

## Multi-class Metrics



### Macro-Average

```
avg(metric1, metric2, ...)
```

Calculate metric for each class, then average. Equal class weight.



### Micro-Average

```
metric( $\Sigma$  TP,  $\Sigma$  FP,  $\Sigma$  FN)
```

Aggregate all classes first, then calculate. Favors majority.



### Weighted-Average

```
 $\Sigma$ (weight  $\times$  metric)
```

Weight by class support. Balances macro & micro.

### Example: F1 Score Calculation

Class A (100 samples)  $F_1 = 0.90$

Class B (50 samples)  $F_1 = 0.70$

Class C (50 samples)  $F_1 = 0.60$

#### Macro-Average

$(0.90 + 0.70 + 0.60) / 3$

**0.73**

#### Micro-Average

Aggregate TP/FP/FN

**0.82**

#### Weighted-Average

$(100 \times 0.90 + 50 \times 0.70 + 50 \times 0.60) / 200$

**0.78**



## Key Insights

### Macro

Treats all classes equally, good for balanced view

### Micro

Similar to accuracy, biased to majority class

### Weighted

Balanced approach considering class sizes

Confusion Matrix (5 Classes)

	C0	C1	C2	C3	C4
C0	45	3	2	0	0
C1	2	28	5	0	0
C2	1	4	18	2	0
C3	0	0	3	12	0
C4	0	0	1	1	8

Rows: Actual | Columns: Predicted | Total: 135 samples

Per-Class Metrics

Class	Support	Precision	Recall	F1
C0	50	0.938	0.900	<b>0.918</b>
C1	35	0.800	0.800	<b>0.800</b>
C2	25	0.621	0.720	<b>0.667</b>
C3	15	0.800	0.800	<b>0.800</b>
C4	10	1.000	0.800	<b>0.889</b>

Example Calculation for C0:

- TP = 45, FP = 3, FN = 5
- Precision =  $45/(45+3) = 0.938$
- Recall =  $45/(45+5) = 0.900$
- F1 =  $2 \times (0.938 \times 0.900) / (0.938 + 0.900) = 0.918$



## Final Averaged Metrics

### Macro-Average F1

**0.815**

$$(0.918 + 0.800 + 0.667 \\ + 0.800 + 0.889) / 5$$

### Micro-Average F1

**0.822**

$$\Sigma \text{TP} = 111, \Sigma \text{FP} = 24, \Sigma \text{FN} = 24 \\ \text{F1} = 2 \times 111 / (2 \times 111 + 24 + 24)$$

### Weighted-Average F1

**0.835**

$$(50 \times 0.918 + 35 \times 0.800 + 25 \times 0.667 \\ + 15 \times 0.800 + 10 \times 0.889) / 135$$

 **Interpretation:** Weighted (0.835) > Micro (0.822) > Macro (0.815) indicates the model performs better on majority classes (C0, C1) than on minority classes