

### Run build\_manifest\_and\_split.py

```
python build_manifest_and_split.py \  
  --dataset_dir "$(pwd)" \  
  --bias_train_to_many_images \  
  --train_ratio 0.6 \  
  --val_ratio 0.20 \  
  --test_ratio 0.20 \  
  --seed 123
```

### build\_roi\_manifest.py

```
python build_roi_manifest.py --dataset_dir "$(pwd)"
```

### dataset\_multimodal.py

```
python dataset_multimodal.py --dataset_dir "$(pwd)"
```

```
python3 dataset_multimodal.py \  
  --dataset_dir "$(pwd)" \  
  --batch_size 32 \  
  --num_workers 8 \  
  --img_size 224
```

### model\_multimodal.py

```
python model_multimodal.py
```

## RUN 1

### Prompt convnext:

```
(base) bioinfo@pop-os:~/Downloads/Dataset$ python train_multimodal.py --dataset_dir  
"$ (pwd)" --epochs 20 --batch_size 16 --lr 1e-5 --weight_decay 1e-3 --device cuda  
--freeze_backbone_epochs 10 --backbone_unfreeze_mode partial  
--backbone_unfreeze_fraction 0.3 --backbone convnext_tiny --dropout_p 0.5  
--class_weights "2.11,4.60,4.98,2.0"  
[INFO] Usando device: cuda  
[INFO] Usando backbone: convnext_tiny  
[INFO] Usando dropout_p: 0.5  
[INFO] Épocas de treino: 20  
[INFO] Batch size: 16  
[INFO] Learning rate: 1e-05  
[INFO] Weight decay: 0.001 (1e-03)  
[INFO] Loss type: ce  
[INFO] Focal gamma: 2.0  
[INFO] freeze_backbone_epochs: 10
```

```
[INFO] backbone_unfreeze_mode: partial
[INFO] backbone_unfreeze_fraction: 0.3
[INFO] Pesos manuais (string): 2.11,4.60,4.98,2.0
[INFO] Criando DataLoaders...
[INFO] Usando PESOS MANUAIS para a loss:
    classe 0: peso = 2.1100
    classe 1: peso = 4.6000
    classe 2: peso = 4.9800
    classe 3: peso = 2.0000
[INFO] Congelando backbone nas primeiras 10 épocas.
[INFO] Usando CrossEntropyLoss ponderada.
```

### Output:

```
(base) bioinfo@pop-os:~/Downloads/Dataset$ python train_multimodal.py --dataset_dir
"${pwd}" --epochs 20 --batch_size 16 --lr 1e-5 --weight_decay 1e-3 --device cuda
--freeze_backbone_epochs 10 --backbone_unfreeze_mode partial
--backbone_unfreeze_fraction 0.3 --backbone_convnext_tiny --dropout_p 0.5
--class_weights "2.11,4.60,4.98,2.0"
[INFO] Usando device: cuda
[INFO] Usando backbone: convnext_tiny
[INFO] Usando dropout_p: 0.5
[INFO] Épocas de treino: 20
[INFO] Batch size: 16
[INFO] Learning rate: 1e-05
[INFO] Weight decay: 0.001
[INFO] Loss type: ce
[INFO] Focal gamma: 2.0
[INFO] freeze_backbone_epochs: 10
[INFO] backbone_unfreeze_mode: partial
[INFO] backbone_unfreeze_fraction: 0.3
[INFO] Pesos manuais (string): 2.11,4.60,4.98,2.0
[INFO] Criando DataLoaders...
[INFO] Usando PESOS MANUAIS para a loss:
    classe 0: peso = 2.1100
    classe 1: peso = 4.6000
    classe 2: peso = 4.9800
    classe 3: peso = 2.0000
[INFO] Congelando backbone nas primeiras 10 épocas.
[INFO] Usando CrossEntropyLoss ponderada.

===== Época 1/20 =====
[TRAIN] loss=1.4623 acc=0.3109 macro_f1=0.3044 mcc=0.0859
[VAL] loss=1.3082 acc=0.4333 macro_f1=0.4187 mcc=0.3021
[INFO] Novo melhor modelo salvo em /home/bioinfo/Downloads/Dataset/best_model.pt
(val_macro_f1=0.4187)
```

===== Época 2/20 =====

[TRAIN] loss=1.3207 acc=0.4175 macro\_f1=0.4126 mcc=0.2270

[VAL] loss=1.2008 acc=0.6000 macro\_f1=0.5373 mcc=0.4525

[INFO] Novo melhor modelo salvo em /home/bioinfo/Downloads/Dataset/best\_model.pt  
(val\_macro\_f1=0.5373)

===== Época 3/20 =====

[TRAIN] loss=1.2200 acc=0.4886 macro\_f1=0.4866 mcc=0.3190

[VAL] loss=1.1058 acc=0.6833 macro\_f1=0.5868 mcc=0.5440

[INFO] Novo melhor modelo salvo em /home/bioinfo/Downloads/Dataset/best\_model.pt  
(val\_macro\_f1=0.5868)

===== Época 4/20 =====

[TRAIN] loss=1.1436 acc=0.5436 macro\_f1=0.5440 mcc=0.3938

[VAL] loss=1.0352 acc=0.7000 macro\_f1=0.6033 mcc=0.5657

[INFO] Novo melhor modelo salvo em /home/bioinfo/Downloads/Dataset/best\_model.pt  
(val\_macro\_f1=0.6033)

===== Época 5/20 =====

[TRAIN] loss=1.0607 acc=0.6097 macro\_f1=0.6085 mcc=0.4788

[VAL] loss=0.9919 acc=0.7183 macro\_f1=0.6219 mcc=0.5926

[INFO] Novo melhor modelo salvo em /home/bioinfo/Downloads/Dataset/best\_model.pt  
(val\_macro\_f1=0.6219)

===== Época 6/20 =====

[TRAIN] loss=1.0206 acc=0.6252 macro\_f1=0.6178 mcc=0.5056

[VAL] loss=0.9278 acc=0.7167 macro\_f1=0.6188 mcc=0.5874

===== Época 7/20 =====

[TRAIN] loss=0.9322 acc=0.6641 macro\_f1=0.6542 mcc=0.5553

[VAL] loss=0.8896 acc=0.7383 macro\_f1=0.6274 mcc=0.6211

[INFO] Novo melhor modelo salvo em /home/bioinfo/Downloads/Dataset/best\_model.pt  
(val\_macro\_f1=0.6274)

===== Época 8/20 =====

[TRAIN] loss=0.9120 acc=0.7029 macro\_f1=0.7073 mcc=0.6043

[VAL] loss=0.8907 acc=0.7417 macro\_f1=0.6704 mcc=0.6309

[INFO] Novo melhor modelo salvo em /home/bioinfo/Downloads/Dataset/best\_model.pt  
(val\_macro\_f1=0.6704)

===== Época 9/20 =====

[TRAIN] loss=0.8862 acc=0.7024 macro\_f1=0.6994 mcc=0.6064

[VAL] loss=0.8380 acc=0.7500 macro\_f1=0.6585 mcc=0.6388

===== Época 10/20 =====

[TRAIN] loss=0.8526 acc=0.7268 macro\_f1=0.7239 mcc=0.6357

[VAL] loss=0.8102 acc=0.7450 macro\_f1=0.6392 mcc=0.6307

===== Época 11/20 =====

[INFO] Descongelando PARCIALMENTE o backbone (fração = 0.30).

[TRAIN] loss=0.7271 acc=0.7746 macro\_f1=0.7780 mcc=0.7012

[VAL] loss=0.6654 acc=0.7867 macro\_f1=0.7027 mcc=0.6933

[INFO] Novo melhor modelo salvo em /home/bioinfo/Downloads/Dataset/best\_model.pt  
(val\_macro\_f1=0.7027)

===== Época 12/20 =====

[TRAIN] loss=0.6307 acc=0.8273 macro\_f1=0.8275 mcc=0.7704

[VAL] loss=0.6054 acc=0.7933 macro\_f1=0.7021 mcc=0.6998

===== Época 13/20 =====

[TRAIN] loss=0.5266 acc=0.8828 macro\_f1=0.8870 mcc=0.8438

[VAL] loss=0.5684 acc=0.8150 macro\_f1=0.7110 mcc=0.7295

[INFO] Novo melhor modelo salvo em /home/bioinfo/Downloads/Dataset/best\_model.pt  
(val\_macro\_f1=0.7110)

===== Época 14/20 =====

[TRAIN] loss=0.4668 acc=0.9039 macro\_f1=0.9058 mcc=0.8720

[VAL] loss=0.5596 acc=0.8050 macro\_f1=0.7368 mcc=0.7161

[INFO] Novo melhor modelo salvo em /home/bioinfo/Downloads/Dataset/best\_model.pt  
(val\_macro\_f1=0.7368)

===== Época 15/20 =====

[TRAIN] loss=0.4210 acc=0.9178 macro\_f1=0.9185 mcc=0.8905

[VAL] loss=0.5275 acc=0.8117 macro\_f1=0.7311 mcc=0.7250

===== Época 16/20 =====

[TRAIN] loss=0.3774 acc=0.9339 macro\_f1=0.9355 mcc=0.9119

[VAL] loss=0.5471 acc=0.7950 macro\_f1=0.7087 mcc=0.7087

===== Época 17/20 =====

[TRAIN] loss=0.3215 acc=0.9489 macro\_f1=0.9493 mcc=0.9319

[VAL] loss=0.5775 acc=0.7933 macro\_f1=0.6449 mcc=0.7032

===== Época 18/20 =====

[TRAIN] loss=0.2990 acc=0.9500 macro\_f1=0.9494 mcc=0.9334

[VAL] loss=0.6386 acc=0.7667 macro\_f1=0.6606 mcc=0.6737

===== Época 19/20 =====

[TRAIN] loss=0.2455 acc=0.9706 macro\_f1=0.9709 mcc=0.9608

[VAL] loss=0.5863 acc=0.7917 macro\_f1=0.6780 mcc=0.7075

===== Época 20/20 =====

[TRAIN] loss=0.2466 acc=0.9706 macro\_f1=0.9704 mcc=0.9608

[VAL] loss=0.6652 acc=0.7767 macro\_f1=0.6447 mcc=0.6965

[OK] Histórico de treino salvo em: /home/bioinfo/Downloads/Dataset/training\_history.csv

[INFO] Carregando melhor modelo para avaliação no TEST...

===== RESULTADOS FINAIS (TEST) =====

[TEST] acc=0.8074 macro\_f1=0.7402 mcc=0.7146

Matriz de confusão (linhas = verdade, colunas = predito):

```
[[140  0  0  0]
 [  0 119 53  4]
 [  0 33 211  5]
 [  0 16  4 12]]
```

## RUN 2

### Prompt

```
(base) bioinfo@pop-os:~/Downloads/Dataset$ python train_multimodal.py \
--dataset_dir "$(pwd)" \
--epochs 20 \
--batch_size 16 \
--device cuda \
--backbone convnext_tiny \
--dropout_p 0.4 \
\
--backbone_unfreeze_mode partial \
--backbone_unfreeze_fraction 0.7 \
\
--freeze_epoch_start 11 \
--freeze_epoch_end 20 \
\
--phase_boundary_epoch 10 \
--lr_phase1 1e-5 \
--lr_phase2 1e-4 \
--weight_decay 1e-4 \
\
--loss_type ce --class_weights "2.0,6.0,6.0,4.0"
[INFO] Usando device: cuda
[INFO] Usando backbone: convnext_tiny
[INFO] Usando dropout_p: 0.4
[INFO] Épocas de treino: 20
[INFO] Batch size: 16
[INFO] LR base (--lr): 0.0001
[INFO] Fases de LR: Fase 1 (<= epoch 10) lr=1e-05, Fase 2 (> epoch 10) lr=0.0001
[INFO] Weight decay: 0.0001
[INFO] Loss type: ce
[INFO] Focal gamma: 2.0
```

[INFO] freeze\_backbone\_epochs (modo antigo): 0  
[INFO] freeze\_epoch\_start=11, freeze\_epoch\_end=20 (janela explícita de freeze;  
0=desativado)  
[INFO] backbone\_unfreeze\_mode=partial, backbone\_unfreeze\_fraction=0.7  
[INFO] Pesos manuais (string): 2.0,6.0,6.0,4.0  
[INFO] Criando DataLoaders...  
[INFO] Usando PESOS MANUAIS para a loss:  
    classe 0: peso = 2.0000  
    classe 1: peso = 6.0000  
    classe 2: peso = 6.0000  
    classe 3: peso = 4.0000  
[INFO] Usando CrossEntropyLoss ponderada.

## Output

===== Época 1/20 =====

[INFO] Ajustando LR para 1.00e-05 (época 1)  
[INFO] Estado do backbone na época 1: unfrozen\_last\_fraction=0.70  
[TRAIN] loss=1.1070 acc=0.5986 macro\_f1=0.5949 mcc=0.4714  
[VAL] loss=0.8588 acc=0.7500 macro\_f1=0.6832 mcc=0.6372  
[INFO] Novo melhor modelo salvo em /home/bioinfo/Downloads/Dataset/best\_model.pt  
(val\_macro\_f1=0.6832)

===== Época 2/20 =====

[TRAIN] loss=0.7212 acc=0.8223 macro\_f1=0.8172 mcc=0.7637  
[VAL] loss=0.7352 acc=0.7667 macro\_f1=0.7232 mcc=0.6652  
[INFO] Novo melhor modelo salvo em /home/bioinfo/Downloads/Dataset/best\_model.pt  
(val\_macro\_f1=0.7232)

===== Época 3/20 =====

[TRAIN] loss=0.5480 acc=0.8862 macro\_f1=0.8871 mcc=0.8485  
[VAL] loss=0.6346 acc=0.7983 macro\_f1=0.7403 mcc=0.7072  
[INFO] Novo melhor modelo salvo em /home/bioinfo/Downloads/Dataset/best\_model.pt  
(val\_macro\_f1=0.7403)

===== Época 4/20 =====

[TRAIN] loss=0.4241 acc=0.9311 macro\_f1=0.9318 mcc=0.9082  
[VAL] loss=0.6566 acc=0.7733 macro\_f1=0.7058 mcc=0.6895

===== Época 5/20 =====

[TRAIN] loss=0.3563 acc=0.9439 macro\_f1=0.9450 mcc=0.9253  
[VAL] loss=0.5853 acc=0.7983 macro\_f1=0.7200 mcc=0.7065

===== Época 6/20 =====

[TRAIN] loss=0.3001 acc=0.9606 macro\_f1=0.9591 mcc=0.9474  
[VAL] loss=0.5778 acc=0.8150 macro\_f1=0.7138 mcc=0.7384

===== Época 7/20 =====

[TRAIN] loss=0.2358 acc=0.9750 macro\_f1=0.9740 mcc=0.9667  
[VAL] loss=0.5338 acc=0.8267 macro\_f1=0.7527 mcc=0.7488

[INFO] Novo melhor modelo salvo em /home/bioinfo/Downloads/Dataset/best\_model.pt  
(val\_macro\_f1=0.7527)

===== Época 8/20 =====

[TRAIN] loss=0.2202 acc=0.9761 macro\_f1=0.9770 mcc=0.9682  
[VAL] loss=0.6294 acc=0.7883 macro\_f1=0.6753 mcc=0.7052

===== Época 9/20 =====

[TRAIN] loss=0.1794 acc=0.9867 macro\_f1=0.9864 mcc=0.9823  
[VAL] loss=0.5692 acc=0.8050 macro\_f1=0.7161 mcc=0.7171

===== Época 10/20 =====

[TRAIN] loss=0.1604 acc=0.9872 macro\_f1=0.9872 mcc=0.9830  
[VAL] loss=0.5897 acc=0.8183 macro\_f1=0.7117 mcc=0.7413

===== Época 11/20 =====

[INFO] Ajustando LR para 1.00e-04 (época 11)

[INFO] Estado do backbone na época 11: frozen (explicit\_window)

[TRAIN] loss=0.1149 acc=0.9922 macro\_f1=0.9922 mcc=0.9896  
[VAL] loss=0.5752 acc=0.8317 macro\_f1=0.7243 mcc=0.7557

===== Época 12/20 =====

[TRAIN] loss=0.0968 acc=0.9895 macro\_f1=0.9893 mcc=0.9859  
[VAL] loss=0.5993 acc=0.8317 macro\_f1=0.7239 mcc=0.7564

===== Época 13/20 =====

[TRAIN] loss=0.0787 acc=0.9889 macro\_f1=0.9891 mcc=0.9852  
[VAL] loss=0.5647 acc=0.8367 macro\_f1=0.7282 mcc=0.7624

===== Época 14/20 =====

[TRAIN] loss=0.0637 acc=0.9895 macro\_f1=0.9897 mcc=0.9859  
[VAL] loss=0.5971 acc=0.8333 macro\_f1=0.7248 mcc=0.7570

===== Época 15/20 =====

[TRAIN] loss=0.0569 acc=0.9939 macro\_f1=0.9939 mcc=0.9919  
[VAL] loss=0.5863 acc=0.8367 macro\_f1=0.7283 mcc=0.7620

===== Época 16/20 =====

[TRAIN] loss=0.0586 acc=0.9922 macro\_f1=0.9924 mcc=0.9896  
[VAL] loss=0.6720 acc=0.8267 macro\_f1=0.7018 mcc=0.7495

===== Época 17/20 =====

```
[TRAIN] loss=0.0442 acc=0.9939 macro_f1=0.9939 mcc=0.9919
[VAL] loss=0.6948 acc=0.8267 macro_f1=0.7107 mcc=0.7507
```

```
===== Época 18/20 =====
```

```
[TRAIN] loss=0.0470 acc=0.9917 macro_f1=0.9915 mcc=0.9889
[VAL] loss=0.6408 acc=0.8333 macro_f1=0.7169 mcc=0.7580
```

```
===== Época 19/20 =====
```

```
[TRAIN] loss=0.0323 acc=0.9956 macro_f1=0.9956 mcc=0.9941
[VAL] loss=0.6456 acc=0.8300 macro_f1=0.7230 mcc=0.7534
```

```
===== Época 20/20 =====
```

```
[TRAIN] loss=0.0298 acc=0.9967 macro_f1=0.9966 mcc=0.9956
[VAL] loss=0.7394 acc=0.8233 macro_f1=0.6985 mcc=0.7463
```

```
[OK] Histórico de treino salvo em: /home/bioinfo/Downloads/Dataset/training_history.csv
```

```
[INFO] Carregando melhor modelo para avaliação no TEST...
```

```
===== RESULTADOS FINAIS (TEST) =====
```

```
[TEST] acc=0.8157 macro_f1=0.7695 mcc=0.7273
```

Matriz de confusão (linhas = verdade, colunas = predito):

```
[[140  0  0  0]
 [  0 130 45  1]
 [  0 44 204  1]
 [  0 16  3 13]]
```

### **plot\_training\_curves.py**

```
python plot_training_curves.py \
  --history_path "/home/bioinfo/Downloads/Dataset/training_history.csv" \
  --dataset_dir "$(pwd)" \
  --out_dir "./plots" \
  --backbone "convnext_tiny" \
  --img_size 224 \
  --dropout_p 0.4
```