

perceptron_to_debug

December 9, 2025

```
[ ]: import sys
import numpy as np
import pickle
np.random.seed(0)
from scripts import (
    #train_test_split,
    StandardScaler,
    accuracy,
    confusion_matrix,
    recall_per_class,
    balanced_accuracy,
    KernelPerceptron,
    SVM,
    rbf_kernel,
)
import pandas as pd
```

```
[49]: from sklearn.model_selection import train_test_split
# --- Load training data ---
path_to_data = 'ift-3395-6390-kaggle-2-competition-fall-2025/train_data.pkl'
with open(path_to_data, "rb") as f:
    train_data = pickle.load(f)

X_imgs = train_data["images"].astype(np.float32)
y = train_data["labels"].reshape(-1)

X_train_imgs, X_val_imgs, y_train, y_val = train_test_split(
    X_imgs, y, test_size=0.2, random_state=0, stratify=y
)

train_min = X_train_imgs.min()
train_max = X_train_imgs.max()

train_mean = X_train_imgs.mean()

train_std = X_train_imgs.std()
X_train_imgs = (X_train_imgs - train_min) / (train_max - train_min + 1e-6)
X_train_imgs = (X_train_imgs - train_mean) / (train_std + 1e-6)
```

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X_val_imgs = (X_val_imgs - train_min) / (train_max - train_min + 1e-6)
X_val_imgs = (X_val_imgs - train_mean) / (train_std + 1e-6)
```

```
[50]: def extract_simple_stats(img):
        gray = img.mean(axis=2)

        return np.array([gray.mean(), gray.std(), gray.min(), gray.max()], dtype=np.
        ↪float32)
```

```
[51]: def radial_profile(img):
        """Calcule le profil radial moyen d'une image."""
        h, w = img.shape
        y, x = np.ogrid[:h, :w]
        r = np.sqrt((x - w//2)**2 + (y - h//2)**2).astype(int)
        profile = np.bincount(r.ravel(), img.ravel()) / np.bincount(r.ravel())
        return np.log(profile + 1e-6)
```

```
[52]: def fft_features(images):
        """Extrait les caractéristiques FFT d'images."""
        gray = images.mean(axis=3)
        F = np.fft.fft2(gray, axes=(1, 2))
        return np.abs(np.fft.fftshift(F, axes=(1, 2)))
```

```
[53]: def extract_channel_stats(img):
        # img.shape est (H, W, 3)
        features = []
        for c in range(img.shape[2]): # Itere sur les 3 canaux
            channel = img[:, :, c]
            features.extend([channel.mean(), channel.std(), channel.min(), channel.
            ↪max()])

        return np.array(features, dtype=np.float32)
```

```
[54]: def simple_augment(images, labels):
        flips = images[:, :, ::-1, :]
        noise = images + 0.01*np.random.randn(*images.shape)
        aug_imgs = np.concatenate([images, flips, noise], axis=0)
        aug_labels = np.concatenate([labels, labels, labels])
        return aug_imgs, aug_labels
```

```
[55]: X_train_imgs, y_train = simple_augment(X_train_imgs, y_train)

        fft_mag_train = fft_features(X_train_imgs)

        X_fft_train = np.array([radial_profile(img) for img in fft_mag_train], dtype=np.
        ↪float32)
```

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X_stats_train = np.array([extract_simple_stats(img) for img in X_train_imgs],
    dtype=np.float32)
X_color_train = np.array([extract_channel_stats(img) for img in
    X_train_imgs], dtype=np.float32)

X_train = np.hstack([X_fft_train, X_stats_train, X_color_train])

fft_mag_val = fft_features(X_val_imgs)

X_fft_val = np.array([radial_profile(img) for img in fft_mag_val], dtype=np.
    float32)
X_stats_val = np.array([extract_simple_stats(img) for img in
    X_val_imgs], dtype=np.float32)
X_color_val = np.array([extract_channel_stats(img) for img in X_val_imgs],
    dtype=np.float32)

X_val = np.hstack([X_fft_val, X_stats_val, X_color_val])

scaler = StandardScaler()
X_train = scaler.fit_transform(X_train)
X_val = scaler.transform(X_val)

```

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[56]: class_counts = np.bincount(y_val)
class_weights = (1.0 / class_counts)
class_weights /= class_weights.sum()
sample_weights = class_weights[y_train]

```

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[57]: model = KernelPerceptron(kernel_fn=rbf_kernel, n_classes=5, sigma=1,
    learning_rate=1.0, sample_weights=None, lam=0.0)
model.fit(X_train, y_train, max_epochs=50)

```

```

[58]: y_pred_val = model.predict(X_val)
acc = (y_pred_val == y_val).mean()
print("Test accuracy =", acc)
cm = confusion_matrix(y_val, y_pred_val)
bal_acc = balanced_accuracy(y_val, y_pred_val)
rec = recall_per_class(cm)
print("Balanced acc :", bal_acc)
print("Recall par classe :", rec)
print("Recall moyen :", rec.mean())
print(cm)

```

Test accuracy = 0.44907407407407407

Balanced acc : 0.3190054350979672

Recall par classe : [0.70103093 0.19230769 0.31707317 0.23076923 0.15384615]

Recall moyen : 0.3190054350979672

[[68 8 11 6 4]

```
[10  5  5  6  0]
[11  5 13  9  3]
[14  6  7  9  3]
[ 6  0  3  2  2]]
```

```
[59]: model_pkg = {
      'model': model,
      'scaler': scaler,
      'train_min': train_min,
      'train_max': train_max,
      'train_mean': train_mean,
      'train_std': train_std
    }

    pickle.dump(model_pkg, open("model_perceptron.pkl", "wb"))
```

```
[60]: model_pkg_pred = pickle.load(open("model_perceptron.pkl", "rb"))

model = model_pkg_pred['model']
scaler = model_pkg_pred['scaler']
train_min = model_pkg_pred['train_min']
train_max = model_pkg_pred['train_max']
train_mean = model_pkg_pred['train_mean']
train_std = model_pkg_pred['train_std']

# -----
# 2. Charger le test_data.pkl
# -----
with open("ift-3395-6390-kaggle-2-competition-fall-2025/test_data.pkl", "rb") as f:
    test_data = pickle.load(f)

X_test_imgs = test_data["images"].astype(np.float32)
X_test_imgs = (X_test_imgs - train_min) / (train_max - train_min + 1e-6)
X_test_imgs = (X_test_imgs - train_mean) / (train_std + 1e-6)

fft_mag_test = fft_features(X_test_imgs)
X_fft_test = np.array([radial_profile(img) for img in fft_mag_test], dtype=np.
    float32)
X_stats_test = np.array([extract_simple_stats(img) for img in
    X_test_imgs], dtype=np.float32)
X_color_test = np.array([extract_channel_stats(img) for img in
    X_test_imgs], dtype=np.float32)
X_test = np.hstack([X_fft_test, X_stats_test, X_color_test])
X_test = scaler.transform(X_test)
```

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y_pred = model.predict(X_test).astype(int)
# -----
# 6. Générer le CSV Kaggle
# -----
df = pd.DataFrame({"ID": np.arange(1, len(y_pred)+1), "Label": y_pred})

df.to_csv("ift3395_YAPS_MCS_V101.csv", index=False)

print("Fichier 'submission.csv' généré !")

#print(df.head())

df1 = pd.read_csv("ift3395_YAPS_MCS_V101.csv")
df2 = pd.read_csv("IFT3395_YAPS_MCS_V14_ref.csv")

comparison = df1.compare(df2)
print(comparison)
print("Nombre de différences :", len(comparison))

```

Fichier 'submission.csv' généré !

	Label	
	self	other
11	4.0	0.0
14	1.0	0.0
17	2.0	3.0
29	3.0	4.0
31	3.0	2.0
..
379	3.0	2.0
384	1.0	0.0
390	2.0	0.0
391	0.0	3.0
394	1.0	0.0

[90 rows x 2 columns]

Nombre de différences : 90