| Actual<br>Label |
|-----------------|
| Idle            |
| Circle          |
| Circle          |
| Up-Down         |
| Left-Right      |
| Up-Down         |
|                 |

Model Circle
Idle
Left-right
Up-down

:

### **Predicted Label**

# Circle Idle Left-Right Up-Down Circle Idle Left-Right Up-Down Up-Down

| Validation<br>Sample | Actual<br>Label |
|----------------------|-----------------|
| 1                    | Idle            |
| 2                    | Circle          |
| 3                    | Circle          |
| 4                    | Up-Down         |
| 5                    | Left-Right      |
| 6                    | Up-Down         |
| _                    | <u>.</u>        |

# **Predicted Label**

|             |            | Circle | Idle | Left-Right | Up-Down |
|-------------|------------|--------|------|------------|---------|
|             | Circle     | 0      | 0    | 0          | 0       |
| )<br>5<br>1 | Idle       | 0      | 0    | 0          | 0       |
| 5           | Left-Right | 0      | 0    | 0          | 0       |
|             | Up-Down    | 0      | 0    | 0          | 0       |

| Validation<br>Sample | Actual<br>Label |
|----------------------|-----------------|
| 1                    | Idle            |
| 2                    | Circle          |
| 3                    | Circle          |
| 4                    | Up-Down         |
| 5                    | Left-Right      |
| 6                    | Up-Down         |
| •                    | •               |

# **Predicted Label**

|         |            | Circle | Idle | Left-Right | Up-Down |
|---------|------------|--------|------|------------|---------|
| <u></u> | Circle     | 0      | 0    | 0          | 0       |
| Label   | Idle       | 0      | 1    | 0          | 0       |
| Actual  | Left-Right | 0      | 0    | 0          | 0       |
| A       | Up-Down    | 0      | 0    | 0          | 0       |

Confusion Matrix

| Validation<br>Sample | Actual<br>Label |
|----------------------|-----------------|
| 1                    | Idle            |
| 2                    | Circle          |
| 3                    | Circle          |
| 4                    | Up-Down         |
| 5                    | Left-Right      |
| 6                    | Up-Down         |
|                      |                 |

# **Predicted Label**

|   |            | Circle | Idle | Left-Right | Up-Down |
|---|------------|--------|------|------------|---------|
| 5 | Circle     | 0      | 0    | 1          | 0       |
| 2 | Idle       | 0      | 1    | 0          | 0       |
| 5 | Left-Right | 0      | 0    | 0          | 0       |
|   | Up-Down    | 0      | 0    | 0          | 0       |

| Validation<br>Sample | Actual<br>Label |
|----------------------|-----------------|
| 1                    | Idle            |
| 2                    | Circle          |
| 3                    | Circle          |
| 4                    | Up-Down         |
| 5                    | Left-Right      |
| 6                    | Up-Down         |

Model Circle Idle Left-right Up-down

# **Predicted Label**

|            | Circle | Idle | Left-Right | Up-Down |
|------------|--------|------|------------|---------|
| Circle     | 205    | 10   | 1          | 46      |
| Idle       | 6      | 199  | 0          | 32      |
| Left-Right | 9      | 17   | 223        | 34      |
| Up-Down    | 21     | 8    | 3          | 186     |

**Confusion Matrix** 

Total accuracy: 
$$\frac{\sum correct}{\sum all} = \frac{813}{1000} = 0.813$$

#### **Predicted Label**

|          |            | Circle | Idle | Left-Right | Up-Down |
|----------|------------|--------|------|------------|---------|
| <u></u>  | Circle     | 205    | 10   | 1          | 46      |
| Label    | Idle       | 6      | 199  | 0          | 32      |
| Actual   | Left-Right | 9      | 17   | 223        | 34      |
| <b>4</b> | Up-Down    | 21     | 8    | 3          | 186     |

**Confusion Matrix** 

Total accuracy: 
$$\frac{\sum correct}{\sum all} = \frac{973}{1000} = 0.973$$

#### **Predicted Label**

|       |            | Circle | Idle | Left-Right | Up-Down |
|-------|------------|--------|------|------------|---------|
| 5     | Circle     | 0      | 6    | 0          | 0       |
|       | Idle       | 0      | 973  | 0          | 0       |
| וסומו | Left-Right | 0      | 11   | 0          | 0       |
|       | Up-Down    | 0      | 10   | 0          | 0       |

# **Confusion Matrix**

#### **Predicted Label**

| abel    |          | Positive | Negative |
|---------|----------|----------|----------|
| tual La | Positive | 38       | 17       |
| Actu    | Negative | 3        | 42       |

True Positive (TP): Predicted positive matches actual positive

True Negative (TN): Predicted negative matches actual negative

False Positive (FP) ("Type I Error"): Predicted positive does not match actual negative

False Negative (FN) ("Type II Error"): Predicted negative does not match actual positive

| . <u>×</u>       |             |            | Circle | ldle | Left-Right | Up-Down |
|------------------|-------------|------------|--------|------|------------|---------|
| Confusion Matrix | ctual Label | Circle     | 205    | 10   | 1          | 46      |
|                  |             | Idle       | 6      | 199  | 0          | 32      |
|                  |             | Left-Right | 9      | 17   | 223        | 34      |
| Ö                | ∢           | Up-Down    | 21     | 8    | 3          | 186     |

True Positive (TP): Predicted positive matches actual positive

True Negative (TN): Predicted negative matches actual negative

False Positive (FP) ("Type I Error"): Predicted positive does not match actual negative

False Negative (FN) ("Type II Error"): Predicted negative does not match actual positive

| <u>.×</u>        |         |            | Circle | Idle | Left-Right | Up-Down |
|------------------|---------|------------|--------|------|------------|---------|
| Confusion Matrix | <u></u> | Circle     | 205    | 10   | 1          | 46      |
|                  | Label   | Idle       | 6      | 199  | 0          | 32      |
|                  | Actual  | Left-Right | 9      | 17   | 223        | 34      |
| Ö                | ◀       | Up-Down    | 21     | 8    | 3          | 186     |

# Accuracy

$$ACC = \frac{TP + TN}{P + N} = \frac{TP + TN}{TP + TN + FP + FN} = \frac{TP + TN}{Total}$$

$$= \frac{199 + 728}{1000} = 0.927$$

| Confusion Matrix Actual Label |       |            | Circle | ldle | Left-Right | Up-Down |
|-------------------------------|-------|------------|--------|------|------------|---------|
|                               |       | Circle     | 205    | 10   | 1          | 46      |
|                               |       | Idle       | 6      | 199  | 0          | 32      |
|                               | ctual | Left-Right | 9      | 17   | 223        | 34      |
|                               | A     | Up-Down    | 21     | 8    | 3          | 186     |

True Positive Rate (TPR), Sensitivity, Recall, Hit Rate

$$TPR = \frac{TP}{P} = \frac{TP}{TP + FN} = \frac{199}{199 + 38} = 0.840$$

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|              |            | Circle | ldle | Left-Right | Up-Down |
|--------------|------------|--------|------|------------|---------|
| Actual Label | Circle     | 205    | 10   | 1          | 46      |
|              | Idle       | 6      | 199  | 0          | 32      |
|              | Left-Right | 9      | 17   | 223        | 34      |
|              | Up-Down    | 21     | 8    | 3          | 186     |

True Negative Rate (TNR), Specificity, Selectivity

$$TNR = \frac{TN}{N} = \frac{TN}{TN + FP} = \frac{1}{1 + 1}$$

$$= \frac{728}{728 + 35} = 0.954$$

|   | Matrix |
|---|--------|
|   | Sion   |
| • | ontu   |

Actual Label

|            | Circle | ldle | Left-Right | Up-Down |
|------------|--------|------|------------|---------|
| Circle     | 205    | 10   | 1          | 46      |
| ldle       | 6      | 199  | 0          | 32      |
| Left-Right | 9      | 17   | 223        | 34      |
| Up-Down    | 21     | 8    | 3          | 186     |

Positive Predictive Value (PPV), Precision

$$PPV = \frac{TP}{TP + FP} = \frac{199}{199} = \frac{199}{199 + 35} = 0.850$$

| <u>×</u>         |         |            | Circle | Idle | Left-Right | Up-Down |
|------------------|---------|------------|--------|------|------------|---------|
| Confusion Matrix | <u></u> | Circle     | 205    | 10   | 1          | 46      |
|                  | Label   | Idle       | 6      | 199  | 0          | 32      |
|                  | ctual   | Left-Right | 9      | 17   | 223        | 34      |
| Ö                | <       | Up-Down    | 21     | 8    | 3          | 186     |

F1 Score

$$F_{1} = 2 \cdot \frac{PPV \cdot TPR}{PPV + TPR} = \frac{2TP}{2TP + FP + FN}$$

$$= 2 \cdot \frac{0.850 \cdot 0.840}{0.850 + 0.840} = 0.845$$

| ×                  |         |            | Circle | Idle  | Left-Right | Up-Down |
|--------------------|---------|------------|--------|-------|------------|---------|
| Confusion Matrix   | <u></u> | Circle     | 205    | 10    | 1          | 46      |
|                    | Label   | Idle       | 6      | 199   | 0          | 32      |
|                    | Actual  | Left-Right | 9      | 17    | 223        | 34      |
|                    | ∢       | Up-Down    | 21     | 8     | 3          | 186     |
| Per-class accuracy |         | 0.907      | 0.927  | 0.936 | 0.856      |         |
| F1 scores          |         | 0.815      | 0.845  | 0.875 | 0.721      |         |

Total accuracy: 0.813

F1 average: 0.818

| ×                  |          |            | Circle | Idle  | Left-Right | Up-Down |
|--------------------|----------|------------|--------|-------|------------|---------|
| · <b>~</b>         | <u></u>  | Circle     | 0      | 6     | 0          | 0       |
|                    | Label    | Idle       | 0      | 973   | 0          | 0       |
|                    | Actual   | Left-Right | 0      | 11    | 0          | 0       |
|                    | <b>4</b> | Up-Down    | 0      | 10    | 0          | 0       |
| Per-class accuracy |          | 0.994      | 0.973  | 0.989 | 0.99       |         |
| F1 scores          |          | 0.0        | 0.986  | 0.0   | 0.0        |         |

Total accuracy: 0.973

F1 average: 0.247

A

193

A

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| Acti     |  |

| В | 5  | 173 | 22  |
|---|----|-----|-----|
| С | 10 | 1   | 189 |
|   |    |     |     |

B

Total: 600

Total accuracy: 92.5%

TP(C): 189

FP(C): 22

FN(C): 11

 $F1(C) = (2 * 189) / (2 * 189 + 22 + 11) = 0.9197 \sim 0.920$ 

0

| <u></u> |   | A   | В   | C   |
|---------|---|-----|-----|-----|
| Label   | A | 312 | 27  | 8   |
| Actual  | В | 0   | 265 | 11  |
| A       | С | 0   | 1   | 276 |

Total: 900

Total accuracy: 853 / 900 = 94.8% = 0.948

TP(A): 312

FP(A): 0

FN(A): 35

F1(A) = (2 \* 312) / (2 \* 312 + 0 + 35) = 0.947