

Prever ou Definir uma classe



A classe faz parte dos atributos do fenômeno

## Classes

#### Crédito

Tipo

Bom

Mau



#### Iris

Espécie

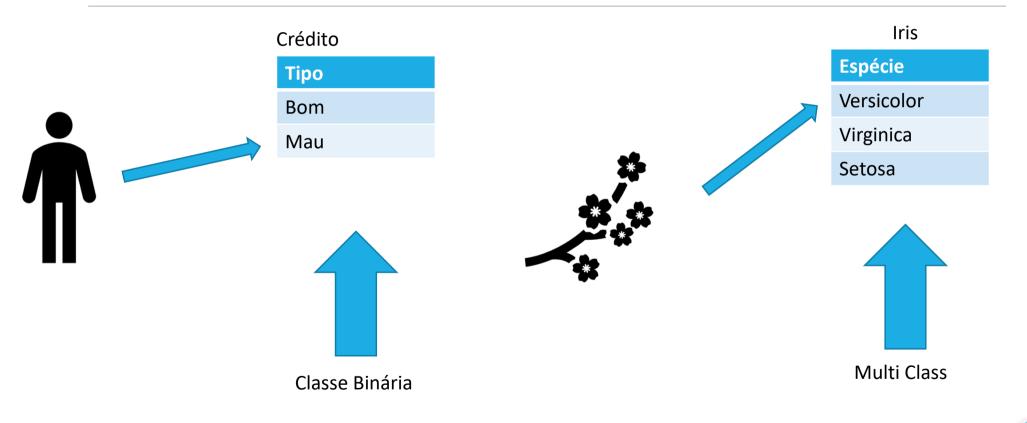
Versicolor

Virginica

Setosa

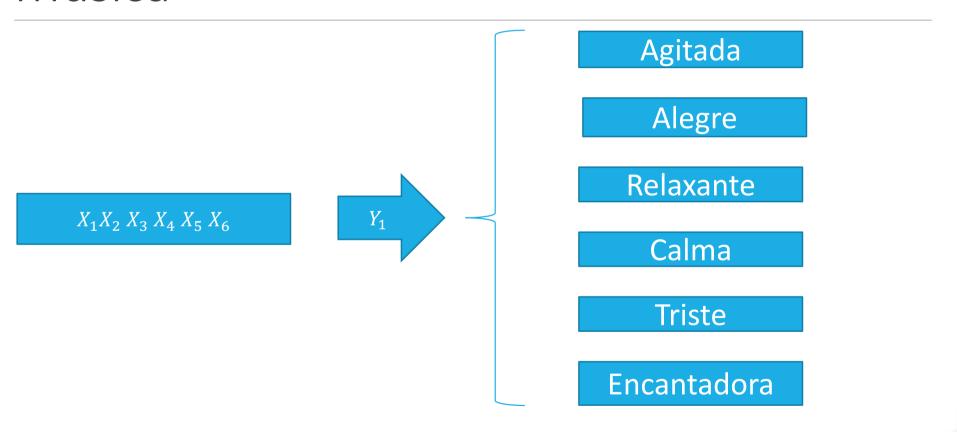




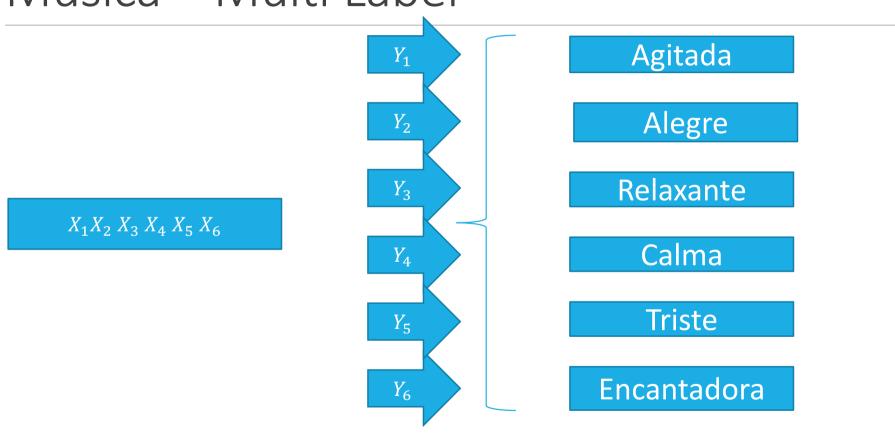


# Classificação Binária OU **Multi Classe Multi Label**

### Musica



#### Musica – Multi Label





- ➤ Binária: Calma ou Triste
- ➤ Multi Class: Calma ou Triste ou Encantadora
- ➤ Multi Label: Calma e/ou Triste e/ou Encantadora



#### Multi Label

| Agitada | Alegre | Relaxante | Calma    | Triste | Encantadora |
|---------|--------|-----------|----------|--------|-------------|
| ×       | ×      | <b>~</b>  | <b>~</b> | ×      | <b>~</b>    |



| 1  |       | happy.pleased | relaxing.clam | quiet.still | sad.lonely | angry.aggresive | Mean_Acc1298_Mean_Mem40_Centroid | Mean_Acc1298_Mean_Mem40_Roll |
|----|-------|---------------|---------------|-------------|------------|-----------------|----------------------------------|------------------------------|
| •  | FALSE | TRUE          | TRUE          | FALSE       | FALSE      | FALSE           | 0.132498                         | 0.077848                     |
| 2  | TRUE  | FALSE         | FALSE         | FALSE       | FALSE      | TRUE            | 0.384281                         | 0.355249                     |
| 3  | FALSE | TRUE          | FALSE         | FALSE       | FALSE      | TRUE            | 0.541782                         | 0.356491                     |
| 4  | FALSE | FALSE         | TRUE          | FALSE       | FALSE      | FALSE           | 0.174288                         | 0.243935                     |
| 5  | FALSE | FALSE         | FALSE         | TRUE        | FALSE      | FALSE           | 0.347436                         | 0.155448                     |
| 6  | FALSE | TRUE          | TRUE          | FALSE       | FALSE      | FALSE           | 0.228026                         | 0.109648                     |
| 7  | TRUE  | TRUE          | FALSE         | FALSE       | FALSE      | FALSE           | 0.290836                         | 0.165289                     |
| 8  | FALSE | FALSE         | FALSE         | FALSE       | FALSE      | TRUE            | 0.187613                         | 0.081515                     |
| 9  | TRUE  | TRUE          | FALSE         | FALSE       | FALSE      | FALSE           | 0.384173                         | 0.399660                     |
| 10 | FALSE | FALSE         | TRUE          | TRUE        | TRUE       | FALSE           | 0.159915                         | 0.028334                     |
| 11 | FALSE | TRUE          | TRUE          | FALSE       | FALSE      | FALSE           | 0.327076                         | 0.320403                     |
| 12 | FALSE | FALSE         | TRUE          | FALSE       | FALSE      | FALSE           | 0.358559                         | 0.205397                     |
| 13 | TRUE  | FALSE         | FALSE         | FALSE       | FALSE      | FALSE           | 0.553228                         | 0.466543                     |
| 14 | FALSE | FALSE         | TRUE          | FALSE       | TRUE       | FALSE           | 0.117628                         | 0.038582                     |
| 15 | FALSE | FALSE         | FALSE         | FALSE       | TRUE       | FALSE           | 0.249353                         | 0.115706                     |
| 16 | TRUE  | FALSE         | FALSE         | FALSE       | FALSE      | TRUE            | 0.384383                         | 0.685300                     |
| 17 | FALSE | FALSE         | TRUE          | TRUE        | TRUE       | FALSE           | 0.142330                         | 0.054325                     |
| 18 | FALSE | TRUE          | TRUE          | FALSE       | FALSE      | FALSE           | 0.343322                         | 0.321394                     |
| 19 | FALSE | FALSE         | FALSE         | FALSE       | TRUE       | TRUE            | 0.333808                         | 0.232241                     |

Showing 1 to 20 of 592 entries, 77 total columns

# Dados



#### Alternativas

- ➤ Transformação de Problema
  - ➤ Binary Relevance
  - Classificer Chains
  - ▶ Label Powerset
- ➤ Algoritmos Adaptados
  - ➤ Clare (C4.5)
  - >AdaBoost.MH
  - >ML-kNN

Dados adaptados ao classificador

Classificador adaptado aos dados



# Binary Relevance

| $X_1$ | $X_2$ | $X_n$ | Agitada | Alegre | Relaxante | Calma | Triste | Encantadora |
|-------|-------|-------|---------|--------|-----------|-------|--------|-------------|
|       |       |       | 1       | 0      | 1         | 0     | 1      | 0           |
|       |       |       | 0       | 1      | 0         | 1     | 0      | 1           |
|       |       |       | 1       | 0      | 1         | 0     | 1      | 0           |

| $X_1$ | $X_2$ | $X_n$ | Agitada |
|-------|-------|-------|---------|
| •••   | •••   | •••   | 1       |
|       |       |       | 0       |
|       |       | •••   | 1       |

| $X_1$ | $X_2$ | $X_n$ | Alegre |
|-------|-------|-------|--------|
|       |       |       | 0      |
|       |       |       | 1      |
|       |       |       | 0      |

| $X_1$ | $X_2$ | $X_n$ | Relaxante |
|-------|-------|-------|-----------|
|       |       |       | 1         |
|       |       |       | 0         |
|       |       |       | 1         |

. .



## Classifier Chains

| $X_1$ | $X_2$ | $X_n$ | Agitada | Alegre | Relaxante | Calma | Triste | Encantadora |
|-------|-------|-------|---------|--------|-----------|-------|--------|-------------|
|       |       |       | 1       | 0      | 1         | 0     | 1      | 0           |
|       |       |       | 0       | 1      | 0         | 1     | 0      | 1           |
|       |       |       | 1       | 0      | 1         | 0     | 1      | 0           |

| <b>1</b> 7 |
|------------|
| <i>Y</i> 1 |

| <i>X</i> <sub>1</sub> | $X_2$ | $X_n$ | Agitada |
|-----------------------|-------|-------|---------|
|                       | •••   |       | 1       |
|                       |       |       | 0       |
|                       |       |       | 1       |

| $\boldsymbol{v}$ | ν  |
|------------------|----|
| $X_n$            | I. |

| $X_1$ | $X_2$ | $X_n$ | Agitada | Alegre |
|-------|-------|-------|---------|--------|
|       |       | •••   | 1       | 0      |
|       |       |       | 0       | 1      |
|       |       |       | 1       | 0      |

| V           |  |
|-------------|--|
| X           |  |
| $\Lambda_n$ |  |

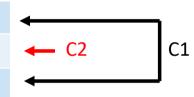
|           |       |       | $X_n$   | $X_n$  | $Y_1$     |
|-----------|-------|-------|---------|--------|-----------|
| $\zeta_1$ | $X_2$ | $X_n$ | Agitada | Alegre | Relaxante |
| ••        |       |       | 1       | 0      | 1         |
| ••        |       |       | 0       | 1      | 0         |
|           |       |       | 1       | 0      | 1         |





## Label Powerset

| $X_1$ | $X_2$ | $X_n$ | Agitada | Alegre | Relaxante | Calma | Triste | Encantadora |
|-------|-------|-------|---------|--------|-----------|-------|--------|-------------|
|       |       |       | 1       | 0      | 1         | 0     | 1      | 0           |
|       |       |       | 0       | 1      | 0         | 1     | 0      | 1           |
|       |       |       | 1       | 0      | 1         | 0     | 1      | 0           |



| $X_1$ | $X_2$ | $X_n$ | Classe |
|-------|-------|-------|--------|
| •••   |       |       | C1     |
|       |       |       | C2     |
|       |       |       | C3     |

