expand_bn	(None, 24, 24,	3,840	
block5g_expand_c...	(BatchNormalizatio...	960)	
block5g_expand_act...	(None, 24, 24,	0	
block5g_expand_b...	(Activation)	960)	

block5g_dwconv2	(None, 24, 24,	8,640		
block5g_expand_a...	(DepthwiseConv2D)	960)		
block5g_bn	(None, 24, 24,	3,840		
block5g_dwconv2[...	(BatchNormalizatio...	960)		
block5g_activation	(None, 24, 24,	0	block5g_bn[0]	
[0]	(Activation)	960)		
block5g_se_squeeze	(None, 960)	0		
block5g_activati...	(GlobalAveragePool...			
block5g_se_reshape	(None, 1, 1, 960)	0		
block5g_se_squee...	(Reshape)			
block5g_se_reduce	(None, 1, 1, 40)	38,440		
block5g_se_resha...	(Conv2D)			
block5g_se_expand	(None, 1, 1, 960)	39,360		
block5g_se_reduc...	(Conv2D)			
block5g_se_excite	(None, 24, 24,	0		
block5g_activati...	(Multiply)	960)		
block5g_se_expan...				

block5g_project_conv2d	(None, 24, 24, 160)	153,600
block5g_se_excit_conv2d	(Conv2D)	
block5g_project_bn	(None, 24, 24, 160)	640
block5g_project_conv2d	(BatchNormalization)	
block5g_drop	(None, 24, 24, 160)	0
block5g_project_conv2d	(Dropout)	
block5g_add	(Add)	0
block5g_drop[0]	(None, 24, 24, 160)	
block5f_add[0]		
block5h_expand_conv2d	(None, 24, 24, 960)	153,600
block5g_add[0]		
block5h_expand_bn	(None, 24, 24, 960)	3,840
block5h_expand_conv2d	(BatchNormalization)	
block5h_expand_activation	(None, 24, 24, 960)	0
block5h_expand_bn	(Activation)	
block5h_dwconv2d	(None, 24, 24, 960)	8,640
block5h_expand_activation	(DepthwiseConv2D)	
block5h_bn	(None, 24, 24, 960)	3,840

block5h_dwconv2[...	(BatchNormalizatio...	960)		
block5h_activation	(None, 24, 24,		0	block5h_bn[0]
[0]	(Activation)	960)		
block5h_se_squeeze	(None, 960)		0	
block5h_activati...	(GlobalAveragePool...			
block5h_se_reshape	(None, 1, 1, 960)		0	
block5h_se_squee...	(Reshape)			
block5h_se_reduce	(None, 1, 1, 40)		38,440	
block5h_se_resha...	(Conv2D)			
block5h_se_expand	(None, 1, 1, 960)		39,360	
block5h_se_reduc...	(Conv2D)			
block5h_se_excite	(None, 24, 24,		0	
block5h_activati...	(Multiply)	960)		
block5h_se_expan...				
block5h_project_co...	(None, 24, 24,		153,600	
block5h_se_excit...	(Conv2D)	160)		
block5h_project_bn	(None, 24, 24,		640	
block5h_project_...				

(BatchNormalizatio...	160)		
block5h_drop	(None, 24, 24,	0	
block5h_project_...	(Dropout)	160)	
block5h_add (Add)	(None, 24, 24,	0	
block5h_drop[0][...		160)	
block5g_add[0][0]			
block5i_expand_conv	(None, 24, 24,	153,600	
block5h_add[0][0]	(Conv2D)	960)	
block5i_expand_bn	(None, 24, 24,	3,840	
block5i_expand_c...	(BatchNormalizatio...	960)	
block5i_expand_act...	(None, 24, 24,	0	
block5i_expand_b...	(Activation)	960)	
block5i_dwconv2	(None, 24, 24,	8,640	
block5i_expand_a...	(DepthwiseConv2D)	960)	
block5i_bn	(None, 24, 24,	3,840	
block5i_dwconv2[...	(BatchNormalizatio...	960)	
block5i_activation	(None, 24, 24,	0	block5i_bn[0]
[0]	(Activation)	960)	

block5i_se_squeeze	(None, 960)	0	
block5i_activation_1	(GlobalAveragePool...		
block5i_se_reshape	(None, 1, 1, 960)	0	
block5i_se_squeeze_1	(Reshape)		
block5i_se_reduce	(None, 1, 1, 40)	38,440	
block5i_se_reshape_1	(Conv2D)		
block5i_se_expand	(None, 1, 1, 960)	39,360	
block5i_se_reduce_1	(Conv2D)		
block5i_se_excite	(None, 24, 24,	0	
block5i_activation_2	(Multiply)	960)	
block5i_se_expand_1			
block5i_project_conv	(None, 24, 24,	153,600	
block5i_se_excite_1	(Conv2D)	160)	
block5i_project_bn	(None, 24, 24,	640	
block5i_project_1	(BatchNormalizatio...	160)	
block5i_drop	(None, 24, 24,	0	
block5i_project_2	(Dropout)	160)	

block5i_add (Add)	(None, 24, 24,	0	
block5i_drop[0][...]	160)		
block5h_add[0][0]			
block6a_expand_conv	(None, 24, 24,	153,600	
block5i_add[0][0]	(Conv2D)	960)	
block6a_expand_bn	(None, 24, 24,	3,840	
block6a_expand_c...	(BatchNormalizatio...	960)	
block6a_expand_act...	(None, 24, 24,	0	
block6a_expand_b...	(Activation)	960)	
block6a_dwconv2	(None, 12, 12,	8,640	
block6a_expand_a...	(DepthwiseConv2D)	960)	
block6a_bn	(None, 12, 12,	3,840	
block6a_dwconv2[...	(BatchNormalizatio...	960)	
block6a_activation	(None, 12, 12,	0	block6a_bn[0]
[0]	(Activation)	960)	
block6a_se_squeeze	(None, 960)	0	
block6a_activati...	(GlobalAveragePool...		

block6a_se_reshape	(None, 1, 1, 960)	0
block6a_se_squee... (Reshape)		
block6a_se_reduce	(None, 1, 1, 40)	38,440
block6a_se_resha... (Conv2D)		
block6a_se_expand	(None, 1, 1, 960)	39,360
block6a_se_reduc... (Conv2D)		
block6a_se_excite	(None, 12, 12,	0
block6a_activati... (Multiply)	960)	
block6a_se_expan...		
block6a_project_co...	(None, 12, 12,	245,760
block6a_se_excit... (Conv2D)	256)	
block6a_project_bn	(None, 12, 12,	1,024
block6a_project_... (BatchNormalizatio...	256)	
block6b_expand_conv	(None, 12, 12,	393,216
block6a_project_... (Conv2D)	1536)	
block6b_expand_bn	(None, 12, 12,	6,144
block6b_expand_c... (BatchNormalizatio...	1536)	

block6b_expand_act...	(None, 12, 12,	0	
block6b_expand_b...	(Activation)	1536)	
block6b_dwconv2	(None, 12, 12,	13,824	
block6b_expand_a...	(DepthwiseConv2D)	1536)	
block6b_bn	(None, 12, 12,	6,144	
block6b_dwconv2[...	(BatchNormalizatio...	1536)	
block6b_activation	(None, 12, 12,	0	block6b_bn[0]
[0]	(Activation)	1536)	
block6b_se_squeeze	(None, 1536)	0	
block6b_activati...	(GlobalAveragePool...		
block6b_se_reshape	(None, 1, 1,	0	
block6b_se_squee...	(Reshape)	1536)	
block6b_se_reduce	(None, 1, 1, 64)	98,368	
block6b_se_resha...	(Conv2D)		
block6b_se_expand	(None, 1, 1,	99,840	
block6b_se_reduc...	(Conv2D)	1536)	
block6b_se_excite	(None, 12, 12,	0	

block6b_activati...	(Multiply)	1536)		
block6b_se_expan...				
block6b_project_co...	(None, 12, 12,	393,216		
block6b_se_excit...	(Conv2D)	256)		
block6b_project_bn	(None, 12, 12,	1,024		
block6b_project_...	(BatchNormalizatio...	256)		
block6b_drop	(None, 12, 12,	0		
block6b_project_...	(Dropout)	256)		
block6b_add (Add)	(None, 12, 12,	0		
block6b_drop[0][...		256)		
block6a_project_...				
block6c_expand_conv	(None, 12, 12,	393,216		
block6b_add[0][0]	(Conv2D)	1536)		
block6c_expand_bn	(None, 12, 12,	6,144		
block6c_expand_c...	(BatchNormalizatio...	1536)		
block6c_expand_act...	(None, 12, 12,	0		
block6c_expand_b...	(Activation)	1536)		
block6c_dwconv2	(None, 12, 12,	13,824		
block6c_expand_a...				

(DepthwiseConv2D)	1536)		
block6c_bn	(None, 12, 12,	6,144	
block6c_dwconv2[...	(BatchNormalizatio...	1536)	
block6c_activation	(None, 12, 12,	0	block6c_bn[0]
[0]	(Activation)	1536)	
block6c_se_squeeze	(None, 1536)	0	
block6c_activati...	(GlobalAveragePool...		
block6c_se_reshape	(None, 1, 1,	0	
block6c_se_squee...	(Reshape)	1536)	
block6c_se_reduce	(None, 1, 1, 64)	98,368	
block6c_se_resha...	(Conv2D)		
block6c_se_expand	(None, 1, 1,	99,840	
block6c_se_reduc...	(Conv2D)	1536)	
block6c_se_excite	(None, 12, 12,	0	
block6c_activati...	(Multiply)	1536)	
block6c_se_expan...			
block6c_project_co...	(None, 12, 12,	393,216	
block6c_se_excit...	(Conv2D)	256)	

block6c_project_bn	(None, 12, 12,	1,024	
block6c_project_... (BatchNormalizatio...	256)		
block6c_drop	(None, 12, 12,	0	
block6c_project_... (Dropout)	256)		
block6c_add (Add)	(None, 12, 12,	0	
block6c_drop[0][... block6b_add[0][0]	256)		
block6d_expand_conv	(None, 12, 12,	393,216	
block6c_add[0][0] (Conv2D)	1536)		
block6d_expand_bn	(None, 12, 12,	6,144	
block6d_expand_c... (BatchNormalizatio...	1536)		
block6d_expand_act...	(None, 12, 12,	0	
block6d_expand_b... (Activation)	1536)		
block6d_dwconv2	(None, 12, 12,	13,824	
block6d_expand_a... (DepthwiseConv2D)	1536)		
block6d_bn	(None, 12, 12,	6,144	
block6d_dwconv2[... (BatchNormalizatio...	1536)		

block6d_activation [0]	(None, 12, 12, (Activation)	1536)	0	block6d_bn[0]
block6d_se_squeeze block6d_activati...	(None, 1536) (GlobalAveragePool...		0	
block6d_se_reshape block6d_se_squee...	(None, 1, 1, (Reshape)	1536)	0	
block6d_se_reduce block6d_se_resha...	(None, 1, 1, 64) (Conv2D)		98,368	
block6d_se_expand block6d_se_reduc...	(None, 1, 1, (Conv2D)	1536)	99,840	
block6d_se_excite block6d_activati...	(None, 12, 12, (Multiply)	1536)	0	
block6d_se_expan...				
block6d_project_co... block6d_se_excit...	(None, 12, 12, (Conv2D)	256)	393,216	
block6d_project_bn block6d_project_...	(None, 12, 12, (BatchNormalizatio...	256)	1,024	

block6d_drop	(None, 12, 12,	0	
block6d_project_... (Dropout)	256)		
block6d_add (Add)	(None, 12, 12,	0	
block6d_drop[0][... block6c_add[0][0]	256)		
block6e_expand_conv	(None, 12, 12,	393,216	
block6d_add[0][0] (Conv2D)	1536)		
block6e_expand_bn	(None, 12, 12,	6,144	
block6e_expand_c... (BatchNormalizatio...	1536)		
block6e_expand_act...	(None, 12, 12,	0	
block6e_expand_b... (Activation)	1536)		
block6e_dwconv2	(None, 12, 12,	13,824	
block6e_expand_a... (DepthwiseConv2D)	1536)		
block6e_bn	(None, 12, 12,	6,144	
block6e_dwconv2[... (BatchNormalizatio...	1536)		
block6e_activation [0]	(None, 12, 12,	0	block6e_bn[0]
(Activation)	1536)		
block6e_se_squeeze	(None, 1536)	0	

block6e_activati...	(GlobalAveragePool...		
block6e_se_reshape	(None, 1, 1,	0	
block6e_se_squee...	(Reshape)	1536)	
block6e_se_reduce	(None, 1, 1, 64)	98,368	
block6e_se_resha...	(Conv2D)		
block6e_se_expand	(None, 1, 1,	99,840	
block6e_se_reduc...	(Conv2D)	1536)	
block6e_se_excite	(None, 12, 12,	0	
block6e_activati...	(Multiply)	1536)	
block6e_se_expan...			
block6e_project_co...	(None, 12, 12,	393,216	
block6e_se_excit...	(Conv2D)	256)	
block6e_project_bn	(None, 12, 12,	1,024	
block6e_project_...	(BatchNormalizatio...	256)	
block6e_drop	(None, 12, 12,	0	
block6e_project_...	(Dropout)	256)	
block6e_add (Add)	(None, 12, 12,	0	
block6e_drop[0][...			

block6d_add[0][0]	256)		
block6f_expand_conv	(None, 12, 12,	393,216	
block6e_add[0][0]	(Conv2D)	1536)	
block6f_expand_bn	(None, 12, 12,	6,144	
block6f_expand_c...	(BatchNormalizatio...	1536)	
block6f_expand_act...	(None, 12, 12,	0	
block6f_expand_b...	(Activation)	1536)	
block6f_dwconv2	(None, 12, 12,	13,824	
block6f_expand_a...	(DepthwiseConv2D)	1536)	
block6f_bn	(None, 12, 12,	6,144	
block6f_dwconv2[...	(BatchNormalizatio...	1536)	
block6f_activation	(None, 12, 12,	0	block6f_bn[0]
[0]	(Activation)	1536)	
block6f_se_squeeze	(None, 1536)	0	
block6f_activati...	(GlobalAveragePool...		
block6f_se_reshape	(None, 1, 1,	0	
block6f_se_squee...	(Reshape)	1536)	

block6f_se_reduce	(None, 1, 1, 64)	98,368	
block6f_se_resha...			
(Conv2D)			
block6f_se_expand	(None, 1, 1,	99,840	
block6f_se_reduc...			
(Conv2D)	1536)		
block6f_se_excite	(None, 12, 12,	0	
block6f_activati...			
(Multiply)	1536)		
block6f_se_expan...			
block6f_project_co...	(None, 12, 12,	393,216	
block6f_se_excit...			
(Conv2D)	256)		
block6f_project_bn	(None, 12, 12,	1,024	
block6f_project_...			
(BatchNormalizatio...	256)		
block6f_drop	(None, 12, 12,	0	
block6f_project_...			
(Dropout)	256)		
block6f_add (Add)	(None, 12, 12,	0	
block6f_drop[0][...			
	256)		
block6e_add[0][0]			
block6g_expand_conv	(None, 12, 12,	393,216	
block6f_add[0][0]			
(Conv2D)	1536)		

block6g_expand_bn	(None, 12, 12,	6,144	
block6g_expand_c...	(BatchNormalizatio...	1536)	
block6g_expand_act...	(None, 12, 12,	0	
block6g_expand_b...	(Activation)	1536)	
block6g_dwconv2	(None, 12, 12,	13,824	
block6g_expand_a...	(DepthwiseConv2D)	1536)	
block6g_bn	(None, 12, 12,	6,144	
block6g_dwconv2[...	(BatchNormalizatio...	1536)	
block6g_activation	(None, 12, 12,	0	block6g_bn[0]
[0]	(Activation)	1536)	
block6g_se_squeeze	(None, 1536)	0	
block6g_activati...	(GlobalAveragePool...		
block6g_se_reshape	(None, 1, 1,	0	
block6g_se_squee...	(Reshape)	1536)	
block6g_se_reduce	(None, 1, 1, 64)	98,368	
block6g_se_resha...	(Conv2D)		

block6g_se_expand block6g_se_reduc...	(None, 1, 1, (Conv2D)	99,840 1536)	
block6g_se_excite block6g_activati...	(None, 12, 12, (Multiply)	0 1536)	
block6g_se_expan...			
block6g_project_co...	(None, 12, 12,	393,216	
block6g_se_excit...	(Conv2D)	256)	
block6g_project_bn	(None, 12, 12,	1,024	
block6g_project_...	(BatchNormalizatio...	256)	
block6g_drop	(None, 12, 12,	0	
block6g_project_...	(Dropout)	256)	
block6g_add (Add)	(None, 12, 12,	0	
block6g_drop[0][...		256)	
block6f_add[0][0]			
block6h_expand_conv	(None, 12, 12,	393,216	
block6g_add[0][0]	(Conv2D)	1536)	
block6h_expand_bn	(None, 12, 12,	6,144	
block6h_expand_c...	(BatchNormalizatio...	1536)	

block6h_expand_act...	(None, 12, 12,	0	
block6h_expand_b...	(Activation)	1536)	
block6h_dwconv2	(None, 12, 12,	13,824	
block6h_expand_a...	(DepthwiseConv2D)	1536)	
block6h_bn	(None, 12, 12,	6,144	
block6h_dwconv2[...	(BatchNormalizatio...	1536)	
block6h_activation	(None, 12, 12,	0	block6h_bn[0]
[0]	(Activation)	1536)	
block6h_se_squeeze	(None, 1536)	0	
block6h_activati...	(GlobalAveragePool...		
block6h_se_reshape	(None, 1, 1,	0	
block6h_se_squee...	(Reshape)	1536)	
block6h_se_reduce	(None, 1, 1, 64)	98,368	
block6h_se_resha...	(Conv2D)		
block6h_se_expand	(None, 1, 1,	99,840	
block6h_se_reduc...	(Conv2D)	1536)	
block6h_se_excite	(None, 12, 12,	0	

block6h_activati...	(Multiply)	1536)	
block6h_se_expan...			
block6h_project_co...	(None, 12, 12,	393,216	
block6h_se_excit...	(Conv2D)	256)	
block6h_project_bn	(None, 12, 12,	1,024	
block6h_project_...	(BatchNormalizatio...	256)	
block6h_drop	(None, 12, 12,	0	
block6h_project_...	(Dropout)	256)	
block6h_add (Add)	(None, 12, 12,	0	
block6h_drop[0][...		256)	
block6g_add[0][0]			
block6i_expand_conv	(None, 12, 12,	393,216	
block6h_add[0][0]	(Conv2D)	1536)	
block6i_expand_bn	(None, 12, 12,	6,144	
block6i_expand_c...	(BatchNormalizatio...	1536)	
block6i_expand_act...	(None, 12, 12,	0	
block6i_expand_b...	(Activation)	1536)	
block6i_dwconv2	(None, 12, 12,	13,824	
block6i_expand_a...			

(DepthwiseConv2D)	1536)		
block6i_bn	(None, 12, 12,	6,144	
block6i_dwconv2[...	(BatchNormalizatio...	1536)	
block6i_activation	(None, 12, 12,	0	block6i_bn[0]
[0]	(Activation)	1536)	
block6i_se_squeeze	(None, 1536)	0	
block6i_activati...	(GlobalAveragePool...		
block6i_se_reshape	(None, 1, 1,	0	
block6i_se_squee...	(Reshape)	1536)	
block6i_se_reduce	(None, 1, 1, 64)	98,368	
block6i_se_resha...	(Conv2D)		
block6i_se_expand	(None, 1, 1,	99,840	
block6i_se_reduc...	(Conv2D)	1536)	
block6i_se_excite	(None, 12, 12,	0	
block6i_activati...	(Multiply)	1536)	
block6i_se_expan...			
block6i_project_co...	(None, 12, 12,	393,216	
block6i_se_excit...	(Conv2D)	256)	

block6i_project_bn	(None, 12, 12,	1,024	
block6i_project_... (BatchNormalizatio...	256)		
block6i_drop	(None, 12, 12,	0	
block6i_project_... (Dropout)	256)		
block6i_add (Add)	(None, 12, 12,	0	
block6i_drop[0][... block6h_add[0][0]	256)		
block6j_expand_conv	(None, 12, 12,	393,216	
block6i_add[0][0] (Conv2D)	1536)		
block6j_expand_bn	(None, 12, 12,	6,144	
block6j_expand_c... (BatchNormalizatio...	1536)		
block6j_expand_act...	(None, 12, 12,	0	
block6j_expand_b... (Activation)	1536)		
block6j_dwconv2	(None, 12, 12,	13,824	
block6j_expand_a... (DepthwiseConv2D)	1536)		
block6j_bn	(None, 12, 12,	6,144	
block6j_dwconv2[... (BatchNormalizatio...	1536)		

block6j_activation [0]	(None, 12, 12, (Activation)	0	block6j_bn[0]
	1536)		
block6j_se_squeeze block6j_activati...	(None, 1536) (GlobalAveragePool...	0	
block6j_se_reshape block6j_se_squee...	(None, 1, 1, (Reshape)	0	
	1536)		
block6j_se_reduce block6j_se_resha...	(None, 1, 1, 64) (Conv2D)	98,368	
block6j_se_expand block6j_se_reduc...	(None, 1, 1, (Conv2D)	99,840	
	1536)		
block6j_se_excite block6j_activati...	(None, 12, 12, (Multiply)	0	
block6j_se_expan...	1536)		
block6j_project_co...	(None, 12, 12, (Conv2D)	393,216	
block6j_se_excit...	256)		
block6j_project_bn block6j_project_...	(None, 12, 12, (BatchNormalizatio...	1,024	
	256)		

block6j_drop block6j_project_...	(None, 12, 12,	0	
(Dropout)	256)		
block6j_add (Add) block6j_drop[0][...]	(None, 12, 12,	0	
block6i_add[0][0]	256)		
block6k_expand_conv block6j_add[0][0]	(None, 12, 12,	393,216	
(Conv2D)	1536)		
block6k_expand_bn block6k_expand_c...	(None, 12, 12,	6,144	
(BatchNormalizatio...	1536)		
block6k_expand_act... block6k_expand_b...	(None, 12, 12,	0	
(Activation)	1536)		
block6k_dwconv2 block6k_expand_a...	(None, 12, 12,	13,824	
(DepthwiseConv2D)	1536)		
block6k_bn block6k_dwconv2[...]	(None, 12, 12,	6,144	
(BatchNormalizatio...	1536)		
block6k_activation [0]	(None, 12, 12,	0	block6k_bn[0]
(Activation)	1536)		
block6k_se_squeeze	(None, 1536)	0	

block6k_activati...	(GlobalAveragePool...		
block6k_se_reshape	(None, 1, 1,	0	
block6k_se_squee...	(Reshape)	1536)	
block6k_se_reduce	(None, 1, 1, 64)	98,368	
block6k_se_resha...	(Conv2D)		
block6k_se_expand	(None, 1, 1,	99,840	
block6k_se_reduc...	(Conv2D)	1536)	
block6k_se_excite	(None, 12, 12,	0	
block6k_activati...	(Multiply)	1536)	
block6k_se_expan...			
block6k_project_co...	(None, 12, 12,	393,216	
block6k_se_excit...	(Conv2D)	256)	
block6k_project_bn	(None, 12, 12,	1,024	
block6k_project_...	(BatchNormalizatio...	256)	
block6k_drop	(None, 12, 12,	0	
block6k_project_...	(Dropout)	256)	
block6k_add (Add)	(None, 12, 12,	0	
block6k_drop[0][...			

block6j_add[0][0]	256)		
block6l_expand_conv	(None, 12, 12,	393,216	
block6k_add[0][0]	(Conv2D)	1536)	
block6l_expand_bn	(None, 12, 12,	6,144	
block6l_expand_c...	(BatchNormalizatio...	1536)	
block6l_expand_act...	(None, 12, 12,	0	
block6l_expand_b...	(Activation)	1536)	
block6l_dwconv2	(None, 12, 12,	13,824	
block6l_expand_a...	(DepthwiseConv2D)	1536)	
block6l_bn	(None, 12, 12,	6,144	
block6l_dwconv2[...	(BatchNormalizatio...	1536)	
block6l_activation	(None, 12, 12,	0	block6l_bn[0]
[0]	(Activation)	1536)	
block6l_se_squeeze	(None, 1536)	0	
block6l_activati...	(GlobalAveragePool...		
block6l_se_reshape	(None, 1, 1,	0	
block6l_se_squee...	(Reshape)	1536)	

block6l_se_reduce	(None, 1, 1, 64)	98,368	
block6l_se_resha...			
(Conv2D)			
block6l_se_expand	(None, 1, 1,	99,840	
block6l_se_reduc...			
(Conv2D)	1536)		
block6l_se_excite	(None, 12, 12,	0	
block6l_activati...			
(Multiply)	1536)		
block6l_se_expan...			
block6l_project_co...	(None, 12, 12,	393,216	
block6l_se_excit...			
(Conv2D)	256)		
block6l_project_bn	(None, 12, 12,	1,024	
block6l_project_...			
(BatchNormalizatio...	256)		
block6l_drop	(None, 12, 12,	0	
block6l_project_...			
(Dropout)	256)		
block6l_add (Add)	(None, 12, 12,	0	
block6l_drop[0][...			
	256)		
block6k_add[0][0]			
block6m_expand_conv	(None, 12, 12,	393,216	
block6l_add[0][0]			
(Conv2D)	1536)		

block6m_expand_bn block6m_expand_c...	(None, 12, 12, 1536)	6,144	
block6m_expand_act... block6m_expand_b...	(None, 12, 12, 1536)	0	
block6m_dwconv2 block6m_expand_a...	(None, 12, 12, 1536)	13,824	
block6m_bn block6m_dwconv2[...	(None, 12, 12, 1536)	6,144	
block6m_activation [0]	(None, 12, 12, 1536)	0	block6m_bn[0]
block6m_se_squeeze block6m_activati...	(None, 1536)	0	
block6m_se_reshape block6m_se_squee...	(None, 1, 1, 1536)	0	
block6m_se_reduce block6m_se_resha...	(None, 1, 1, 64)	98,368	

block6m_se_expand block6m_se_reduc...	(None, 1, 1, (Conv2D)	99,840 1536)	
block6m_se_excite block6m_activati...	(None, 12, 12, (Multiply)	0 1536)	
block6m_se_expan...			
block6m_project_co...	(None, 12, 12,	393,216	
block6m_se_excit...	(Conv2D)	256)	
block6m_project_bn	(None, 12, 12,	1,024	
block6m_project_...	(BatchNormalizatio...	256)	
block6m_drop	(None, 12, 12,	0	
block6m_project_...	(Dropout)	256)	
block6m_add (Add)	(None, 12, 12,	0	
block6m_drop[0][...		256)	
block6l_add[0][0]			
block6n_expand_conv	(None, 12, 12,	393,216	
block6m_add[0][0]	(Conv2D)	1536)	
block6n_expand_bn	(None, 12, 12,	6,144	
block6n_expand_c...	(BatchNormalizatio...	1536)	

block6n_expand_act...	(None, 12, 12,	0	
block6n_expand_b...	(Activation)	1536)	
block6n_dwconv2	(None, 12, 12,	13,824	
block6n_expand_a...	(DepthwiseConv2D)	1536)	
block6n_bn	(None, 12, 12,	6,144	
block6n_dwconv2[...	(BatchNormalizatio...	1536)	
block6n_activation	(None, 12, 12,	0	block6n_bn[0]
[0]	(Activation)	1536)	
block6n_se_squeeze	(None, 1536)	0	
block6n_activati...	(GlobalAveragePool...		
block6n_se_reshape	(None, 1, 1,	0	
block6n_se_squee...	(Reshape)	1536)	
block6n_se_reduce	(None, 1, 1, 64)	98,368	
block6n_se_resha...	(Conv2D)		
block6n_se_expand	(None, 1, 1,	99,840	
block6n_se_reduc...	(Conv2D)	1536)	
block6n_se_excite	(None, 12, 12,	0	

block6n_activati...				
(Multiply)		1536)		
block6n_se_expan...				
<hr/>				
block6n_project_co...		(None, 12, 12,	393,216	
block6n_se_excit...				
(Conv2D)		256)		
<hr/>				
block6n_project_bn		(None, 12, 12,	1,024	
block6n_project_...				
(BatchNormalizatio...		256)		
<hr/>				
block6n_drop		(None, 12, 12,	0	
block6n_project_...				
(Dropout)		256)		
<hr/>				
block6n_add (Add)		(None, 12, 12,	0	
block6n_drop[0][...				
		256)		
block6m_add[0][0]				
<hr/>				
block6o_expand_conv		(None, 12, 12,	393,216	
block6n_add[0][0]				
(Conv2D)		1536)		
<hr/>				
block6o_expand_bn		(None, 12, 12,	6,144	
block6o_expand_c...				
(BatchNormalizatio...		1536)		
<hr/>				
block6o_expand_act...		(None, 12, 12,	0	
block6o_expand_b...				
(Activation)		1536)		
<hr/>				
block6o_dwconv2		(None, 12, 12,	13,824	
block6o_expand_a...				

(DepthwiseConv2D)	1536)		
block6o_bn	(None, 12, 12,	6,144	
block6o_dwconv2[...	(BatchNormalizatio...	1536)	
block6o_activation	(None, 12, 12,	0	block6o_bn[0]
[0]	(Activation)	1536)	
block6o_se_squeeze	(None, 1536)	0	
block6o_activati...	(GlobalAveragePool...		
block6o_se_reshape	(None, 1, 1,	0	
block6o_se_squee...	(Reshape)	1536)	
block6o_se_reduce	(None, 1, 1, 64)	98,368	
block6o_se_resha...	(Conv2D)		
block6o_se_expand	(None, 1, 1,	99,840	
block6o_se_reduc...	(Conv2D)	1536)	
block6o_se_excite	(None, 12, 12,	0	
block6o_activati...	(Multiply)	1536)	
block6o_se_expan...			
block6o_project_co...	(None, 12, 12,	393,216	
block6o_se_excit...	(Conv2D)	256)	

block6o_project_bn	(None, 12, 12,	1,024	
block6o_project_... (BatchNormalizatio...	256)		
block6o_drop	(None, 12, 12,	0	
block6o_project_... (Dropout)	256)		
block6o_add (Add)	(None, 12, 12,	0	
block6o_drop[0][... block6n_add[0][0]	256)		
top_conv (Conv2D)	(None, 12, 12,	327,680	
block6o_add[0][0]	1280)		
top_bn [0]	(None, 12, 12,	5,120	top_conv[0]
(BatchNormalizatio...	1280)		
top_activation	(None, 12, 12,	0	top_bn[0][0]
(Activation)	1280)		
avg_pool	(None, 1280)	0	
top_activation[0... (GlobalAveragePool...			
dropout (Dropout)	(None, 1280)	0	avg_pool[0]
[0]			

dense (Dense)	(None, 512)	655,872	dropout[0][0]
batch_normalization (BatchNormalizatio...	(None, 512)	2,048	dense[0][0]
dropout_1 (Dropout)	(None, 512)	0	
dense_1 (Dense)	(None, 5)	2,565	dropout_1[0]

Total params: 20,991,845 (80.08 MB)

Trainable params: 20,836,949 (79.49 MB)

Non-trainable params: 154,896 (605.06 KB)

compile

try:

opt = AdamW(learning_rate=1e-3, weight_decay=1e-5)

except:

opt = tf.keras.optimizers.Adam(learning_rate=1e-3)

img_model.compile(optimizer=opt, loss='categorical_crossentropy',
metrics=['accuracy'])

callbacks

ckpdir = WORK / "img_model_ckpt"

ckpdir.mkdir(parents=True, exist_ok=True)

checkpoint =

tf.keras.callbacks.ModelCheckpoint(str(ckpdir/"best_img_model.h5"),
monitor='val_accuracy', save_best_only=True)

reduce_lr =

tf.keras.callbacks.ReduceLROnPlateau(monitor='val_accuracy',
factor=0.5, patience=2, min_lr=1e-6)

es = tf.keras.callbacks.EarlyStopping(monitor='val_accuracy',
patience=4, restore_best_weights=True)

-----

Correct Freezing

-----

Freeze ONLY the EfficientNetV2 backbone

for layer *in* img_model.layers:

```

        if isinstance(layer, tf.keras.Model):    # this is your backbone
            layer.trainable = False

# Confirm trainable layers > 0
print("\nTrainable layers:", len([l for l in img_model.layers if
l.trainable]))

```

Trainable layers: 519

```

# -----
# Train head (backbone frozen)
# -----
with tf.device('/GPU:0'):
    img_model.fit(
        train_ds,
        validation_data=val_ds,
        epochs=6,
        callbacks=[checkpoint, reduce_lr, es],
        verbose=1
    )

```

Epoch 1/6

Training: 0%| | 0/6 [10:08<?, ?epoch/s]

```

109/1334 ----- 11:10 547ms/step - accuracy: 0.4604 -
loss: 1.80537, change: 0.00048548
Epoch 688, change: 0.00048467
Epoch 689, change: 0.00057171
Epoch 690, change: 0.00054990
Epoch 691, change: 0.00049963
Epoch 692, change: 0.00047757
Epoch 693, change: 0.00047706
Epoch 694, change: 0.00048026
Epoch 695, change: 0.00049388
Epoch 696, change: 0.00047755
Epoch 697, change: 0.00050943
Epoch 698, change: 0.00061429
Epoch 699, change: 0.00059540
Epoch 700, change: 0.00058166
Epoch 701, change: 0.00055285
Epoch 702, change: 0.00059817
Epoch 703, change: 0.00058357
Epoch 704, change: 0.00053986
Epoch 705, change: 0.00056116
Epoch 706, change: 0.00068714
Epoch 707, change: 0.00058157
Epoch 708, change: 0.00054707
Epoch 709, change: 0.00057102
Epoch 710, change: 0.00062779

```

Epoch 711, change: 0.00059379
Epoch 712, change: 0.00053080
Epoch 713, change: 0.00047713
Epoch 714, change: 0.00047919
Epoch 715, change: 0.00067189
Epoch 716, change: 0.00047746
Epoch 717, change: 0.00066196
Epoch 718, change: 0.00047751
Epoch 719, change: 0.00051658
Epoch 720, change: 0.00051816
Epoch 721, change: 0.00052806
Epoch 722, change: 0.00047719
Epoch 723, change: 0.00055022
Epoch 724, change: 0.00054325
Epoch 725, change: 0.00048434
Epoch 726, change: 0.00051453
Epoch 727, change: 0.00078443
Epoch 728, change: 0.00047761
Epoch 729, change: 0.00047701
Epoch 730, change: 0.00063485
Epoch 731, change: 0.00052403
Epoch 732, change: 0.00050580
Epoch 733, change: 0.00055541
Epoch 734, change: 0.00047727
Epoch 735, change: 0.00047713
Epoch 736, change: 0.00051104
Epoch 737, change: 0.00061378
Epoch 738, change: 0.00048026
Epoch 739, change: 0.00054427
Epoch 740, change: 0.00047800
Epoch 741, change: 0.00047721
Epoch 742, change: 0.00047697
Epoch 743, change: 0.00052770
Epoch 744, change: 0.00049206
Epoch 745, change: 0.00047721
Epoch 746, change: 0.00047703
Epoch 747, change: 0.00048151
Epoch 748, change: 0.00055195
Epoch 749, change: 0.00050893
Epoch 750, change: 0.00058580
Epoch 751, change: 0.00047724
Epoch 752, change: 0.00060350
Epoch 753, change: 0.00049480
Epoch 754, change: 0.00047724
Epoch 755, change: 0.00047728
Epoch 756, change: 0.00047707
Epoch 757, change: 0.00047746
Epoch 758, change: 0.00047681
Epoch 759, change: 0.00047716

Epoch 760, change: 0.00047701
Epoch 761, change: 0.00047710
Epoch 762, change: 0.00047704
Epoch 763, change: 0.00047739
Epoch 764, change: 0.00047712
Epoch 765, change: 0.00047743
Epoch 766, change: 0.00047703
Epoch 767, change: 0.00047713
Epoch 768, change: 0.00047721
Epoch 769, change: 0.00047733
Epoch 770, change: 0.00047727
Epoch 771, change: 0.00047707
Epoch 772, change: 0.00047682
Epoch 773, change: 0.00047737
Epoch 774, change: 0.00047707
Epoch 775, change: 0.00047707
Epoch 776, change: 0.00055147
Epoch 777, change: 0.00047679
Epoch 778, change: 0.00047721
Epoch 779, change: 0.00047701
Epoch 780, change: 0.00047700
Epoch 781, change: 0.00047716
Epoch 782, change: 0.00047683
Epoch 783, change: 0.00047709
Epoch 784, change: 0.00047709
Epoch 785, change: 0.00047692
Epoch 786, change: 0.00047704
Epoch 787, change: 0.00047727
Epoch 788, change: 0.00055141
Epoch 789, change: 0.00047743
Epoch 790, change: 0.00047706
Epoch 791, change: 0.00060350
Epoch 792, change: 0.00057036
Epoch 793, change: 0.00047713
Epoch 794, change: 0.00050785
Epoch 795, change: 0.00047707
Epoch 796, change: 0.00047704
Epoch 797, change: 0.00047659
Epoch 798, change: 0.00052779
Epoch 799, change: 0.00047700
Epoch 800, change: 0.00057647
Epoch 801, change: 0.00047704
Epoch 802, change: 0.00047691
Epoch 803, change: 0.00047735
Epoch 804, change: 0.00047695
Epoch 805, change: 0.00053765
Epoch 806, change: 0.00047689
Epoch 807, change: 0.00055183
Epoch 808, change: 0.00048565

Epoch 809, change: 0.00052031
Epoch 810, change: 0.00050687
Epoch 811, change: 0.00049653
Epoch 812, change: 0.00047645
Epoch 813, change: 0.00055177
Epoch 814, change: 0.00047874
Epoch 815, change: 0.00053622
Epoch 816, change: 0.00048592
Epoch 817, change: 0.00055171
Epoch 818, change: 0.00047661
Epoch 819, change: 0.00055651
Epoch 820, change: 0.00047710
Epoch 821, change: 0.00055100
Epoch 822, change: 0.00063049

581/1334

7:27 594ms/step - accuracy: 0.5722 -

loss: 1.265155153

Epoch 824, change: 0.00047703
Epoch 825, change: 0.00054289
Epoch 826, change: 0.00047664
Epoch 827, change: 0.00060683
Epoch 828, change: 0.00047704
Epoch 829, change: 0.00052603
Epoch 830, change: 0.00048729
Epoch 831, change: 0.00056208
Epoch 832, change: 0.00047649
Epoch 833, change: 0.00057561
Epoch 834, change: 0.00049316
Epoch 835, change: 0.00055183
Epoch 836, change: 0.00054435
Epoch 837, change: 0.00051563
Epoch 838, change: 0.00047647
Epoch 839, change: 0.00047698
Epoch 840, change: 0.00047689
Epoch 841, change: 0.00047841
Epoch 842, change: 0.00061810
Epoch 843, change: 0.00047658
Epoch 844, change: 0.00063836
Epoch 845, change: 0.00047656
Epoch 846, change: 0.00055183
Epoch 847, change: 0.00047659
Epoch 848, change: 0.00047637
Epoch 849, change: 0.00047603
Epoch 850, change: 0.00050836
Epoch 851, change: 0.00047621
Epoch 852, change: 0.00057984
Epoch 853, change: 0.00047637
Epoch 854, change: 0.00047613
Epoch 855, change: 0.00047622
Epoch 856, change: 0.00048050

Epoch 857, change: 0.00047656
Epoch 858, change: 0.00059286
Epoch 859, change: 0.00047577
Epoch 860, change: 0.00055165
Epoch 861, change: 0.00047638
Epoch 862, change: 0.00061291
Epoch 863, change: 0.00047634
Epoch 864, change: 0.00055254
Epoch 865, change: 0.00047658
Epoch 866, change: 0.00053461
Epoch 867, change: 0.00047634
Epoch 868, change: 0.00055195
Epoch 869, change: 0.00047693
Epoch 870, change: 0.00047598
Epoch 871, change: 0.00047589
Epoch 872, change: 0.00055171
Epoch 873, change: 0.00047643
Epoch 874, change: 0.00055153
Epoch 875, change: 0.00047622
Epoch 876, change: 0.00055165
Epoch 877, change: 0.00047613
Epoch 878, change: 0.00050493
Epoch 879, change: 0.00047606
Epoch 880, change: 0.00049790
Epoch 881, change: 0.00047617
Epoch 882, change: 0.00047655
Epoch 883, change: 0.00048234
Epoch 884, change: 0.00052888
Epoch 885, change: 0.00047652
Epoch 886, change: 0.00047604
Epoch 887, change: 0.00047664
Epoch 888, change: 0.00047607
Epoch 889, change: 0.00047643
Epoch 890, change: 0.00047640
Epoch 891, change: 0.00047664
Epoch 892, change: 0.00047623
Epoch 893, change: 0.00055853
Epoch 894, change: 0.00047667
Epoch 895, change: 0.00047635
Epoch 896, change: 0.00047617
Epoch 897, change: 0.00047643
Epoch 898, change: 0.00047617
Epoch 899, change: 0.00051792
Epoch 900, change: 0.00047637
Epoch 901, change: 0.00047623
Epoch 902, change: 0.00051643
Epoch 903, change: 0.00047653
Epoch 904, change: 0.00047605
Epoch 905, change: 0.00047602

Epoch 906, change: 0.00047619
Epoch 907, change: 0.00047619
Epoch 908, change: 0.00047625
Epoch 909, change: 0.00047638
Epoch 910, change: 0.00047649
Epoch 911, change: 0.00047629
Epoch 912, change: 0.00047629
Epoch 913, change: 0.00048890
Epoch 914, change: 0.00047634
Epoch 915, change: 0.00047647
Epoch 916, change: 0.00041931
Epoch 917, change: 0.00038923
Epoch 918, change: 0.00036483
Epoch 919, change: 0.00037579
Epoch 920, change: 0.00042038
Epoch 921, change: 0.00028455
Epoch 922, change: 0.00047094
Epoch 923, change: 0.00036418
Epoch 924, change: 0.00040436
Epoch 925, change: 0.00032560
Epoch 926, change: 0.00038333
Epoch 927, change: 0.00042580
Epoch 928, change: 0.00042540
Epoch 929, change: 0.00040130
Epoch 930, change: 0.00042391
Epoch 931, change: 0.00030672
Epoch 932, change: 0.00034045
Epoch 933, change: 0.00051056
Epoch 934, change: 0.00037811
Epoch 935, change: 0.00028294
Epoch 936, change: 0.00042848
Epoch 937, change: 0.00035022
Epoch 938, change: 0.00041533
Epoch 939, change: 0.00039021
Epoch 940, change: 0.00035666
Epoch 941, change: 0.00045624
Epoch 942, change: 0.00038880
Epoch 943, change: 0.00029099
Epoch 944, change: 0.00030830
Epoch 945, change: 0.00050266
Epoch 946, change: 0.00044320
Epoch 947, change: 0.00032965
Epoch 948, change: 0.00028329
Epoch 949, change: 0.00030636
Epoch 950, change: 0.00037229
Epoch 951, change: 0.00030276
Epoch 952, change: 0.00044505
Epoch 953, change: 0.00046545
Epoch 954, change: 0.00032476

```

Epoch 955, change: 0.00028065
Epoch 956, change: 0.00042623
Epoch 957, change: 0.00041554
Epoch 958, change: 0.00040946
Epoch 959, change: 0.00033974
722/1334 _____ 6:05 598ms/step - accuracy: 0.5839 -
loss: 1.2136max_iter reached after 1734 seconds
723/1334 _____ 6:05 598ms/step - accuracy: 0.5840 -
loss: 1.2132

/usr/local/lib/python3.11/dist-packages/sklearn/linear_model/
_sag.py:350: ConvergenceWarning: The max_iter was reached which means
the coef_ did not converge
  warnings.warn(

1334/1334 _____ 0s 604ms/step - accuracy: 0.6167 -
loss: 1.0776

WARNING:absl:You are saving your model as an HDF5 file via
`model.save()` or `keras.saving.save_model(model)`. This file format
is considered legacy. We recommend using instead the native Keras
format, e.g. `model.save('my_model.keras')` or
`keras.saving.save_model(model, 'my_model.keras')`.

1334/1334 _____ 1032s 657ms/step - accuracy: 0.6167 -
loss: 1.0774 - val_accuracy: 0.1917 - val_loss: 4.0015 -
learning_rate: 0.0010
Epoch 2/6
1334/1334 _____ 0s 608ms/step - accuracy: 0.6818 -
loss: 0.7810

WARNING:absl:You are saving your model as an HDF5 file via
`model.save()` or `keras.saving.save_model(model)`. This file format
is considered legacy. We recommend using instead the native Keras
format, e.g. `model.save('my_model.keras')` or
`keras.saving.save_model(model, 'my_model.keras')`.

1334/1334 _____ 863s 647ms/step - accuracy: 0.6819 -
loss: 0.7810 - val_accuracy: 0.6659 - val_loss: 0.8579 -
learning_rate: 0.0010
Epoch 3/6
1334/1334 _____ 860s 645ms/step - accuracy: 0.7274 -
loss: 0.6480 - val_accuracy: 0.4152 - val_loss: 1.4921 -
learning_rate: 0.0010
Epoch 4/6
1334/1334 _____ 860s 644ms/step - accuracy: 0.7567 -
loss: 0.5955 - val_accuracy: 0.2255 - val_loss: 2.5155 -
learning_rate: 0.0010
Epoch 5/6
1334/1334 _____ 872s 653ms/step - accuracy: 0.7749 -
loss: 0.5375 - val_accuracy: 0.1844 - val_loss: 2.6119 -

```

```

learning_rate: 5.0000e-04
Epoch 6/6
1334/1334 _____ 0s 610ms/step - accuracy: 0.7959 -
loss: 0.4917

WARNING:absl:You are saving your model as an HDF5 file via
`model.save()` or `keras.saving.save_model(model)`. This file format
is considered legacy. We recommend using instead the native Keras
format, e.g. `model.save('my_model.keras')` or
`keras.saving.save_model(model, 'my_model.keras')`.

1334/1334 _____ 866s 649ms/step - accuracy: 0.7959 -
loss: 0.4917 - val_accuracy: 0.7002 - val_loss: 1.0330 -
learning_rate: 5.0000e-04

```

Unfreeze, Finetune and Evaluate the EfficientnetV2S backbone

```

# Unfreeze and fine-tune
print("\nUnfreezing backbone for fine-tuning...")
for layer in img_model.layers:
    layer.trainable = True

# recompile with lower LR
try:
    opt2 = AdamW(learning_rate=5e-5, weight_decay=1e-6)
except Exception:
    opt2 = tf.keras.optimizers.Adam(learning_rate=5e-5)
img_model.compile(optimizer=opt2, loss='categorical_crossentropy',
metrics=['accuracy'])

print("\nFine-tuning backbone...")
img_model.fit(
    train_ds,
    validation_data=val_ds,
    epochs=12,
    callbacks=[checkpoint, reduce_lr, es, TQDMProgressBar()],
    verbose=0
)

```

Unfreezing backbone for fine-tuning...

Fine-tuning backbone...

```

Training:   0%|          | 0/12 [00:00<?, ?epoch/s]WARNING:absl:You
are saving your model as an HDF5 file via `model.save()` or
`keras.saving.save_model(model)`. This file format is considered

```

```

legacy. We recommend using instead the native Keras format, e.g.
`model.save('my_model.keras')` or `keras.saving.save_model(model,
'my_model.keras')`.
Training: 8%|██████| 1/12 [16:45<3:04:17, 1005.27s/epoch,
loss=0.4095, acc=0.8303, val_acc=0.8786]WARNING:absl:You are saving
your model as an HDF5 file via `model.save()` or
`keras.saving.save_model(model)`. This file format is considered
legacy. We recommend using instead the native Keras format, e.g.
`model.save('my_model.keras')` or `keras.saving.save_model(model,
'my_model.keras')`.
Training: 17%|██████| 2/12 [31:03<2:33:09, 918.97s/epoch,
loss=0.3885, acc=0.8380, val_acc=0.8832] WARNING:absl:You are saving
your model as an HDF5 file via `model.save()` or
`keras.saving.save_model(model)`. This file format is considered
legacy. We recommend using instead the native Keras format, e.g.
`model.save('my_model.keras')` or `keras.saving.save_model(model,
'my_model.keras')`.
Training: 33%|██████| 4/12 [59:55<1:57:42, 882.86s/epoch,
loss=0.3700, acc=0.8452, val_acc=0.8808]WARNING:absl:You are saving
your model as an HDF5 file via `model.save()` or
`keras.saving.save_model(model)`. This file format is considered
legacy. We recommend using instead the native Keras format, e.g.
`model.save('my_model.keras')` or `keras.saving.save_model(model,
'my_model.keras')`.
Training: 67%|██████| 8/12 [1:57:24<57:48, 867.06s/epoch,
loss=0.3367, acc=0.8579, val_acc=0.8597] WARNING:absl:You are saving
your model as an HDF5 file via `model.save()` or
`keras.saving.save_model(model)`. This file format is considered
legacy. We recommend using instead the native Keras format, e.g.
`model.save('my_model.keras')` or `keras.saving.save_model(model,
'my_model.keras')`.
Training: 75%|██████| 9/12 [2:11:44<43:14, 864.79s/epoch,
loss=0.3359, acc=0.8594, val_acc=0.8957]WARNING:absl:You are saving
your model as an HDF5 file via `model.save()` or
`keras.saving.save_model(model)`. This file format is considered
legacy. We recommend using instead the native Keras format, e.g.
`model.save('my_model.keras')` or `keras.saving.save_model(model,
'my_model.keras')`.
Training: 100%|██████| 12/12 [2:54:55<00:00, 874.64s/epoch,
loss=0.3159, acc=0.8683, val_acc=0.8715]

```

```
<keras.src.callbacks.history.History at 0x7b83ee923450>
```

```

custom_objs = {
    "Cast": tf.cast # register Cast op for loading
}

```

```

# Load best saved img model if exists
best_img = ckpdir / "best_img_model.h5"

```

```

if best_img.exists():
    with custom_object_scope(custom_objs):
        img_model = tf.keras.models.load_model(str(best_img))
    print("Loaded best image model from checkpoint.")

```

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

Loaded best image model from checkpoint.

```

# Evaluate on val set
print("\nEvaluating image model on validation set:")
val_preds = img_model.predict(val_ds)
val_pred_labels = val_preds.argmax(axis=1)
y_val_labels = y_val.argmax(axis=1)
print("\nAccuracy:", accuracy_score(y_val_labels, val_pred_labels))
print("Macro F1:", f1_score(y_val_labels, val_pred_labels,
average='macro'))
print("\nClassification Report: ", classification_report(y_val_labels,
val_pred_labels))

```

Evaluating image model on validation set:
293/293 ————— 47s 160ms/step

Accuracy: 0.8998292544109278
Macro F1: 0.8923051186181343

Classification Report:	precision	recall	f1-score	support
------------------------	-----------	--------	----------	---------

0	0.95	0.92	0.93	1688
1	0.93	0.86	0.90	501
2	0.89	0.94	0.91	2660
3	0.90	0.82	0.86	932
4	0.85	0.88	0.86	1247

accuracy			0.90	7028
macro avg	0.90	0.88	0.89	7028
weighted avg	0.90	0.90	0.90	7028

```

# Save final image model
img_out = WORK / "efficientnetv2s_coral_clusters.keras"
img_model.save(img_out, include_optimizer=False)
print("Saved image model to:", img_out)

```

Saved image model to:
/kaggle/working/efficientnetv2s_coral_clusters.keras

Save Overall Model Training Results

```
# -----  
# Save metadata and full report (all metrics)  
# -----  
  
# Convert one-hot validation labels → integer labels  
y_val_int = np.argmax(y_val, axis=1)  
  
# Logistic regression accuracy (already computed earlier)  
if 'yv_lr' in locals():  
    feature_lr_acc = float(accuracy_score(y_val_int, yv_lr))  
else:  
    feature_lr_acc = None  
  
# -----  
# Image model metrics  
# -----  
val_acc = accuracy_score(y_val_labels, val_pred_labels)  
macro_f1 = f1_score(y_val_labels, val_pred_labels,  
    average='macro')  
weighted_f1 = f1_score(y_val_labels, val_pred_labels,  
    average='weighted')  
macro_prec = precision_score(y_val_labels, val_pred_labels,  
    average='macro')  
weighted_prec = precision_score(y_val_labels, val_pred_labels,  
    average='weighted')  
macro_recall = recall_score(y_val_labels, val_pred_labels,  
    average='macro')  
weighted_recall = recall_score(y_val_labels, val_pred_labels,  
    average='weighted')  
  
# Confusion matrix + full classification report  
cm = confusion_matrix(y_val_labels, val_pred_labels)  
cls_report = classification_report(y_val_labels, val_pred_labels,  
    output_dict=True)  
  
# -----  
# Final JSON-compatible report  
# -----  
report = {  
    "n_samples": int(len(aligned_paths)),  
    "n_classes (clusters)": int(n_classes),  
  
    # Feature-based LR (GPU cuML)  
    "feature_model_lr_acc": feature_lr_acc,  
  
    # Image model metrics  
    "image_model_val_acc": float(val_acc),  
    "image_model_macro_f1": float(macro_f1),
```



```

    "image_model_weighted_f1": float(weighted_f1),
    "image_model_macro_precision": float(macro_prec),
    "image_model_weighted_precision": float(weighted_prec),
    "image_model_macro_recall": float(macro_recall),
    "image_model_weighted_recall": float(weighted_recall),

    # Raw outputs
    "confusion_matrix": cm.tolist(),
    "classification_report": cls_report
}

# Save summary CSV
pd.Series(report).to_csv(WORK /
    "efficientnetv2s_training_report_summary.csv")
print("\nSaved summary to
efficientnetv2s_training_report_summary.csv")
print("\nReport:")
report

```

Saved summary to efficientnetv2s_training_report_summary.csv

Report:

```

{'n_samples': 39044,
 'n_classes (clusters)': 5,
 'feature_model_lr_acc': 0.9883323847467274,
 'image_model_val_acc': 0.8998292544109278,
 'image_model_macro_f1': 0.8923051186181343,
 'image_model_weighted_f1': 0.8997202623294729,
 'image_model_macro_precision': 0.9044900627324332,
 'image_model_weighted_precision': 0.9011804019446629,
 'image_model_macro_recall': 0.8820135196662019,
 'image_model_weighted_recall': 0.8998292544109278,
 'confusion_matrix': [[1546, 0, 142, 0, 0],
 [0, 433, 0, 14, 54],
 [73, 0, 2490, 31, 66],
 [0, 10, 87, 761, 74],
 [0, 23, 94, 36, 1094]],
 'classification_report': {'0': {'precision': 0.9549104385423101,
 'recall': 0.9158767772511849,
 'f1-score': 0.934986392500756,
 'support': 1688},
 '1': {'precision': 0.9291845493562232,
 'recall': 0.8642714570858283,
 'f1-score': 0.8955532574974147,
 'support': 501},
 '2': {'precision': 0.8851759687166726,
 'recall': 0.9360902255639098,
 'f1-score': 0.9099214324867532,

```

```
'support': 2660},
'3': {'precision': 0.9038004750593824,
'recall': 0.8165236051502146,
'f1-score': 0.8579481397970687,
'support': 932},
'4': {'precision': 0.8493788819875776,
'recall': 0.8773055332798717,
'f1-score': 0.8631163708086785,
'support': 1247},
'accuracy': 0.8998292544109278,
'macro avg': {'precision': 0.9044900627324332,
'recall': 0.8820135196662019,
'f1-score': 0.8923051186181343,
'support': 7028},
'weighted avg': {'precision': 0.9011804019446629,
'recall': 0.8998292544109278,
'f1-score': 0.8997202623294729,
'support': 7028}}}
```

Download the Captured Results

```
!pwd
/kaggle/working
!zip -r modeling_results.zip /kaggle/working
  adding: kaggle/working/ (stored 0%)
  adding: kaggle/working/cluster_distribution_by_source.png (deflated
20%)
  adding: kaggle/working/.virtual_documents/ (stored 0%)
  adding: kaggle/working/efficientnetv2s_coral_clusters.keras
(deflated 9%)
  adding: kaggle/working/metadata_with_clusters.csv (deflated 95%)
  adding: kaggle/working/feature_logreg_pipeline.joblib (deflated 4%)
  adding: kaggle/working/simple_nn_classifier.h5 (deflated 22%)
  adding: kaggle/working/confusion_matrix.png (deflated 21%)
  adding: kaggle/working/efficientnetv2s_training_report_summary.csv
(deflated 60%)
  adding: kaggle/working/coral_dataset_with_clusters_and_metrics.csv
(deflated 96%)
  adding: kaggle/working/img_model_ckpt/ (stored 0%)
  adding: kaggle/working/img_model_ckpt/best_img_model.h5 (deflated
7%)
!ls -lrth
total 414M
-rw-r--r-- 1 root root 6.4M Nov 23 01:26 metadata_with_clusters.csv
```

```
-rw-r--r-- 1 root root 8.5M Nov 23 01:26
coral_dataset_with_clusters_and_metrics.csv
-rw-r--r-- 1 root root 57K Nov 23 01:26
cluster_distribution_by_source.png
-rw-r--r-- 1 root root 9.6M Nov 23 01:27 simple_nn_classifier.h5
-rw-r--r-- 1 root root 89K Nov 23 01:27 confusion_matrix.png
-rw-r--r-- 1 root root 31K Nov 23 01:38
feature_logreg_pipeline.joblib
drwxr-xr-x 2 root root 4.0K Nov 23 02:06 img_model_ckpt
-rw-r--r-- 1 root root 82M Nov 23 06:18
efficientnetv2s_coral_clusters.keras
-rw-r--r-- 1 root root 1.4K Nov 23 06:22
efficientnetv2s_training_report_summary.csv
-rw-r--r-- 1 root root 307M Nov 23 06:25 modeling_results.zip

from IPython.display import FileLink
FileLink(r'modeling_results.zip')

/kaggle/working/modeling_results.zip
```