#### **TOULOUSE LAUTREC**

# APRENDIZAJE AUTOMATICO CON PYTHON

**REGRESION LINEAL** 

21.0



Ing. Alexander Valdez
Curso 2290, Clases Lunes y Miercoles 20:00-22:30pm
Tercera Clase

# Ejercicio Python de Regresión Logística

Realizaremos un ejercicio de prueba para comprender como funciona este algoritmo

```
In [4]: import pandas as pd
   import numpy as np
   from sklearn import linear_model
   from sklearn import model_selection
   from sklearn.metrics import classification_report
   from sklearn.metrics import confusion_matrix
   from sklearn.metrics import accuracy_score
   import matplotlib.pyplot as plt
   import seaborn as sb
%matplotlib inline
```

## Cargamos los datos de entrada del archivo csv

```
In [1]: from google.colab import drive
    drive.mount('/content/drive')

Mounted at /content/drive

In [5]: dataframe = pd.read_csv(r"/content/drive/MyDrive/DATASET_TOULOUSE_C3/usuarios_win_mac_lidataframe.head()

Out[5]: duracion paginas acciones valor clase

0    7.0    2    4    8    2
```

```
      2
      57.0
      2
      4
      4
      2

      3
      101.0
      3
      6
      12
      2

      4
      109.0
      2
      6
      12
      2
```

```
In [ ]: dataframe.describe()
```

			_	_	
$\cap$	1.1	+	Г	- 1	0
$\cup$	u	L		- 1	0

	duracion	paginas	acciones	valor	clase
count	170.000000	170.000000	170.000000	170.000000	170.000000
mean	111.075729	2.041176	8.723529	32.676471	0.752941
std	202.453200	1.500911	9.136054	44.751993	0.841327
min	1.000000	1.000000	1.000000	1.000000	0.000000
25%	11.000000	1.000000	3.000000	8.000000	0.000000
50%	13.000000	2.000000	6.000000	20.000000	0.000000
75%	108.000000	2.000000	10.000000	36.000000	2.000000
max	898.000000	9.000000	63.000000	378.000000	2.000000

#### **IDENTIFICACION**

- 0 -> WINDOWS
- 1 -> MACINTOSH
- 2 -> Linux

```
In [6]: print(dataframe.groupby('clase').size())
```

```
clase
```

0 86

1 40

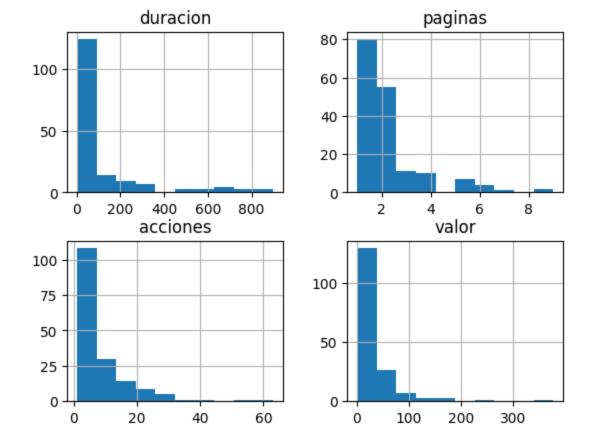
2 44

dtype: int64

### Visualizamos los datos

```
In [7]: dataframe.drop(['clase'],1).hist()
   plt.show()
```

<ipython-input-7-f7a7d4a61992>:1: FutureWarning: In a future version of pandas all argum
ents of DataFrame.drop except for the argument 'labels' will be keyword-only.
 dataframe.drop(['clase'],1).hist()

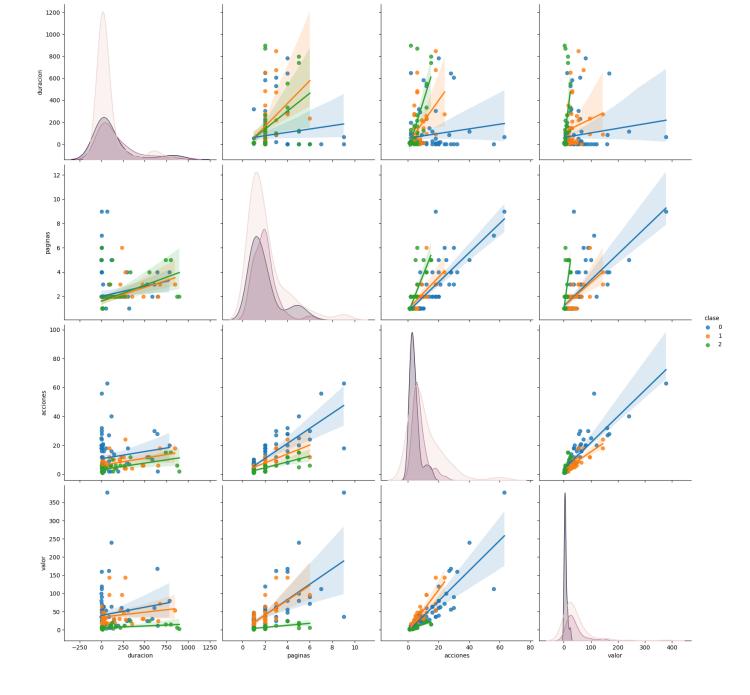


In [8]: sb.pairplot(dataframe.dropna(), hue='clase', size=4, vars=["duracion", "paginas", "acciones

/usr/local/lib/python3.10/dist-packages/seaborn/axisgrid.py:2095: UserWarning: The `size ` parameter has been renamed to `height`; please update your code. warnings.warn(msg, UserWarning)

<seaborn.axisgrid.PairGrid at 0x7c51d31a8160>

Out[8]:



#### Creamos el modelo

```
X = np.array(dataframe.drop(['clase'],1))
In [9]:
         y = np.array(dataframe['clase'])
        X.shape
        <ipython-input-9-a6ee9c4ef3fa>:1: FutureWarning: In a future version of pandas all argum
        ents of DataFrame.drop except for the argument 'labels' will be keyword-only.
          X = np.array(dataframe.drop(['clase'],1))
         (170, 4)
Out[9]:
        model = linear model.LogisticRegression()
In [11]:
        model.fit(X,y)
        /usr/local/lib/python3.10/dist-packages/sklearn/linear model/ logistic.py:458: Convergen
        ceWarning: lbfgs failed to converge (status=1):
        STOP: TOTAL NO. of ITERATIONS REACHED LIMIT.
        Increase the number of iterations (max iter) or scale the data as shown in:
            https://scikit-learn.org/stable/modules/preprocessing.html
```

```
Out[11]: ▼ LogisticRegression
        LogisticRegression()
In [12]: predictions = model.predict(X)
         print(predictions[0:5])
         [2 2 2 2 2]
In [ ]: model.score(X, y)
        0.7823529411764706
Out[ ]:
        Adicional: Validación del Modelo
In [14]: validation size = 0.20
         seed = 7
         X train, X validation, Y train, Y validation = model selection.train test split(X, y, te
In [15]: | name='Logistic Regression'
         kfold = model selection.KFold(n splits=10, shuffle=True, random state=seed)
         cv results = model selection.cross val score (model, X train, Y train, cv=kfold, scoring=
         msg = "%s: %f (%f)" % (name, cv results.mean(), cv results.std())
         print(msg)
        Logistic Regression: 0.712637 (0.146407)
        /usr/local/lib/python3.10/dist-packages/sklearn/linear model/ logistic.py:458: Convergen
        ceWarning: lbfgs failed to converge (status=1):
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        Please also refer to the documentation for alternative solver options:
            https://scikit-learn.org/stable/modules/linear model.html#logistic-regression
          n iter i = check optimize result(
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Please also refer to the documentation for alternative solver options:
   https://scikit-learn.org/stable/modules/linear model.html#logistic-regression
n iter i = check optimize result(
```

```
In [16]: predictions = model.predict(X_validation)
   print(accuracy_score(Y_validation, predictions))
```

0.8529411764705882

## Reporte de Resultados

```
print(confusion matrix(Y validation, predictions))
       [[16 0 2]
        [ 3 3 0]
        [ 0 0 10]]
In [ ]: print(classification report(Y validation, predictions))
                    precision recall f1-score
                                                   support
                 0
                         0.84
                                  0.89
                                           0.86
                                                       18
                         1.00
                 1
                                  0.50
                                            0.67
                         0.83
                                  1.00
                                            0.91
                                                       10
                                            0.85
                                                       34
           accuracy
                       0.89
                                  0.80
                                            0.81
                                                       34
          macro avg
       weighted avg
                        0.87
                                  0.85
                                           0.84
                                                       34
```

# Clasificación de nuevos registros