

# ENTREGA 3 DE SISTEMAS INTELIGENTES

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## DEFINICIÓN DEL PROBLEMA

Se presenta un problema donde en un futuro lejano, una nave espacial Titanic, con casi 13.000 pasajeros a bordo, emprende su viaje inaugural hacia tres exoplanetas habitables. Mientras rodeaba Alpha Centauri en ruta hacia su primer destino, la nave espacial Titanic chocó con una anomalía del espacio-tiempo escondida dentro de una nube de polvo. La nave permaneció intacta, sin embargo, casi la mitad de los pasajeros fueron transportados a una dimensión alternativa. El objetivo del algoritmo será predecir dado un individuo (si hubiera estado en esa situación) si sería transportado o no.

## VISUALIZACION y Selección de variables

En la visualización/exploración de nuestro conjunto de datos podemos extraer la siguiente información:

- El conjunto de datos es información sobre los pasajeros a bordo de la nave espacial Titanic.
- Se obtuvo la información personal de aproximadamente 8700 pasajeros.
- La variable de estudio es representada por si el pasajero fue transportado a otra dimensión o no.
- Los datos recogen 8693 individuos de los cuales 4315 no fueron transportados a otra dimensión y 4378 que sí que lo fueron.
- Que cada individuo tiene 14 atributos/variables, 7 nominales, 6 numéricos y la variable respuesta:

✓ @attribute 'PassengerId': Una identificación única para cada pasajero. Cada Id toma la forma gggg\_pp donde gggg indica un grupo con el que viaja el pasajero y pp es su número dentro del grupo. Las personas en un grupo a menudo son miembros de la familia, pero no siempre.

✓ @attribute 'HomePlanet': Planeta del que parte el pasajero.

✓ @attribute 'CryoSleep': Indica si el pasajero eligió ser puesto en animación suspendida durante la duración del viaje. Los pasajeros en

crio sueño están  
confinados en sus cabinas.

✓ @attribute 'Cabin': El número de cabina donde se hospeda el pasajero. Toma la forma cubierta/número/lado, donde lado puede ser P para babor o S para estribor.

✓ @attribute 'Destination': El planeta en el que desembarcará el pasajero.

✓ @attribute 'Age': Edad del pasajero.

✓ @attribute 'VIP' : Si el pasajero es VIP o no.

✓ @attribute 'RoomService', 'FoodCourt', 'ShoppingMall', 'Spa', 'VRDeck': Dinero facturado en cada uno de los servicios de lujo

✓ @attribute 'Name': Los nombres y apellidos del pasajero/a.

✓ @attribute 'Transported': Si el pasajero fue transportado a otra dimensión o no.

- Las variables que borraremos serán Destination, RoomService, FoodCourt, ShoppingMall, Spa y VRDeck y Name (dinero gastado, el nombre y el destino de un pasajero) debido a que son variables que estamos seguros de que no van a influenciar en nada a que un pasajero se transporte o no.

- El resto de variables hemos decidido tratarlas para su posterior análisis. Como desconocemos totalmente los motivos por lo que un individuo se transporta o no, no queremos descartar las diferentes teorías por muy extrañas que sean. Por lo que trabajaremos con ellas, y finalmente, en la poda podremos concretar y descartar estas opciones. Principalmente barajamos dos teorías que podrían influir en el destino de un pasajero:

✓ Más probable: La localización en el momento del impacto

✓ Menos probable: Las condiciones físicas y la tendencia genética a la transportación.

Sospechamos que el motivo más probable de que un individuo se transporte o no será su localización en la nave en el momento del impacto. Por eso hemos decidido dejar las variables que pueden tener relación con esta; PassengerId, CryoSleep, Cabin y VIP. Sin embargo, también pensamos que el destino de un individuo también puede depender de alguna forma de su genética/rasgos físicos, por lo que hemos creído oportuno dejar las

variables: PassengerId, HomePlanet y Age. Características físicas como por ejemplo son la altura o el peso, capacidades físicas como la velocidad para escapar, la fuerza para agarrarse a las cosas... O simplemente la tendencia genética a ser transportado a otra dimensión. (que no tenemos ni idea si podría influir).

Es destacable el motivo por el que creemos que la variable PassengerId es muy importante, ya que extrayendo unicamente la informacion de la familia a la que permanece un individuo, esta nos puede arrojar información sobre su localización (entendemos que una persona tiene más probabilidades de moverse por la nave acompañado de sus allegados, que en solitario con gente sin ninguna relación), y también sobre sus características genéticas. Parecido (con respecto a la ubicación) con los que pensamos de la variable VIP, que creemos que un individuo de una determinada clase social tiene más probabilidades de estar con sus iguales en zonas reservadas para estos.

In [1]: *#IMPORTACION DE LIBRERIAS*

```
import pandas as pd
from sklearn.impute import SimpleImputer
from sklearn.compose import ColumnTransformer
import numpy as np
```

In [2]: *##Compruebo que La Lectura de Los datos se hace correspondiente (viendo si detecta)*

In [3]: `df= pd.read_csv('./conjDatosE3.csv', na_values= '?')`

In [4]: `df.head()`

Out[4]:

	PassengerId	HomePlanet	CryoSleep	Cabin	Destination	Age	VIP	RoomService	FoodCourt
0	0001_01	Europa	False	B/0/P	TRAPPIST-1e	39.0	False	0.0	0.0
1	0002_01	Earth	False	F/0/S	TRAPPIST-1e	24.0	False	109.0	9.0
2	0003_01	Europa	False	A/0/S	TRAPPIST-1e	58.0	True	43.0	3576.0
3	0003_02	Europa	False	A/0/S	TRAPPIST-1e	33.0	False	0.0	1283.0
4	0004_01	Earth	False	F/1/S	TRAPPIST-1e	16.0	False	303.0	70.0

In [5]: `df.isnull().sum()`

```
Out[5]: PassengerId      0
        HomePlanet    201
        CryoSleep     217
        Cabin         199
        Destination   182
        Age           179
        VIP            203
        RoomService   181
        FoodCourt     183
        ShoppingMall  208
        Spa           183
        VRDeck        188
        Name          200
        Transported    0
dtype: int64
```

## PREPROCESADO DE LOS DATOS

1) Quitamos las variables inútiles

2) Tratamos los valores perdidos --> imputacion

3) Ingeniería de características

Obtener informacion a partir de variables existentes para crear nuevas con más sentido

4) Tratamiento de variables categóricas y continuas

Discretizamos en 4 intervalos de igual dimensión la variable edad

5) Normalización de variables

```
In [6]: #QUITAMOS LAS VARIABLES/ATRIBUTOS QUE EN LA EXPLORACION/VISUALIZACION DE LOS DATOS
        #INFLUYEN EN LA VARIABLE RESPUESTA
```

```
In [7]: datos = df[['PassengerId', 'HomePlanet', 'CryoSleep', 'Cabin', 'Age', 'VIP', 'Transported']]
```

```
In [8]: datos
```

Out[8]:

	PassengerId	HomePlanet	CryoSleep	Cabin	Age	VIP	Transported
0	0001_01	Europa	False	B/0/P	39.0	False	False
1	0002_01	Earth	False	F/0/S	24.0	False	True
2	0003_01	Europa	False	A/0/S	58.0	True	False
3	0003_02	Europa	False	A/0/S	33.0	False	False
4	0004_01	Earth	False	F/1/S	16.0	False	True
...	...	...	...	...	...	...	...
8688	9276_01	Europa	False	A/98/P	41.0	True	False
8689	9278_01	Earth	True	G/1499/S	18.0	False	False
8690	9279_01	Earth	False	G/1500/S	26.0	False	True
8691	9280_01	Europa	False	E/608/S	32.0	False	False
8692	9280_02	Europa	False	E/608/S	44.0	False	True

8693 rows × 7 columns

In [9]:

```
##TRATAMIENTO DE VALORES PERDIDOS --> IMPUTACION a través del column transformer
```

In [10]:

```
datos.isnull().sum()
```

Out[10]:

```
PassengerId      0
HomePlanet      201
CryoSleep        217
Cabin            199
Age              179
VIP              203
Transported       0
dtype: int64
```

In [11]:

```
#para comprobar que hemos solucionado bien la imputación, vemos por ejemplo los valores de CryoSleep
#comprobar posteriormente que se han imputado correctamente

missing = datos['CryoSleep'].isnull()
datos[missing][0:5]
```

Out[11]:

	PassengerId	HomePlanet	CryoSleep	Cabin	Age	VIP	Transported
92	0099_02	Earth	NaN	G/12/P	2.0	False	True
98	0105_01	Earth	NaN	F/21/P	27.0	False	False
104	0110_02	Europa	NaN	B/5/P	40.0	False	False
111	0115_01	Mars	NaN	F/24/P	26.0	False	True
152	0173_01	Earth	NaN	E/11/S	58.0	False	True

In [12]:

```
#Realizamos LA IMPUTACION a través de transformaciones sobre las columnas

ct = ColumnTransformer([
    ("nada",'passthrough',['PassengerId']), #no tiene valores perdidos y no aplicar
    ("modaHP",SimpleImputer(strategy='most_frequent'),['HomePlanet']),
    ("modaCS",SimpleImputer(strategy='most_frequent'),['CryoSleep']), #se imputa por moda
    ("modaC",SimpleImputer(strategy='most_frequent'),['Cabin']),
    ("media",SimpleImputer(strategy='mean'),['Age']), # por la media
```

```
("modaV", SimpleImputer(strategy='most_frequent'), ['VIP'])
], remainder='passthrough') #para la ultima variable lo hacemos así, pero podr

datos2 = ct.fit_transform(datos)

#Comprobamos que los valores se han imputado correctamente

datos2[missing][0:5]
```

```
Out[12]: array([['0099_02', 'Earth', False, 'G/12/P', 2.0, False, True],
       ['0105_01', 'Earth', False, 'F/21/P', 27.0, False, False],
       ['0110_02', 'Europa', False, 'B/5/P', 40.0, False, False],
       ['0115_01', 'Mars', False, 'F/24/P', 26.0, False, True],
       ['0173_01', 'Earth', False, 'E/11/S', 58.0, False, True]],
      dtype=object)
```

```
In [13]: # Al aplicar el column transformer de sklearn nuestros datos pasan a formato numpy
# para que sea más agradable lo pasamos a tabla de datos pandas

datos21 = pd.DataFrame(datos2, columns=datos.columns)
datos21
```

```
Out[13]:
```

	PassengerId	HomePlanet	CryoSleep	Cabin	Age	VIP	Transported
0	0001_01	Europa	False	B/0/P	39.0	False	False
1	0002_01	Earth	False	F/0/S	24.0	False	True
2	0003_01	Europa	False	A/0/S	58.0	True	False
3	0003_02	Europa	False	A/0/S	33.0	False	False
4	0004_01	Earth	False	F/1/S	16.0	False	True
...	...	...	...	...	...	...	...
8688	9276_01	Europa	False	A/98/P	41.0	True	False
8689	9278_01	Earth	True	G/1499/S	18.0	False	False
8690	9279_01	Earth	False	G/1500/S	26.0	False	True
8691	9280_01	Europa	False	E/608/S	32.0	False	False
8692	9280_02	Europa	False	E/608/S	44.0	False	True

8693 rows × 7 columns

```
In [14]: # INGENIERIA DE CARACTERISTICAS:
#A partir de la variable cabin, obtenemos los atributos CUBIERTA/PLANTA y LADO.
#La variable CUBIERTA/PLANTA corresponde a la altura en la que están situadas las cabinas
#La variable LADO corresponde a si la cabina se sitúa a estribor o a babor
#que describen la ubicación de los camarotes de los pasajeros
```

```
In [15]: #VARIABLE CATEGORICA ORDINAL (cuyo orden es el alfabético)

datos21['CUBIERTA/PLANTA'] = datos21['Cabin'].apply(lambda cabin: cabin[0]) #no hay que
datos21[0:5]
```

Out[15]:

	PassengerId	HomePlanet	CryoSleep	Cabin	Age	VIP	Transported	CUBIERTA/PLANTA
0	0001_01	Europa	False	B/0/P	39.0	False	False	B
1	0002_01	Earth	False	F/0/S	24.0	False	True	F
2	0003_01	Europa	False	A/0/S	58.0	True	False	A
3	0003_02	Europa	False	A/0/S	33.0	False	False	A
4	0004_01	Earth	False	F/1/S	16.0	False	True	F

In [16]:

```
#VARIABLE CATEGORICA NOMINAL

datos21['LADO'] = datos21['Cabin'].apply(lambda cabin: cabin.split('/')[2] ) #no hay dato para el 0
datos21[0:5]
```

Out[16]:

	PassengerId	HomePlanet	CryoSleep	Cabin	Age	VIP	Transported	CUBIERTA/PLANTA	LAD
0	0001_01	Europa	False	B/0/P	39.0	False	False	B	
1	0002_01	Earth	False	F/0/S	24.0	False	True	F	
2	0003_01	Europa	False	A/0/S	58.0	True	False	A	
3	0003_02	Europa	False	A/0/S	33.0	False	False	A	
4	0004_01	Earth	False	F/1/S	16.0	False	True	F	

In [17]:

```
# INGENIERIA DE CARACTERISTICAS:
#A partir de la variable passengerId, obtenemos el atributo FAMILIA, que se corresponde con el planeta al que pertenece el individuo
# a la que pertenece un individuo (que nos interesa como comentamos anteriormente)
```

In [18]:

```
#VARIABLE CATEGORICA NOMINAL

datos21['FAMILIA'] = datos21['PassengerId'].apply(lambda id: id[0:4] ) #no hay dato para el 0
datos21[0:5]
```

Out[18]:

	PassengerId	HomePlanet	CryoSleep	Cabin	Age	VIP	Transported	CUBIERTA/PLANTA	LAD
0	0001_01	Europa	False	B/0/P	39.0	False	False	B	
1	0002_01	Earth	False	F/0/S	24.0	False	True	F	
2	0003_01	Europa	False	A/0/S	58.0	True	False	A	
3	0003_02	Europa	False	A/0/S	33.0	False	False	A	
4	0004_01	Earth	False	F/1/S	16.0	False	True	F	

In [19]:

```
datos4 = datos21[['FAMILIA', 'HomePlanet', 'CryoSleep', 'CUBIERTA/PLANTA', 'LADO' ],
datos4
```

Out[19]:

	FAMILIA	HomePlanet	CryoSleep	CUBIERTA/PLANTA	LADO	Age	VIP	Transported
0	0001	Europa	False		B	P	39.0	False
1	0002	Earth	False		F	S	24.0	True
2	0003	Europa	False		A	S	58.0	False
3	0003	Europa	False		A	S	33.0	False
4	0004	Earth	False		F	S	16.0	True
...	...	...	...	...	...	...	...	...
8688	9276	Europa	False		A	P	41.0	False
8689	9278	Earth	True		G	S	18.0	False
8690	9279	Earth	False		G	S	26.0	True
8691	9280	Europa	False		E	S	32.0	False
8692	9280	Europa	False		E	S	44.0	True

8693 rows × 8 columns

In [20]: *# TRATAMIENTO DE VARIABLES CATEGÓRICAS*

```

from sklearn.pipeline import Pipeline
from sklearn.preprocessing import OneHotEncoder
from sklearn.preprocessing import KBinsDiscretizer
from sklearn.preprocessing import OrdinalEncoder

```

In [21]: `datos4['CUBIERTA/PLANTA'].unique()`Out[21]: `array(['B', 'F', 'A', 'G', 'E', 'D', 'C', 'T'], dtype=object)`

In [22]: *#No usamos pipeline ya que no nos interesa hacer todas las transformaciones en un pipeline  
 #ya creado nuevas características a partir de las ya existentes y para eso tenían que estar en el pipeline  
 #Discretizamos age porque vemos más funcional/descriptivo saber si dependiendo de la edad se transporta o no*

```

ct2 = ColumnTransformer([
    ("HP", OneHotEncoder(), ['HomePlanet']),
    ("CS", OneHotEncoder(), ['CryoSleep']),
    ("A", KBinsDiscretizer(4, strategy='uniform', encode='ordinal'), ['Age']),
    ("VIP", OneHotEncoder(), ['VIP']),
    ("LD", OneHotEncoder(), ['LADO']),
    ("ordCP", OrdinalEncoder(categories=[['A', 'B', 'C', 'D', 'E', 'F', 'G', 'T']]), ['CUBIERTA/PLANTA']),
    #("fam", OneHotEncoder(), ['FAMILIA']),
    ("nada", OneHotEncoder(), ['Transported'])
])

```

```

datos5 = ct2.fit_transform(datos4)

```

```

datos5

```

*#Como al hacer OneHotEncoding en la variable familia nos saldrían miles de columnas  
 # con una tabla que ni siquiera somos capaces de visualizar, hemos decidido eliminarla*



```
Out[22]: array([[0., 1., 0., ..., 1., 1., 0.],
        [1., 0., 0., ..., 5., 0., 1.],
        [0., 1., 0., ..., 0., 1., 0.],
        ...,
        [1., 0., 0., ..., 6., 0., 1.],
        [0., 1., 0., ..., 4., 1., 0.],
        [0., 1., 0., ..., 4., 0., 1.]])
```

```
In [23]: datos4.head()
```

```
Out[23]:
```

	FAMILIA	HomePlanet	CryoSleep	CUBIERTA/PLANTA	LADO	Age	VIP	Transported
0	0001	Europa	False		B	P	39.0	False
1	0002	Earth	False		F	S	24.0	False
2	0003	Europa	False		A	S	58.0	True
3	0003	Europa	False		A	S	33.0	False
4	0004	Earth	False		F	S	16.0	False

```
In [24]: #datos5[:200,:31 ]
print(datos5[:5, : ])
```

```
[[0. 1. 0. 1. 0. 1. 1. 0. 1. 0. 1. 1. 0.]
 [1. 0. 0. 1. 0. 1. 1. 0. 0. 1. 5. 0. 1.]
 [0. 1. 0. 1. 0. 2. 0. 1. 0. 1. 0. 1. 0.]
 [0. 1. 0. 1. 0. 1. 1. 0. 0. 1. 0. 1. 0.]
 [1. 0. 0. 1. 0. 0. 1. 0. 0. 1. 5. 0. 1.]]
```

```
In [25]: datos4.columns
```

```
Out[25]: Index(['FAMILIA', 'HomePlanet', 'CryoSleep', 'CUBIERTA/PLANTA', 'LADO', 'Age',
              'VIP', 'Transported'],
              dtype='object')
```

```
In [26]: #Al aplicar onehotencoding con dos posibles categorias, nos crea dos columnas, mien
#una binarizada.
#Para conseguirlo realizamos ahora estos pasos, y finalmente eliminamos una de las
```

```
colnames = ['HomePlanet=Tierra', 'HomePlanet=Europa', 'HomePlanet= Mars', 'CryoSleep=
            'VIP=False', '2', 'LADO= P', 'LADO= S', 'CUBIERTA/PLANTA', 'Transported=Fa
```

```
datos51 = pd.DataFrame(datos5, columns=colnames)
datos51
```

Out[26]:

	HomePlanet=Tierra	HomePlanet=Europa	HomePlanet=Mars	CryoSleep=False	2	Age	VIP=Fa
0	0.0	1.0	0.0	1.0	0.0	1.0	
1	1.0	0.0	0.0	1.0	0.0	1.0	
2	0.0	1.0	0.0	1.0	0.0	2.0	
3	0.0	1.0	0.0	1.0	0.0	1.0	
4	1.0	0.0	0.0	1.0	0.0	0.0	
...	...	...	...	...	...	...	
8688	0.0	1.0	0.0	1.0	0.0	2.0	
8689	1.0	0.0	0.0	0.0	1.0	0.0	
8690	1.0	0.0	0.0	1.0	0.0	1.0	
8691	0.0	1.0	0.0	1.0	0.0	1.0	
8692	0.0	1.0	0.0	1.0	0.0	2.0	

8693 rows × 13 columns

In [27]:

```
datos6pd=datos51[['HomePlanet=Tierra', 'HomePlanet=Europa', 'HomePlanet= Mars', 'CryoSleep=False', 'Age', 'VIP=False', 'LADO= P', 'LADO= S', 'CUBIERTA/PLANTA', 'Transported=False']]
datos6pd
```

Out[27]:

	HomePlanet=Tierra	HomePlanet=Europa	HomePlanet=Mars	CryoSleep=False	Age	VIP=False
0	0.0	1.0	0.0	1.0	1.0	1.0
1	1.0	0.0	0.0	1.0	1.0	1.0
2	0.0	1.0	0.0	1.0	2.0	0.0
3	0.0	1.0	0.0	1.0	1.0	1.0
4	1.0	0.0	0.0	1.0	0.0	1.0
...	...	...	...	...	...	...
8688	0.0	1.0	0.0	1.0	2.0	0.0
8689	1.0	0.0	0.0	0.0	0.0	1.0
8690	1.0	0.0	0.0	1.0	1.0	1.0
8691	0.0	1.0	0.0	1.0	1.0	1.0
8692	0.0	1.0	0.0	1.0	2.0	1.0

8693 rows × 10 columns

In [28]:

```
#NORMALIZACION//ESCALADO DE DATOS
from sklearn.preprocessing import MinMaxScaler
```

In [29]:

```
#paso la tabla de datos de pandas DATOS6 a matriz de numpy
# para aplicar la normalizacion
```

```
datos6np=datos6pd.to_numpy()
datos6np
```

Out[29]: array([[0., 1., 0., ..., 0., 1., 1.],
 [1., 0., 0., ..., 1., 5., 0.],
 [0., 1., 0., ..., 1., 0., 1.],
 ...,
 [1., 0., 0., ..., 1., 6., 0.],
 [0., 1., 0., ..., 1., 4., 1.],
 [0., 1., 0., ..., 1., 4., 0.]])

```
In [30]: #Voy a normalizar todos los datos (independientemente del clasificador que aplique

scaler = MinMaxScaler(feature_range=(0, 1))
scaler.fit(datos6np)
datos6np_escalado = scaler.transform(datos6np)
print(datos6np_escalado[:6,])
```

```
[[0.      1.      0.      1.      0.33333333 1.
  1.      0.      0.14285714 1.      ]
 [1.      0.      0.      1.      0.33333333 1.
  0.      1.      0.71428571 0.      ]
 [0.      1.      0.      1.      0.66666667 0.
  0.      1.      0.      1.      ]
 [0.      1.      0.      1.      0.33333333 1.
  0.      1.      0.      1.      ]
 [1.      0.      0.      1.      0.      1.
  0.      1.      0.71428571 0.      ]
 [1.      0.      0.      1.      0.66666667 1.
  1.      0.      0.71428571 0.      ]]
```

```
In [31]: datosEpd = pd.DataFrame(datos6np_escalado, columns= datos6pd.columns)
datosEpd
```

Out[31]:

	HomePlanet=Tierra	HomePlanet=Europa	HomePlanet=Mars	CryoSleep=False	Age	VIP=False
0	0.0	1.0	0.0	1.0	0.333333	
1	1.0	0.0	0.0	1.0	0.333333	
2	0.0	1.0	0.0	1.0	0.666667	
3	0.0	1.0	0.0	1.0	0.333333	
4	1.0	0.0	0.0	1.0	0.000000	
...	...	...	...	...	...	
8688	0.0	1.0	0.0	1.0	0.666667	
8689	1.0	0.0	0.0	0.0	0.000000	
8690	1.0	0.0	0.0	1.0	0.333333	
8691	0.0	1.0	0.0	1.0	0.333333	
8692	0.0	1.0	0.0	1.0	0.666667	

8693 rows × 10 columns



# SELECCION DE CARACTERÍSTICAS

# 1)Matriz de correlación

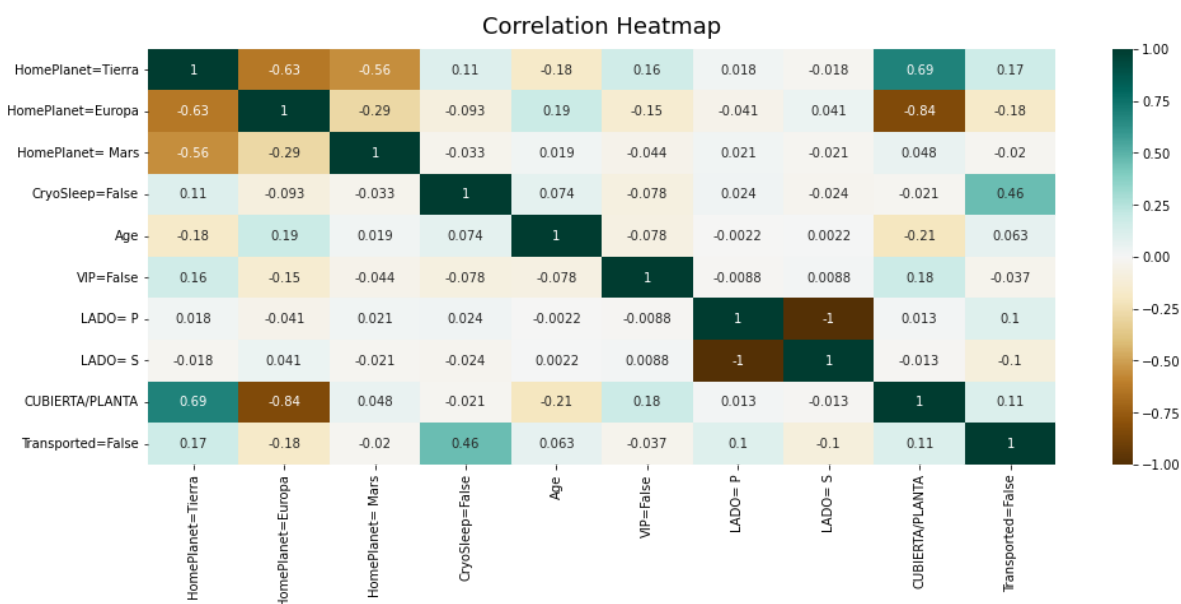
## 2)Método de envoltura

In [32]: *#SELECCION DE CARACTERISTICAS ---> Matriz de confusion*

*#Nuestro objetivo aplicando la matriz de correlacion de las variables, es tratar de encontrar una idea de que variables tienen una mayor influencia lineal con la variable objetivo*

```
import seaborn as sns
import matplotlib.pyplot as plt
```

```
plt.figure(figsize=(16, 6))
heatmap = sns.heatmap(datosEpd.corr(),
                        vmin=-1, vmax=1, annot=True, cmap='BrBG') # method='spearmanr'
heatmap.set_title('Correlation Heatmap', fontdict={'fontsize':18}, pad=12);
```



In [33]: *#OBSERVACIONES*

*# En la matriz de confusion podemos apreciar que las variables "LADO=X" son totalmente perfectas, ya que no nos proporciona ningún tipo de información (y hacemos más compacto el modelo)*

*#Por otro lado, parece ser que la variable predictora que más influye es si el pasajero es humano o no, mientras que lo que menos influye es si proviene de Marte o no. Aunque incluso si es humano, ya que podría existir una más compleja y NO lineal.*

*#A partir de esto, podemos declinarnos respecto a la sospecha inicial del visualizador de la matriz de correlación, ya que la teoría genética dista más y parece ser que no interviene demasiado.*

```
datosEpd = datosEpd.drop(columns = 'LADO= S')
datosEpd
```

Out[33]:

	HomePlanet=Tierra	HomePlanet=Europa	HomePlanet=Mars	CryoSleep=False	Age	VIP=False
0	0.0	1.0	0.0	1.0	0.333333	
1	1.0	0.0	0.0	1.0	0.333333	
2	0.0	1.0	0.0	1.0	0.666667	
3	0.0	1.0	0.0	1.0	0.333333	
4	1.0	0.0	0.0	1.0	0.000000	
...	...	...	...	...	...	
8688	0.0	1.0	0.0	1.0	0.666667	
8689	1.0	0.0	0.0	0.0	0.000000	
8690	1.0	0.0	0.0	1.0	0.333333	
8691	0.0	1.0	0.0	1.0	0.333333	
8692	0.0	1.0	0.0	1.0	0.666667	

8693 rows × 9 columns

In [34]: *#METODO DE ENVOLTURA*In [35]: *#Lo que necesitamos para hacerlo*

```

X_datosEpd= datosEpd.drop(columns='Transported=False')
X_datosEnp=X_datosEpd.to_numpy()
Y_datosEpd= datosEpd[['Transported=False']]
Y_datosEnp=Y_datosEpd.to_numpy()

from sklearn.model_selection import StratifiedKFold
from sklearn.model_selection import cross_val_score
from sklearn.tree import DecisionTreeClassifier

strat_cv = StratifiedKFold(5, shuffle=True, random_state=2345)

dt = DecisionTreeClassifier(random_state=2345)

cross_val_score(dt, X_datosEnp, Y_datosEnp, cv=strat_cv, scoring='balanced_accuracy')

```

Out[35]: array([0.72346717, 0.7330156 , 0.71822701, 0.72431584, 0.73115709])

In [36]: *#!pip install mlxtend*

```

from mlxtend.feature_selection import SequentialFeatureSelector as SFS

dt = DecisionTreeClassifier(random_state=2354)

sbs = SFS(dt, k_features=1, forward=False, floating=False,
          scoring='balanced_accuracy', cv=strat_cv) #verbose=2

sbs = sbs.fit(X_datosEpd, Y_datosEpd)

```

In [37]: `sbs.subsets_`

```

Out[37]: {8: {'feature_idx': (0, 1, 2, 3, 4, 5, 6, 7),
  'cv_scores': array([0.72346717, 0.7330156 , 0.71822701, 0.72431584, 0.7311570
9]),
  'avg_score': 0.7260365437395454,
  'feature_names': ('HomePlanet=Tierra',
    'HomePlanet=Europa',
    'HomePlanet= Mars',
    'CryoSleep=False',
    'Age',
    'VIP=False',
    'LADO= P',
    'CUBIERTA/PLANTA')},
  7: {'feature_idx': (0, 1, 2, 3, 4, 6, 7),
  'cv_scores': array([0.72463452, 0.73419155, 0.7205703 , 0.72380003, 0.7317285
2]),
  'avg_score': 0.726984984190981,
  'feature_names': ('HomePlanet=Tierra',
    'HomePlanet=Europa',
    'HomePlanet= Mars',
    'CryoSleep=False',
    'Age',
    'LADO= P',
    'CUBIERTA/PLANTA')},
  6: {'feature_idx': (0, 1, 2, 3, 4, 7),
  'cv_scores': array([0.72374231, 0.73755271, 0.72228792, 0.72076875, 0.7355623
2]),
  'avg_score': 0.7279828022969375,
  'feature_names': ('HomePlanet=Tierra',
    'HomePlanet=Europa',
    'HomePlanet= Mars',
    'CryoSleep=False',
    'Age',
    'CUBIERTA/PLANTA')},
  5: {'feature_idx': (0, 1, 3, 4, 7),
  'cv_scores': array([0.72374231, 0.73755271, 0.72228792, 0.72076875, 0.7355623
2]),
  'avg_score': 0.7279828022969375,
  'feature_names': ('HomePlanet=Tierra',
    'HomePlanet=Europa',
    'CryoSleep=False',
    'Age',
    'CUBIERTA/PLANTA')},
  4: {'feature_idx': (0, 3, 4, 7),
  'cv_scores': array([0.72368212, 0.7334713 , 0.72279851, 0.72070783 , 0.7314828
7]),
  'avg_score': 0.727702619164779,
  'feature_names': ('HomePlanet=Tierra',
    'CryoSleep=False',
    'Age',
    'CUBIERTA/PLANTA')},
  3: {'feature_idx': (0, 3, 4),
  'cv_scores': array([0.71728321, 0.72996926, 0.71981566, 0.72761794, 0.7216017
2]),
  'avg_score': 0.72325755873676,
  'feature_names': ('HomePlanet=Tierra', 'CryoSleep=False', 'Age')},
  2: {'feature_idx': (0, 3),
  'cv_scores': array([0.71812053, 0.72741631, 0.71258472, 0.72551498, 0.7132766
1]),
  'avg_score': 0.7193826296562531,
  'feature_names': ('HomePlanet=Tierra', 'CryoSleep=False')},
  1: {'feature_idx': (3,),
  'cv_scores': array([0.71812053, 0.72741631, 0.71258472, 0.72551498, 0.7132766
1]),

```

```
'avg_score': 0.7193826296562531,  
'feature_names': ('CryoSleep=False',)}}}
```

In [38]: *#Observacion*

```
# # A través de Los rendimientos de Los árboles de decision (parecido a Lo que habi  
# mejor rendimiento Lo consigue sin Las variables predictoras VIP y LADO  
  
# Estas dos variables en La matriz de correlación también tienen una muy baja puntu  
# con Las que son más bajas como por ejemplo MARS, esto parece significar que MARS  
# La variable respuesta, ya que de alguna forma si La quitamos no mejora el rendim  
# evidenetmente si tuvieramos 800000 pasajeros en vez de 8000 este tipo de afirmaci  
  
# Aunque hemos decidio no quitarlas para seguir confirmando nuestras sospechas aplic  
# del siguiente árbol que usaremos (knn)
```

In [39]: **from** sklearn.neighbors **import** KNeighborsClassifier

```
knn_Viaje = KNeighborsClassifier(n_neighbors=5, metric='euclidean')  
  
sbs2 = SFS(knn_Viaje, k_features=1, forward=False, floating=False,  
           scoring='balanced_accuracy', cv=strat_cv) #verbose=2  
  
sbs2 = sbs2.fit(X_datosEpd, Y_datosEpd)  
sbs2.subsets_
```



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```
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().  
    return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().  
    return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().  
    return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().  
    return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().  
    return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().  
    return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().  
    return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().  
    return self._fit(X, y)
```

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```
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nighbors\_classification.py:19  
8: DataConversionWarning: A column-vector y was passed when a 1d array was expected.  
Please change the shape of y to (n_samples,), for example using ravel().  
return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:19  
8: DataConversionWarning: A column-vector y was passed when a 1d array was expected.  
Please change the shape of y to (n_samples,), for example using ravel().  
return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:19  
8: DataConversionWarning: A column-vector y was passed when a 1d array was expected.  
Please change the shape of y to (n_samples,), for example using ravel().  
return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:19  
8: DataConversionWarning: A column-vector y was passed when a 1d array was expected.  
Please change the shape of y to (n_samples,), for example using ravel().  
return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:19  
8: DataConversionWarning: A column-vector y was passed when a 1d array was expected.  
Please change the shape of y to (n_samples,), for example using ravel().  
return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:19  
8: DataConversionWarning: A column-vector y was passed when a 1d array was expected.  
Please change the shape of y to (n_samples,), for example using ravel().  
return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:19  
8: DataConversionWarning: A column-vector y was passed when a 1d array was expected.  
Please change the shape of y to (n_samples,), for example using ravel().  
return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:19  
8: DataConversionWarning: A column-vector y was passed when a 1d array was expected.  
Please change the shape of y to (n_samples,), for example using ravel().  
return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:19  
8: DataConversionWarning: A column-vector y was passed when a 1d array was expected.  
Please change the shape of y to (n_samples,), for example using ravel().  
return self._fit(X, y)
```

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```
C:\Users\farme\anaconda3\lib\site-packages\sklearn\neighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().
    return self._fit(X, y)
C:\Users\farme\anaconda3\lib\site-packages\sklearn\neighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().
    return self._fit(X, y)
C:\Users\farme\anaconda3\lib\site-packages\sklearn\neighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().
    return self._fit(X, y)
C:\Users\farme\anaconda3\lib\site-packages\sklearn\neighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().
    return self._fit(X, y)
```

```

Out[39]: {8: {'feature_idx': (0, 1, 2, 3, 4, 5, 6, 7),
  'cv_scores': array([0.65166444, 0.68606909, 0.67452989, 0.65410892, 0.6899341
2]),
  'avg_score': 0.6712612922805274,
  'feature_names': ('HomePlanet=Tierra',
    'HomePlanet=Europa',
    'HomePlanet= Mars',
    'CryoSleep=False',
    'Age',
    'VIP=False',
    'LADO= P',
    'CUBIERTA/PLANTA')},
  7: {'feature_idx': (0, 1, 2, 3, 4, 6, 7),
  'cv_scores': array([0.65165585, 0.68376879, 0.68741369, 0.65817249, 0.6895374
9]),
  'avg_score': 0.674109661453432,
  'feature_names': ('HomePlanet=Tierra',
    'HomePlanet=Europa',
    'HomePlanet= Mars',
    'CryoSleep=False',
    'Age',
    'LADO= P',
    'CUBIERTA/PLANTA')},
  6: {'feature_idx': (1, 2, 3, 4, 6, 7),
  'cv_scores': array([0.66154291, 0.6994238 , 0.68664516, 0.66371991, 0.6812991
2]),
  'avg_score': 0.6785261806876753,
  'feature_names': ('HomePlanet=Europa',
    'HomePlanet= Mars',
    'CryoSleep=False',
    'Age',
    'LADO= P',
    'CUBIERTA/PLANTA')},
  5: {'feature_idx': (1, 2, 3, 6, 7),
  'cv_scores': array([0.64501619, 0.66240932, 0.70232266, 0.68691806, 0.6821400
4]),
  'avg_score': 0.6757612547137937,
  'feature_names': ('HomePlanet=Europa',
    'HomePlanet= Mars',
    'CryoSleep=False',
    'LADO= P',
    'CUBIERTA/PLANTA')},
  4: {'feature_idx': (2, 3, 6, 7),
  'cv_scores': array([0.60639058, 0.64257832, 0.69952036, 0.66768019, 0.6506883
]),
  'avg_score': 0.6533715487547422,
  'feature_names': ('HomePlanet= Mars',
    'CryoSleep=False',
    'LADO= P',
    'CUBIERTA/PLANTA')},
  3: {'feature_idx': (2, 3, 7),
  'cv_scores': array([0.60857381, 0.69176495, 0.60099896, 0.61940142, 0.6091786
1]),
  'avg_score': 0.6259835512128311,
  'feature_names': ('HomePlanet= Mars', 'CryoSleep=False', 'CUBIERTA/PLANTA')},
  2: {'feature_idx': (2, 3),
  'cv_scores': array([0.71812053, 0.67873498, 0.56538001, 0.72551498, 0.6560053
]),
  'avg_score': 0.6687511579548883,
  'feature_names': ('HomePlanet= Mars', 'CryoSleep=False')},
  1: {'feature_idx': (3,),
  'cv_scores': array([0.71812053, 0.5 , 0.5 , 0.72551498, 0.7132766
1]),

```

```
'avg_score': 0.6313824233037713,
'feature_names': ('CryoSleep=False',),}}
```

```
In [40]: #OBSERVACION

# El mejor rendimiento obtenido se encuentre en la sexta iteración, que nos indica
# Coinciden en que quitando VIP mejora el rendimiento, mientras que distan en la o

#Por Lo que hemos decidido quitar la variable VIP de nuestro conjunto de dato

datosEpd = datosEpd.drop(columns = 'VIP=False')
datosEpd
```

```
Out[40]:
```

	HomePlanet=Tierra	HomePlanet=Europa	HomePlanet=Mars	CryoSleep=False	Age	LADO=p
0	0.0	1.0	0.0	1.0	0.333333	1.0
1	1.0	0.0	0.0	1.0	0.333333	0.0
2	0.0	1.0	0.0	1.0	0.666667	0.0
3	0.0	1.0	0.0	1.0	0.333333	0.0
4	1.0	0.0	0.0	1.0	0.000000	0.0
...	...	...	...	...	...	...
8688	0.0	1.0	0.0	1.0	0.666667	1.0
8689	1.0	0.0	0.0	0.0	0.000000	0.0
8690	1.0	0.0	0.0	1.0	0.333333	0.0
8691	0.0	1.0	0.0	1.0	0.333333	0.0
8692	0.0	1.0	0.0	1.0	0.666667	0.0

8693 rows × 8 columns

# ENTRENAMIENTO DE MODELOS//OPTIMIZACION DE HIPERPARÁMETROS

## --> APRENDIZAJE SUPERVISADO

### 0) Separacion de datos

### 1) ARBOLES DE DECISIÓN

#### 1.1) Visualización gráfica del árbol

### 2) KNN (vecino más cercano)

### 3) PERCEPTRON MULTICAPA

## 4) RESUMEN FINAL

### --> APRENDIZAJE NO SUPERVISADO

#### KMEANS

```
In [41]: from sklearn.model_selection import train_test_split, cross_val_score, GridSearchCV
from sklearn.dummy import DummyClassifier
from sklearn.neighbors import KNeighborsClassifier
from sklearn.metrics import accuracy_score, balanced_accuracy_score, confusion_matrix
```

```
In [42]: #SEPARACION DE VARIABLES:
# como vamos a calcular los rendimientos (precisiones) de los clasificadores mediante
# Solo separaremos nuestro conjunto de datos en dos (uno para las variables predictoras y otro para las variables a predecir)
# eso no aplico train_test_split
# lo voy a separar a mano y despues lo voy a pasar a np

X_datosEpd = datosEpd.drop(columns='Transported=False')

X_datosEnp = X_datosEpd.to_numpy()

Y_datosEpd = datosEpd[['Transported=False']]

Y_datosEnp = Y_datosEpd.to_numpy()
```

#### ARBOLES DE DECISION

```
In [43]: # Vamos a entrenar el modelo mediante validación cruzada directamente, por eso no aplico
# la separación de datos entre entrenamiento y prueba
```

```
In [44]: # Creo una instancia de objeto de árbol de decisión con el que trabajaré.
# Primero aplicaré dos ejemplos: uno con los valores por defecto, y otro en el que voy a probar
# de dos parámetros del clasificador (el mínimo de hojas por nodo y la máxima profundidad)
# Posteriormente, a través de gridsearch optimizaré los valores de estos para mejorar el rendimiento
# Obteniendo el más óptimo posible

AD_dt = DecisionTreeClassifier(random_state=99)
```

```
In [45]: AD_acc = cross_val_score(AD_dt, X_datosEnp, Y_datosEnp, cv=5)
AD_acc
```

```
Out[45]: array([0.71075331, 0.73030477, 0.72742956, 0.72151899, 0.72957422])
```

```
In [46]: # El rendimiento va a ser la media de los 5 conjuntos de entrenamiento
```

```
In [47]: AD_acc.mean()
```

```
Out[47]: 0.7239161694319248
```

```
In [48]: # Arbol de decisión con número mínimo de muestras requeridas para dividir un nodo
# número mínimo de objetos igual a 2
```

```
In [49]: AD_dt = DecisionTreeClassifier(random_state=99, max_depth = 4, min_samples_leaf = 2)
```



```
In [50]: AD_acc = cross_val_score(AD_dt, X_datosEnp, Y_datosEnp, cv=5)
AD_acc
```

```
Out[50]: array([0.71535365, 0.7239793 , 0.71650374, 0.72497123, 0.72497123])
```

```
In [51]: AD_acc.mean()
```

```
Out[51]: 0.7211558300704544
```

```
In [52]: # Optimización de hiperparámetros para algoritmo de árboles de decisión

# Optimizamos Los mismos parámetros que probamos anteriormente al azar, y obtenemos
# La validación cruzada con precisión balanceada (ya que nos parece más justa que v
```

```
In [53]: parameters = {'criterion':['gini', 'entropy'], 'max_depth':range(1,10), 'min_sample

gcv_AD = GridSearchCV(AD_dt, parameters, cv=5, scoring='balanced_accuracy')
```

Se ha conseguido un rendimiento mejor

```
In [54]: gcv_AD.fit(X_datosEpd, Y_datosEpd)
```

```
Out[54]: GridSearchCV(cv=5,
                      estimator=DecisionTreeClassifier(max_depth=4, min_samples_leaf=2,
                                                         random_state=99),
                      param_grid={'criterion': ['gini', 'entropy'],
                                   'max_depth': range(1, 10),
                                   'min_samples_leaf': [1, 5, 10, 20, 30]},
                      scoring='balanced_accuracy')
```

```
In [55]: gcv_AD.best_params_
```

```
Out[55]: {'criterion': 'entropy', 'max_depth': 7, 'min_samples_leaf': 1}
```

```
In [56]: gcv_AD.best_score_
```

```
Out[56]: 0.7282601530334193
```

```
In [57]: # Visualización del árbol de decision obtenido anteriormente.

from sklearn.tree import export_graphviz
export_graphviz(gcv_AD.best_estimator_, out_file="tree.dot", class_names=["True",
                                feature_names=['HomePlanet=Tierra', 'HomePlanet=Europa', 'HomePlan
                                'Age', 'LADO= P', 'CUBIERTA/PLANTA'], impurity=False
```

```
In [58]: import graphviz

with open("tree.dot") as f:
    dot_graph = f.read()
display(graphviz.Source(dot_graph))
```



```
In [59]: # RESUMEN de rendimientos

# Como curiosidad hemos usado La ayuda de chatgpt para hacer esta tabla

from tabulate import tabulate
```



```
# Crea una lista de listas con los datos de la tabla
datos = [
    ["Por defecto", "72,391%"],
    ["MinHojas=2 y MaxProfundidad=4", "72,115%"],
    ["MinHojas=1 y MaxProfundidad=7", "72,826%"]
]

# Imprime la tabla usando el formato "simple"
print(tabulate(datos, headers=["Parámetros", "Rendimiento"], tablefmt="simple"))
```

Parámetros	Rendimiento
Por defecto	72,391%
MinHojas=2 y MaxProfundidad=4	72,115%
MinHojas=1 y MaxProfundidad=7	72,826%

## KNN

```
In [60]: #Podemos aplicar satisfactoriamente este algoritmo porque en el preprocesado de los datos se normalizaron los valores.

#Creamos una instancia del clasificador usando distancia manhattan y con 5 vecinos

knn = KNeighborsClassifier(n_neighbors=5, metric='manhattan')
```

```
In [61]: CV_knn = cross_val_score(knn, X_datosEnp, Y_datosEnp, cv=5, scoring='balanced_accuracy')
CV_knn
```

```
C:\Users\farme\anaconda3\lib\site-packages\sklearn\neighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().
return self._fit(X, y)
C:\Users\farme\anaconda3\lib\site-packages\sklearn\neighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().
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return self._fit(X, y)
```

```
Out[61]: array([0.69180132, 0.66598875, 0.68777282, 0.651561, 0.67524383])
```

```
In [62]: CV_knn.mean()
```

```
Out[62]: 0.6744735452339
```

```
In [63]: # Optimización de hiperparámetros para algoritmo de Knn

# Optimizamos la forma de medir las distancias entre los individuos y el número de vecinos para observar sus variables respuesta)

#Usamos k impares ya que no existe el caso de empate, mientras que si cogiesemos un k par, tendríamos el caso de empate
```

```
In [64]: # COMENTARIO DESTACABLE
# al principio optimizamos entre estos valores de k 'n_neighbors':[1, 3, 5, 7, 9, 11, 13, 15, 17, 19, 21, 23, 25, 27, 29, 31, 33, 35]
#pero observamos al aumentarlos que mejoraba el rendimiento por lo que para no tardar
# hemos decidido quitar los primeros valores k hasta encontrar el valor máximo de k

parameters_knn = {'n_neighbors':[17, 19, 21, 23, 25, 27, 29, 31, 33, 35], 'metric'

gcv_knn = GridSearchCV(knn, parameters_knn, cv=5, scoring='balanced_accuracy')
```

```
In [65]: gcv_knn.fit(X_datosEnp, Y_datosEnp)
```

```
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().  
    return self._fit(X, y)  
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:198: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().  
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    return self._fit(X, y)
```

```
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    return self._fit(X, y)
```

localhost:8888/nbconvert/html/Desktop/EntregaEvaluacion3/EntregaEvaluacion3/entrega3.ipynb?download=false



```
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nighbors\_classification.py:19
8: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().
    return self._fit(X, y)
C:\Users\farme\anaconda3\lib\site-packages\sklearn\nneighbors\_classification.py:19
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8: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().
    return self._fit(X, y)
```

localhost:8888/nbconvert/html/Desktop/EntregaEvaluacion3/EntregaEvaluacion3/entrega3.ipynb?download=false

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```
C:\Users\farme\anaconda3\lib\site-packages\sklearn\neighbors\_classification.py:19
8: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().
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8: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for example using ravel().
    return self._fit(X, y)
```

```
Out[65]: GridSearchCV(cv=5, estimator=KNeighborsClassifier(metric='manhattan'),
                    param_grid={'metric': ['euclidean', 'manhattan'],
                                'n_neighbors': [17, 19, 21, 23, 25, 27, 29, 31, 33,
                                                35]},
                    scoring='balanced_accuracy')
```

```
In [66]: gcv_knn.best_params_
```

```
Out[66]: {'metric': 'euclidean', 'n_neighbors': 33}
```

```
In [67]: gcv_knn.best_score_
```

```
Out[67]: 0.7236462832743378
```

```
In [68]: #RESUMEN de rendimientos obtenidos
```

```
datos = [
    ["Manhattan y k=5", "67,447%"],
    ["Euclidean y k=33", "72,364%"]
]

# Imprime la tabla usando el formato "simple"
print(tabulate(datos, headers=["Parámetros", "Rendimiento"], tablefmt="simple"))
```

Parámetros	Rendimiento
Manhattan y k=5	67,447%
Euclidean y k=33	72,364%

## Perceptrón multicapa

```
In [69]: from sklearn.neural_network import MLPClassifier
```

```
# Creamos una instancia de red neuronal formada por una sola capa intermedia comp
# computación de 200 épocas
# Que vamos a entrenar y validar de nuevo con la técnica de validación cruzada (par

perceptronMC = MLPClassifier(random_state=99, hidden_layer_sizes=(100,), max_iter=
#mlp_perceptron.fit(X_datosEnp, Y_datosEnp)
```

```
In [70]: perceptronCV=cross_val_score(perceptronMC, X_datosEnp, Y_datosEnp, cv=5, scoring='l
```

```

C:\Users\farme\anaconda3\lib\site-packages\sklearn\normalization\_multilayer_perceptron.py:1109: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples, ), for example using ravel().
  y = column_or_1d(y, warn=True)
C:\Users\farme\anaconda3\lib\site-packages\sklearn\normalization\_multilayer_perceptron.py:1109: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples, ), for example using ravel().
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  y = column_or_1d(y, warn=True)

```

```

In [71]: #RENDIMIENTO
         perceptronCV.mean()

```

```

Out[71]: 0.7245424852548681

```

```

In [72]: # Optimización de hiperparámetros

```

```

In [73]: # Optimizamos la topologíaRed, la función de activación, y el algoritmo de optimización
         # Probamos dos topologías de red, una de una capa con 100 neuronas (intermedia) y otra de dos capas
         # por jugar un poco y ver como varían los rendimientos

         parametersMC = {'hidden_layer_sizes':[(100,), (50,50)], 'activation':['identity', 'tanh'],
                        'solver':['lbfgs', 'sgd', 'adam']}

         gcvMC = GridSearchCV(perceptronMC, parametersMC, cv=5, scoring='balanced_accuracy')

```

```

In [74]: gcvMC.fit(X_datosEnp, Y_datosEnp)

```

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```
y = column_or_1d(y, warn=True)
C:\Users\farme\anaconda3\lib\site-packages\sklearn\normalization\_multilayer_perceptron.py:1109: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples, ), for example using ravel().
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```

```

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C:\Users\farme\anaconda3\lib\site-packages\sklearn\neural_network\_multilayer_perceptron.py:1109: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples, ), for example using ravel().
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C:\Users\farme\anaconda3\lib\site-packages\sklearn\neural_network\_multilayer_perceptron.py:549: ConvergenceWarning: 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
    self.n_iter_ = _check_optimize_result("lbfgs", opt_res, self.max_iter)
C:\Users\farme\anaconda3\lib\site-packages\sklearn\neural_network\_multilayer_perceptron.py:1109: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples, ), for example using ravel().
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```

```
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```

```
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```

```
y = column_or_1d(y, warn=True)
```

```
C:\Users\farme\anaconda3\lib\site-packages\sklearn\neural_network\_multilayer_perceptron.py:549: ConvergenceWarning: lbfgs failed to converge (status=1):
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C:\Users\farme\anaconda3\lib\site-packages\sklearn\normalization\_multilayer_perceptron.py:692: ConvergenceWarning: Stochastic Optimizer: Maximum iterations (200) reached and the optimization hasn't converged yet.
    warnings.warn(
C:\Users\farme\anaconda3\lib\site-packages\sklearn\normalization\_multilayer_perceptron.py:1109: DataConversionWarning: A column-vector y was passed when a 1d array

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```

```

Out[74]: GridSearchCV(cv=5, estimator=MLPClassifier(random_state=99),
                    param_grid={'activation': ['identity', 'logistic', 'tanh', 'relu'],
                                'hidden_layer_sizes': [(100,), (50, 50)],
                                'solver': ['lbfgs', 'sgd', 'adam']},
                    scoring='balanced_accuracy')

```

```

In [75]: #El mejor rendimiento se consigue con estos parámetros, y en efecto con la segunda
gcvMC.best_params_

```

```

Out[75]: {'activation': 'tanh', 'hidden_layer_sizes': (50, 50), 'solver': 'lbfgs'}

```

```

In [76]: #RENDIMIENTO
gcvMC.best_score_

```

```

Out[76]: 0.7272561779136327

```

```

In [77]: #Por seguir jugando con las topologías, comparamos la de mejor rendimiento de antes
# y 25 por capa. Y quitamos la optimización de los algoritmos de entrenamiento para
# (ya que anteriormente fue muy largo)

parametersMC2 = {'hidden_layer_sizes':[(50,50), (25,25,25)], 'activation':['identity',
gcvMC2 = GridSearchCV(perceptronMC, parametersMC, cv=5, scoring='balanced_accuracy')

```

```

In [78]: gcvMC2.fit(X_datosEnp, Y_datosEnp)

```



```
C:\Users\farme\anaconda3\lib\site-packages\sklearn\normalization\_multilayer_perceptron.py:1109: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples, ), for example using ravel().
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C:\Users\farme\anaconda3\lib\site-packages\sklearn\neural\_network\\_multilayer\_perceptron.py:549: ConvergenceWarning: 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>

```
self.n_iter_ = _check_optimize_result("lbfgs", opt_res, self.max_iter)
```

C:\Users\farme\anaconda3\lib\site-packages\sklearn\neural\_network\\_multilayer\_perceptron.py:1109: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n\_samples, ), for example using ravel().

```
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```

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```

avel().
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STOP: TOTAL NO. of ITERATIONS REACHED LIMIT.

```



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```
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self.n_iter_ = _check_optimize_result("lbfgs", opt_res, self.max_iter)
C:\Users\farme\anaconda3\lib\site-packages\sklearn\normalization\_multilayer_perceptron.py:1109: DataConversionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples, ), for example using ravel().
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y = column_or_1d(y, warn=True)
C:\Users\farme\anaconda3\lib\site-packages\sklearn\normalization\_multilayer_perceptron.py:692: ConvergenceWarning: Stochastic Optimizer: Maximum iterations (200) reached and the optimization hasn't converged yet.
warnings.warn(
C:\Users\farme\anaconda3\lib\site-packages\sklearn\normalization\_multilayer_perceptron.py:1109: DataConversionWarning: A column-vector y was passed when a 1d array
```

```

y was expected. Please change the shape of y to (n_samples, ), for example using r
avel().
    y = column_or_1d(y, warn=True)
C:\Users\farme\anaconda3\lib\site-packages\sklearn\neural_network\_multilayer_perc
eptron.py:1109: DataConversionWarning: A column-vector y was passed when a 1d arra
y was expected. Please change the shape of y to (n_samples, ), for example using r
avel().
    y = column_or_1d(y, warn=True)
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y was expected. Please change the shape of y to (n_samples, ), for example using r
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    y = column_or_1d(y, warn=True)
C:\Users\farme\anaconda3\lib\site-packages\sklearn\neural_network\_multilayer_perc
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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
    self.n_iter_ = _check_optimize_result("lbfgs", opt_res, self.max_iter)

```

```

Out[78]: GridSearchCV(cv=5, estimator=MLPClassifier(random_state=99),
                    param_grid={'activation': ['identity', 'logistic', 'tanh', 'relu'],
                                'hidden_layer_sizes': [(100,), (50, 50)],
                                'solver': ['lbfgs', 'sgd', 'adam']},
                    scoring='balanced_accuracy')

```

```

In [79]: # Efectivamente encontramos mejor rendimiento en la tercera topología probada

gcvMC2.best_params_

```

```

Out[79]: {'activation': 'tanh', 'hidden_layer_sizes': (50, 50), 'solver': 'lbfgs'}

```

```

In [80]: gcvMC2.best_score_

```

```

Out[80]: 0.7272561779136327

```

```

In [113... #RESUMEN de rendimientos obtenidos

datos = [
    ["fActivacion=relu, TopologíaRed=(100,), N_epocas=200, A_Entrenamiento=lbfgs",
    ["fActivacion=tanh, TopologíaRed=(50, 50), N_epocas= 200 , A_Entrenamiento=lbfgs",
    ["fActivacion=relu, TopologíaRed=(25, 25, 25), N_epocas= 200, A_Entrenamiento=lbfgs",
    ]

# Imprime la tabla usando el formato "simple"
print(tabulate(datos, headers=["Parámetros", "Rendimiento"], tablefmt="simple"))

```



Parámetros  
Rendimiento

```
-----
-----
fActivacion=relu, TopologíaRed=(100,), N_epocas=200, A_Entrenamiento=lbfgs
72,454%
fActivacion=tanh, TopologíaRed=(50, 50), N_epocas= 200 , A_Entrenamiento=lbfgs
72,725%
fActivacion=relu, TopologíaRed=(25, 25, 25), N_epocas= 200, A_Entrenamiento=lbfgs
72,884%
```

## Resumen final

```
In [119... # Resumen de todos Los MEJORES rendimientos obtenidos de Los clasificadores

datos = [
    ["Arboles de Decisión" , "MinHojas=1 y MaxProfundidad=7" , '72,826%'],
    ["KNN", "Euclidean y k=33", "72,364%"],
    ["Perceptrón Multicapa (25,25,25)", "fActivacion=relu, N_epocas= 200, A_Entrenamiento=lbfgs", "72,884%"]
]

# Imprime la tabla usando el formato "simple"
print(tabulate(datos, headers=["Clasificador", "Parámetros", "Rendimiento"], tablefmt="simple"))
```

Clasificador	Parámetros	Rendimiento
Arboles de Decisión	MinHojas=1 y MaxProfundidad=7	72,826%
KNN	Euclidean y k=33	72,364%
Perceptrón Multicapa (25,25,25)	fActivacion=relu, N_epocas= 200, A_Entrenamiento=lbfgs	72,884%

## APRENDIZAJE NO SUPERVISADO

### K MEANS

#### 1) Historia

#### 2) Preprocesado de datos

#### 3) Aplicación del clasificador

```
In [130... # HISTORIA

# La empresa organizadora del viaje espacial, pidió antes de saber el triste destino
# que analizaríamos a los tripulantes de la nave para poder decidir que tipo de oferta
# a la llegada a su destino final.
# Para ello, decidimos aplicar kmeans, un algoritmo de aprendizaje no supervisado,
# distintos grupos según sus consumo en la nave y según su edad.
# Personificando posteriormente a estos grupos en un individuo "medio" con el que se
# ofrecerá para hacer un mejor negocio. (como por ejemplo puede ser los hoteles para
# por que tiendas pasar en las rutas turísticas...)
```

```
In [115... datosKMeans = df[['Age', 'VIP', 'RoomService', 'FoodCourt', 'ShoppingMall', 'Spa',
```

```
In [116... datosKMeans
```

Out[116]:

	Age	VIP	RoomService	FoodCourt	ShoppingMall	Spa	VRDeck
0	39.0	False	0.0	0.0	0.0	0.0	0.0
1	24.0	False	109.0	9.0	25.0	549.0	44.0
2	58.0	True	43.0	3576.0	0.0	6715.0	49.0
3	33.0	False	0.0	1283.0	371.0	3329.0	193.0
4	16.0	False	303.0	70.0	151.0	565.0	2.0
...	...	...	...	...	...	...	...
8688	41.0	True	0.0	6819.0	0.0	1643.0	74.0
8689	18.0	False	0.0	0.0	0.0	0.0	0.0
8690	26.0	False	0.0	0.0	1872.0	1.0	0.0
8691	32.0	False	0.0	1049.0	0.0	353.0	3235.0
8692	44.0	False	126.0	4688.0	0.0	0.0	12.0

8693 rows × 7 columns

In [120...

```
#Realizamos LA IMPUTACION a través de transformaciones sobre las columnas
from sklearn.pipeline import Pipeline

edad = Pipeline([("media", SimpleImputer(strategy='mean')),
                 ("A", KBinsDiscretizer(4, strategy='uniform', encode='ordinal'))
VIP = Pipeline([("modaV", SimpleImputer(strategy='most_frequent')),
                 ("VIP", OneHotEncoder())])
PLDineroGastado = Pipeline([("media2", SimpleImputer(strategy='mean'))])

ct = ColumnTransformer([
    ("media", edad, ['Age']),
    ("modaV", VIP, ['VIP']),
    ("me1", PLDineroGastado, ['RoomService']),
    ("me2", PLDineroGastado, ['FoodCourt']),
    ("me3", PLDineroGastado, ['ShoppingMall']),
    ("me4", PLDineroGastado, ['Spa']),
    ("me5", PLDineroGastado, ['VRDeck'])
]) #para la ultima variable lo hacemos así, pero podriamos hacerlo igual que en

datosKMeans2 = ct.fit_transform(datosKMeans)
```

In [121...

datosKMeans2

Out[121]:

```
array([[1.000e+00, 1.000e+00, 0.000e+00, ..., 0.000e+00, 0.000e+00,
        0.000e+00],
       [1.000e+00, 1.000e+00, 0.000e+00, ..., 2.500e+01, 5.490e+02,
        4.400e+01],
       [2.000e+00, 0.000e+00, 1.000e+00, ..., 0.000e+00, 6.715e+03,
        4.900e+01],
       ...,
       [1.000e+00, 1.000e+00, 0.000e+00, ..., 1.872e+03, 1.000e+00,
        0.000e+00],
       [1.000e+00, 1.000e+00, 0.000e+00, ..., 0.000e+00, 3.530e+02,
        3.235e+03],
       [2.000e+00, 1.000e+00, 0.000e+00, ..., 0.000e+00, 0.000e+00,
        1.200e+01]])
```

In [122...

```
scaler = MinMaxScaler(feature_range=(0, 1))
scaler.fit(datosKMeans2)
```

```
datosKMeans2_escalado = scaler.transform(datosKMeans2)
print(datosKMeans2_escalado[:,6,])
```

```
[[3.33333333e-01 1.00000000e+00 0.00000000e+00 0.00000000e+00
 0.00000000e+00 0.00000000e+00 0.00000000e+00 0.00000000e+00]
 [3.33333333e-01 1.00000000e+00 0.00000000e+00 7.60801284e-03
 3.01881729e-04 1.06419207e-03 2.45001785e-02 1.82322960e-03]
 [6.66666667e-01 0.00000000e+00 1.00000000e+00 3.00132617e-03
 1.19947674e-01 0.00000000e+00 2.99669761e-01 2.03041478e-03]
 [3.33333333e-01 1.00000000e+00 0.00000000e+00 0.00000000e+00
 4.30349177e-02 1.57926103e-02 1.48563013e-01 7.99734803e-03]
 [0.00000000e+00 1.00000000e+00 0.00000000e+00 2.11488797e-02
 2.34796901e-03 6.42772007e-03 2.52142092e-02 8.28740728e-05]
 [6.66666667e-01 1.00000000e+00 0.00000000e+00 0.00000000e+00
 1.62009861e-02 0.00000000e+00 1.29864334e-02 0.00000000e+00]]
```

```
In [126... datosKMeans2_escalado = pd.DataFrame(datosKMeans2_escalado, columns=['Age', 'VIP=FALSE', 'VIP=TRUE', 'RoomService', 'FoodCourt', 'ShoppingMall', 'Spa', 'VRDeck'])
datosKMeans2_escalado
```

Out[126]:

	Age	VIP=FALSE	VIP=TRUE	RoomService	FoodCourt	ShoppingMall	Spa	VRDeck
--	-----	-----------	----------	-------------	-----------	--------------	-----	--------

0	0.333333	1.0	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
1	0.333333	1.0	0.0	0.007608	0.000302	0.001064	0.024500	0.001822
2	0.666667	0.0	1.0	0.003001	0.119948	0.000000	0.299670	0.002031
3	0.333333	1.0	0.0	0.000000	0.043035	0.015793	0.148563	0.007995
4	0.000000	1.0	0.0	0.021149	0.002348	0.006428	0.025214	0.000008
...	...	...	...	...	...	...	...	...
8688	0.666667	0.0	1.0	0.000000	0.228726	0.000000	0.073322	0.003006
8689	0.000000	1.0	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
8690	0.333333	1.0	0.0	0.000000	0.000000	0.079687	0.000045	0.000000
8691	0.333333	1.0	0.0	0.000000	0.035186	0.000000	0.015753	0.134042
8692	0.666667	1.0	0.0	0.008795	0.157247	0.000000	0.000000	0.000495

8693 rows × 8 columns



```
In [133... datosKMeans3=datosKMeans2_escalado.drop(columns='VIP=TRUE')
datosKMeans3
```

Out[133]:

	Age	VIP=FALSE	RoomService	FoodCourt	ShoppingMall	Spa	VRDeck
<b>0</b>	0.333333	1.0	0.000000	0.000000	0.000000	0.000000	0.000000
<b>1</b>	0.333333	1.0	0.007608	0.000302	0.001064	0.024500	0.001823
<b>2</b>	0.666667	0.0	0.003001	0.119948	0.000000	0.299670	0.002030
<b>3</b>	0.333333	1.0	0.000000	0.043035	0.015793	0.148563	0.007997
<b>4</b>	0.000000	1.0	0.021149	0.002348	0.006428	0.025214	0.000083
...	...	...	...	...	...	...	...
<b>8688</b>	0.666667	0.0	0.000000	0.228726	0.000000	0.073322	0.003066
<b>8689</b>	0.000000	1.0	0.000000	0.000000	0.000000	0.000000	0.000000
<b>8690</b>	0.333333	1.0	0.000000	0.000000	0.079687	0.000045	0.000000
<b>8691</b>	0.333333	1.0	0.000000	0.035186	0.000000	0.015753	0.134049
<b>8692</b>	0.666667	1.0	0.008795	0.157247	0.000000	0.000000	0.000497

8693 rows × 7 columns

In [131]...

```
# Creo una instancia del clasificador KMedias(Aprendizaje NO supervisado) con el que voy a agrupar los datos
from sklearn.cluster import KMeans

Kmeans = KMeans(random_state=99, n_clusters=3)
#mlp_perceptron.fit(X_datosEnp, Y_datosEnp)
```

In [134]...

```
# Ajustar Los datos

Kmeans.fit(datosKMeans3)
```

Out[134]:

```
KMeans(n_clusters=3, random_state=99)
```

In [135]...

```
# Obtener Las etiquetas de Los grupos asignados

Kmeans.labels_
```

Out[135]:

```
array([0, 0, 2, ..., 0, 0, 1])
```

In [139]...

```
# Estos serían Los individuos representativos de cada grupo y en Los que se va a basar el modelo

Kmeans.cluster_centers_
```

Out[139]:

```
array([[ 2.26069652e-01,  1.00000000e+00,  1.48343399e-02,
         1.26860440e-02,  7.21033381e-03,  1.17529841e-02,
         1.11656536e-02],
       [ 7.11817168e-01,  1.00000000e+00,  1.69630085e-02,
         2.04866216e-02,  7.74521684e-03,  1.96450310e-02,
         1.39208917e-02],
       [ 4.57286432e-01, -3.33066907e-16,  3.27082998e-02,
         5.93898725e-02,  1.04660126e-02,  3.37465347e-02,
         5.03941868e-02]])
```