Práctica 8: LDA

Descripción de campos importantes: Mushrooms

```
Campo Descripción
                   class edible(e) or poisonous(p)
              cap-shape bell(b), conical(c), convex(x), flat(f), knobbed(k), sunken(s)
            cap-surface fibrous(f), grooves(g), scaly(y), smooth(s)
               cap-color brown(n), buff(b), cinnamon(c), gray(g), green(r), pink(p), purple(u), red(e), white(w), yellow(y)
                 bruises bruises(t), no bruises(f)
                   odor almond(a), anise(I), creosote(c), fishy(y), foul(f), musty(m), none(n), pungent(p), spicy(s)
         gill-attachment attached(a), descending(d), free(f), notched(n)
             gill-spacing close(c), crowded(w), distant(d)
                 gill-size broad(b), narrow(n)
                gill-color black(k), brown(n), buff(b), chocolate(h), gray(g), green(r), orange(o), pink(p), purple(u), red(e), white(w), yellow(y)
             stalk-shape enlarging(e), tapering(t)
               stalk-root bulbous(b), club(c), cup(u), equal(e), rhizomorphs(z), rooted(r), missing(?)
stalk-surface-above-ring fibrous(f), scaly(y), silky(k), smooth(s)
stalk-surface-below-ring fibrous(f), scaly(y), silky(k), smooth(s)
  stalk-color-above-ring brown(n), buff(b), cinnamon(c), gray(g), orange(o), pink(p), red(e), white(w), yellow(y)
  stalk-color-below-ring brown(n), buff(b), cinnamon(c), gray(g), orange(o), pink(p), red(e), white(w), yellow(y)
               veil-type partial(p), universal(u)
               veil-color brown(n), orange(o), white(w), yellow(y)
            ring-number \quad none(n), \, one(o), \, two(t)
               ring-type \quad cobwebby(c), \ evanescent(e), \ flaring(f), \ large(I), \ none(n), \ pendant(p), \ sheathing(s), \ zone(z)
        spore-print-color black(k), brown(n), buff(b), chocolate(h), green(r), orange(o), purple(u), white(w), yellow(y)
              population abundant(a), clustered(c), numerous(n), scattered(s), several(v), solitary(y)
                 habitat grasses(g), leaves(l), meadows(m), paths(p), urban(u), waste(w), woods(d)
```

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns

from sklearn.preprocessing import LabelEncoder
from sklearn.model_selection import train_test_split, cross_val_score
from sklearn.metrics import roc_curve, auc, confusion_matrix

%matplotlib inline
```

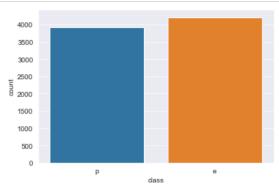
```
In [2]: hongos = pd.read_csv("mushrooms.csv")
hongos.head()
```

Out[2]:

	class	cap- shape	cap- surface	cap- color		odor	gill- attachment	gill- spacing	gill- size	gill- color	 stalk- surface- below- ring	stalk- color- above- ring	stalk- color- below- ring	veil- type	veil- color	ring- number	ring- type		pα
0	р	х	s	n	t	р	f	С	n	k	 s	w	w	р	w	0	р	k	
1	е	х	s	у	t	а	f	С	b	k	 s	w	w	р	w	0	р	n	
2	е	b	s	w	t	- 1	f	С	b	n	 s	w	w	р	w	0	р	n	
3	р	х	у	w	t	р	f	С	n	n	 s	w	w	р	w	0	р	k	
4	е	х	s	g	f	n	f	w	b	k	 s	w	w	р	w	0	е	n	

5 rows × 23 columns

```
In [3]: sns.set_style('darkgrid')
    x = hongos['class']
    ax = sns.countplot(x=x, data=hongos)
```

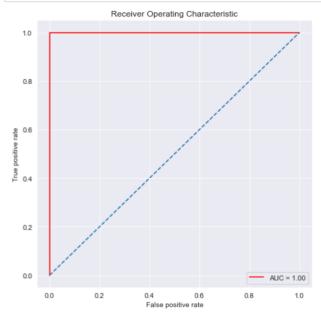


```
In [5]: hongos.isnull().sum()
```

```
Out[5]: class
                                    0
        cap-shape
        cap-surface
                                    0
        cap-color
                                    0
        bruises
                                    0
        odor
        gill-attachment
        gill-spacing
                                    0
        gill-size
                                    0
        gill-color
                                    0
        stalk-shape
        stalk-root
                                    0
        stalk-surface-above-ring
                                    0
        stalk-surface-below-ring
        stalk-color-above-ring
                                    0
        stalk-color-below-ring
        veil-type
        veil-color
                                    0
        ring-number
        ring-type
                                    0
        spore-print-color
                                    0
        population
                                    0
        habitat
                                    0
        dtype: int64
```

```
In [6]: le = LabelEncoder()
          hongos['class'] = le.fit_transform(hongos['class'])
          hongos.head()
 Out[6]:
                                                                                          stalk-
                                                                                                 stalk-
                                                                                                         stalk-
                                                                                                                                        spore-
                     сар-
                             сар-
                                   сар-
                                                            gill-
                                                                     gill-
                                                                         gill-
                                                                                gill-
                                                                                        surface-
                                                                                                 color-
                                                                                                        color-
                                                                                                               veil-
                                                                                                                     veil-
                                                                                                                             ring-
                                                                                                                                  ring-
              class
                                        bruises odor
                                                                                                                                         print-
                                                                                                                                               pc
                    shape surface
                                  color
                                                      attachment spacing
                                                                         size
                                                                              color
                                                                                         below-
                                                                                                above-
                                                                                                        below-
                                                                                                               type
                                                                                                                    color number
                                                                                                                                   type
                                                                                                                                         color
                                                                                           rina
                                                                                                   rina
                                                                                                          rina
           0
                                                                                                                                     р
                 0
                                                               f
                                                                       С
                                                                            b
                                                                                                                                     р
                                                                                                                                            n
                 0
                                                                       С
                                                                                                                                            n
                                                                       С
                                ٧
                                                                            n
                                                                                  n
                                                                                                                       w
                                                                                                                                o
                 n
                                                    n
                                                                                                                                            n
          5 rows × 23 columns
 In [7]: | codificada = pd.get_dummies(hongos)
          codificada.head(3)
 Out[7]:
                       сар-
                                сар-
                                        сар-
                                                 сар-
                                                          сар-
                                                                   сар-
                                                                            сар-
                                                                                      сар-
                                                                                                сар-
                                                                                                     ... population_s population_v population_y hal
              class
                    shape_b
                             shape_c
                                     shape_f
                                              shape_k
                                                       shape_s
                                                               shape_x
                                                                        surface_f
                                                                                 surface_g
                                                                                           surface_s
           0
                          0
                                   0
                                           0
                                                             0
                                                                                         0
                                                                                                   1 ...
                                                                                                                  1
                                                                                                                               0
                                                                                                                                            0
                 0
                          0
                                   0
                                           0
                                                    0
                                                             0
                                                                               0
                                                                                         0
                                                                                                                  0
                                                                                                                               0
                                                                                                                                           0
           1
                                                                      1
                                                                                                   1 ...
           2
                 n
                                   n
                                           Λ
                                                    n
                                                             n
                                                                     Λ
                                                                               n
                                                                                         n
                                                                                                                  n
                                                                                                                               n
                                                                                                                                            n
                                                                                                   1
          3 rows × 118 columns
 In [8]: y = hongos['class'].values.reshape(-1, 1)
          X = codificada.drop(['class'], axis=1)
          X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_state=42)
 In [9]: from sklearn.linear_model import LogisticRegression
In [10]: logistic_reg = LogisticRegression()
          logistic_reg.fit(X_train, y_train.ravel())
          y_prob = logistic_reg.predict_proba(X_test)[:,1]
          y_pred = np.where(y_prob > 0.5, 1, 0)
In [11]: log_confusion_matrix = confusion_matrix(y_test, y_pred)
          log_confusion_matrix
Out[11]: array([[843, 0],
                  [ 0, 782]], dtype=int64)
In [12]: false_positive_rate, true_positive_rate, thresholds = roc_curve(y_test, y_prob)
          roc_auc = auc(false_positive_rate, true_positive_rate)
          roc_auc
Out[12]: 1.0
```

```
In [13]: def plot_roc(roc_auc):
    plt.figure(figsize=(7,7))
    plt.title('Receiver Operating Characteristic')
    plt.plot(false_positive_rate, true_positive_rate, color='red', label='AUC = %0.2f' % roc_auc)
    plt.legend(loc='lower right')
    plt.plot([0, 1], [0, 1], linestyle='--')
    plt.axis('tight')
    plt.ylabel('True positive rate')
    plt.xlabel('False positive rate')
    plot_roc(roc_auc)
```

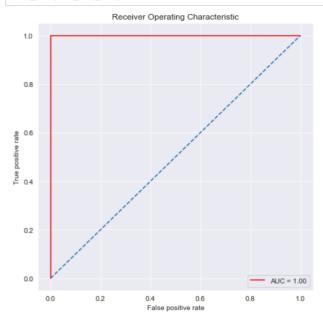


LDA

```
In [17]: false_positive_rate, true_positive_rate, thresholds = roc_curve(y_test, y_prob_lda)
         roc_auc_lda = auc(false_positive_rate, true_positive_rate)
         roc auc lda
```

Out[17]: 1.0

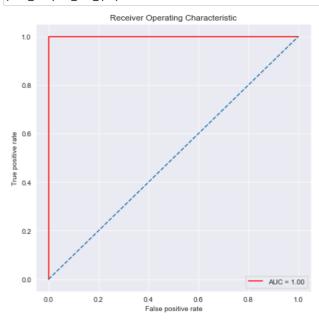
In [18]: plot_roc(roc_auc_lda)



QDA

```
In [19]: from sklearn.discriminant_analysis import QuadraticDiscriminantAnalysis
In [20]: qda = QuadraticDiscriminantAnalysis()
                                   qda.fit(X_train, y_train.ravel())
                                  y_prob_qda = qda.predict_proba(X_test)[:,1]
                                  y_pred_qda = np.where(y_prob_qda > 0.5, 1, 0)
                                   {\tt C:\ProgramData\Anaconda3\lib\site-packages\sklearn\discriminant\_analysis.py:715:}\ User {\tt Warning: Variables are collinear analysis.py:715:}\ User {\tt Warning: Variables are collinea
                                          warnings.warn("Variables are collinear")
In [21]: qda_confusion_matrix = confusion_matrix(y_test, y_pred_qda)
                                   qda_confusion_matrix
In [22]: false_positive_rate, true_positive_rate, thresholds = roc_curve(y_test, y_prob_qda)
                                   roc_auc_qda = auc(false_positive_rate, true_positive_rate)
                                   roc_auc_qda
Out[22]: 1.0
```

In [23]: plot_roc(roc_auc_qda)



In []: