# DataSet Kaggle con i Modelli

May 17, 2024

# 1 DataSet Kaggle

#### 1.1 Caricamento e Visualizzazione dei Dati dei Titoli Netflix

```
[2]: # Importa le librerie, carica il file csv nel dataframe e lo stampa
     import pandas as pd
     import numpy as np
     import matplotlib.pyplot as plt
     import seaborn as sns
     percorso_file_csv = "C:\\Users\\zetam\\Desktop\\2_
      →Superiore\\Robotica\\netflix_titles.csv"
     df = pd.read_csv(percorso_file_csv)
     print(df)
                                             title
         show id
                                                            director
                      type
    0
              s1
                     Movie
                             Dick Johnson Is Dead Kirsten Johnson
              s2
                  TV Show
    1
                                     Blood & Water
    2
                  TV Show
                                         Ganglands
              s3
                                                    Julien Leclercq
    3
                  TV Show
                            Jailbirds New Orleans
                                                                 NaN
              s5
                  TV Show
                                     Kota Factory
                                                                 NaN
                     Movie
    8802
           s8803
                                            Zodiac
                                                      David Fincher
    8803
           s8804
                  TV Show
                                       Zombie Dumb
                                        Zombieland
    8804
           s8805
                     Movie
                                                    Ruben Fleischer
    8805
                                              Zoom
                                                       Peter Hewitt
           s8806
                     Movie
    8806
           s8807
                     Movie
                                            Zubaan
                                                        Mozez Singh
                                                                      country \
                                                         cast
    0
                                                          NaN United States
    1
          Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...
                                                               South Africa
    2
          Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...
                                                                        NaN
    3
                                                                          NaN
                                                          NaN
    4
          Mayur More, Jitendra Kumar, Ranjan Raj, Alam K...
                                                                      India
    8802
          Mark Ruffalo, Jake Gyllenhaal, Robert Downey J...
                                                             United States
    8803
                                                          NaN
                                                                          NaN
          Jesse Eisenberg, Woody Harrelson, Emma Stone, ... United States
    8804
          Tim Allen, Courteney Cox, Chevy Chase, Kate Ma... United States
    8805
```

4 September 24, 2021 2021 TV-MA 2 Seasons November 20, 2019 8802 2007 R 158 min July 1, 2019 TV-Y7 2 Seasons 8803 2018 8804 November 1, 2019 2009 R 88 min January 11, 2020 PG8805 2006 88 min 8806 March 2, 2019 2015 TV-14 111 min

listed\_in \
Documentaries

International TV Shows, TV Dramas, TV Mysteries
 Crime TV Shows, International TV Shows, TV Act...

3 Docuseries, Reality TV

4 International TV Shows, Romantic TV Shows, TV ...

...

8802 Cult Movies, Dramas, Thrillers 8803 Kids' TV, Korean TV Shows, TV Comedies 8804 Comedies, Horror Movies

8805 Children & Family Movies, Comedies

8806 Dramas, International Movies, Music & Musicals

#### description

India

- O As her father nears the end of his life, filmm...
- 1 After crossing paths at a party, a Cape Town t...
- 2 To protect his family from a powerful drug lor...
- 3 Feuds, flirtations and toilet talk go down amo...
- 4 In a city of coaching centers known to train I...

...

- $8802\,$  A political cartoonist, a crime reporter and a...
- 8803 While living alone in a spooky town, a young g...
- 8804 Looking to survive in a world taken over by zo...
- 8805 Dragged from civilian life, a former superhero...
- 8806 A scrappy but poor boy worms his way into a ty...

[8807 rows x 12 columns]

0

# 1.2 Identificazione del Tipo di Programma più Frequente nei Titoli Netflix

Movie

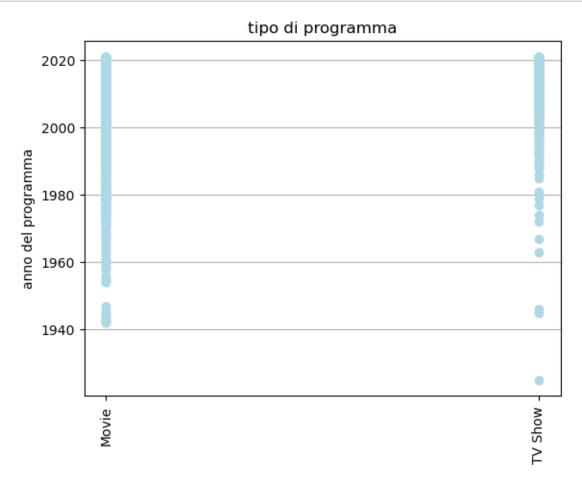
# 1.3 Conteggio dei Programmi Netflix per Anno di Rilascio

```
[13]: # Conta quanti programmi ci sono per ogni anno e stampa i numeri
      import pandas as pd
      anno_programma = df['release_year'].value_counts()
      print(anno_programma)
     release_year
     2018
             1147
     2017
             1032
     2019
            1030
     2020
              953
     2016
              902
     1959
                1
     1925
                1
     1961
                1
     1947
                1
     1966
                1
     Name: count, Length: 74, dtype: int64
```

# 1.4 Identificazione dell'Anno con il Maggior Numero di Programmi Netflix

```
[14]: # Conta quanti programmi ci sono per ogni anno e stampa l'anno che ne ha di più import pandas as pd anno_prog = df['release_year'].value_counts().idxmax() print(anno_prog)
```

# 1.5 Visualizzazione della Distribuzione dei Tipi di Programmi Netflix nel Corso degli Anni



# 1.6 Identificazione e Stampa delle Righe con Valori Mancanti nel DataFrame

```
[16]: # identifica le righe con valori mancanti e lo stampa
      righe_con_dati_mancanti = df[df.isnull().any(axis=1)]
      righe_con_dati_mancanti
Г16]:
           show id
                                               title
                                                              director
                        type
                               Dick Johnson Is Dead Kirsten Johnson
                 s1
                       Movie
      1
                 s2
                     TV Show
                                       Blood & Water
                     TV Show
      2
                 s3
                                           Ganglands Julien Leclercq
      3
                 s4
                     TV Show
                              Jailbirds New Orleans
                                                                    NaN
      4
                 s5
                     TV Show
                                        Kota Factory
                                                                    NaN
                     •••
      8795
             s8796
                     TV Show
                                     Yu-Gi-Oh! Arc-V
                                                                    NaN
      8796
             s8797
                     TV Show
                                          Yunus Emre
                                                                    NaN
      8797
             s8798
                     TV Show
                                           Zak Storm
                                                                    NaN
      8800
                     TV Show
                                  Zindagi Gulzar Hai
             s8801
                                                                    NaN
                                         Zombie Dumb
      8803
             s8804
                    TV Show
                                                                    NaN
                                                                   \
                                                            cast
      0
                                                             NaN
      1
            Ama Qamata, Khosi Ngema, Gail Mabalane, Thaban...
      2
            Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...
      3
                                                             NaN
      4
            Mayur More, Jitendra Kumar, Ranjan Raj, Alam K...
            Mike Liscio, Emily Bauer, Billy Bob Thompson, ...
      8795
            Gökhan Atalay, Payidar Tüfekçioglu, Baran Akbu...
      8796
      8797
            Michael Johnston, Jessica Gee-George, Christin...
      8800
            Sanam Saeed, Fawad Khan, Ayesha Omer, Mehreen ...
      8803
                                                             NaN
                                                                       date_added \
                                                     country
      0
                                              United States
                                                              September 25, 2021
      1
                                               South Africa
                                                              September 24, 2021
      2
                                                              September 24, 2021
                                                         NaN
      3
                                                         {\tt NaN}
                                                              September 24, 2021
      4
                                                       India
                                                              September 24, 2021
                                                                      May 1, 2018
      8795
                                               Japan, Canada
      8796
                                                      Turkey
                                                                 January 17, 2017
            United States, France, South Korea, Indonesia
      8797
                                                              September 13, 2018
      8800
                                                               December 15, 2016
                                                    Pakistan
      8803
                                                         NaN
                                                                     July 1, 2019
                                    duration \
            release_year rating
      0
                     2020 PG-13
                                      90 min
```

```
1
              2021 TV-MA
                           2 Seasons
2
              2021 TV-MA
                             1 Season
3
              2021 TV-MA
                             1 Season
4
              2021 TV-MA
                           2 Seasons
8795
              2015 TV-Y7
                           2 Seasons
8796
              2016 TV-PG
                           2 Seasons
8797
              2016 TV-Y7
                            3 Seasons
8800
              2012 TV-PG
                             1 Season
8803
              2018 TV-Y7
                           2 Seasons
                                               listed_in \
0
                                           Documentaries
1
        International TV Shows, TV Dramas, TV Mysteries
2
      Crime TV Shows, International TV Shows, TV Act...
3
                                  Docuseries, Reality TV
4
      International TV Shows, Romantic TV Shows, TV ...
8795
                                  Anime Series, Kids' TV
8796
                      International TV Shows, TV Dramas
8797
                                                Kids' TV
     International TV Shows, Romantic TV Shows, TV ...
8800
8803
                 Kids' TV, Korean TV Shows, TV Comedies
                                             description
0
      As her father nears the end of his life, filmm...
      After crossing paths at a party, a Cape Town t...
1
2
      To protect his family from a powerful drug lor...
      Feuds, flirtations and toilet talk go down amo...
3
4
      In a city of coaching centers known to train I...
8795 Now that he's discovered the Pendulum Summonin...
8796 During the Mongol invasions, Yunus Emre leaves...
     Teen surfer Zak Storm is mysteriously transpor...
8797
8800
      Strong-willed, middle-class Kashaf and carefre...
8803
      While living alone in a spooky town, a young g...
```

# 1.7 Calcolo e Stampa del Numero Totale di Righe con Dati Mancanti

[18]: 3475

[3475 rows x 12 columns]

# 1.8 Identificazione e Rimozione delle Righe con Valori Mancanti dal DataFrame

```
[]: # identifica le righe con valori mancanti e le rimuove dal dataframe df1, poi⊔
→lo stampa
df1=df.dropna(inplace=False)
df1
```

# 1.9 Creazione di una Matrice Booleana per Indicare Valori Mancanti nel DataFrame

# 1.10 Selezione e Stampa dei Nomi delle Colonne Numeriche del DataFrame

```
[]: # selezioa le colonne del Df che contengono dati numerici e le mette nellau variabile numeric_cols, e poi stampa il nome delle colonne numeric_cols = df.select_dtypes(include=['number']) numeric_cols.columns
```

#### 1.11 Calcolo del Numero di Valori Mancanti per Ogni Colonna in un DataFrame

```
[]: # calcola il numero di valori mancanti per ogni colonna df.isnull().sum()
```

# 1.12 Calcolo della Percentuale di Valori Mancanti per Ogni Colonna in un DataFrame

```
[]: # calcola per ogni colonna la percentuale di valori mancanti su tutte le righe
del dataframe
missing_percent = df.isnull().sum() / len(df) * 100
missing_percent
```

1.13 Calcolo della Percentuale di Valori Mancanti per Ogni Colonna in un DataFrame e Creazione del Grafico a Barre Corrispondente

1.14 Visualizzazione dell'Andamento dei Paesi Produttori nel Tempo tramite un Grafico Lineare e un Box Plot

```
[]: # Visualizza un grafico dei paesi produttori nel tempo
     plt.figure(figsize=(2^16, 2^16))
     sns.lineplot(x='country', y='release_year', data=df)
     plt.title('Andamento dei paesi produttori nel tempo')
     plt.xlabel('country')
     plt.ylabel('anni')
     plt.xticks(rotation=90)
     plt.show()
     # Visualizza una box plot dei paesi produttori nel tempo
     plt.figure(figsize=(2^16, 2^16))
     sns.boxplot(x='country', y='release_year', data=df)
     plt.title('Box Plot dei paesi produttori negli anni')
     plt.xlabel('paesi')
     plt.ylabel('anni')
     plt.xticks(rotation=90)
     plt.show()
```

1.15 Suddivisione del Dataset in Training e Test Set, Creazione di un Grafico a Dispersione e Stampa delle Dimensioni dei Set

#### 1.16 Creazione di Tre Subset Casuali da un DataFrame

```
[21]: # Creare tre subset di dimensioni simili
      # primo subset: campione causale di 1/3 delle righe del df di partenza
      subset1 = df.sample(frac=1/3)
      # stampa il numero di righe del subset1
      11=len(subset1)
      print(11)
      df = df.drop(subset1.index)
      # secondo subset: campione casuale con metà delle righe rimanenti (la metà dei_
       \hookrightarrow 2/3 \ rimanenti)
      subset2 = df.sample(frac=1/2)
      # stampa il numero di righe del subset2
      12=len(subset2)
      print(12)
      df = df.drop(subset2.index)
      # terzo subset: le righe restanti
      subset3 = df
      # stampa il numero di righe del subset3
      13=len(subset3)
      print(13)
```

293629362935

# 1.17 Calcolo delle Percentuali dei Valori Unici per il Paese nel Subset1

```
[22]: percentuali_subset1 = subset1['country'].value_counts(normalize=True)
percentuali_subset1
```

```
United Kingdom
                                            0.057728
                                            0.029795
Japan
South Korea
                                            0.024209
United Kingdom, Hungary, Australia
                                            0.000372
United States, China, Hong Kong
                                            0.000372
United States, Morocco
                                            0.000372
India, Germany
                                            0.000372
United States, Hungary, Ireland, Canada
                                            0.000372
Name: proportion, Length: 347, dtype: float64
```

# 1.18 Identificazione degli Outliers nell'Anno di Rilascio

media anno: 2014.1801975701146 deviazione standard: 8.819312130834057

```
[10]:
          show_id
                                                        title \
                    type
     41
              s42 Movie
                                                         Jaws
     42
              s43 Movie
                                                       Jaws 2
     43
              s44 Movie
                                                       Jaws 3
     44
              s45 Movie
                                            Jaws: The Revenge
                                  Blade Runner: The Final Cut
     131
             s132 Movie
            s8740 Movie
                           Why We Fight: The Battle of Russia
     8739
            s8746 Movie Willy Wonka & the Chocolate Factory
     8745
     8748
            s8749 Movie
                                         Winter of Our Dreams
     8763
            s8764 Movie
                              WWII: Report from the Aleutians
     8792
            s8793 Movie
                                                  Young Tiger
```

director \

```
41
                 Steven Spielberg
42
                    Jeannot Szwarc
43
                         Joe Alves
44
                    Joseph Sargent
131
                      Ridley Scott
8739
      Frank Capra, Anatole Litvak
8745
                        Mel Stuart
8748
                       John Duigan
8763
                       John Huston
8792
                            Mu Chu
                                                     cast \
41
      Roy Scheider, Robert Shaw, Richard Dreyfuss, L...
42
      Roy Scheider, Lorraine Gary, Murray Hamilton, ...
      Dennis Quaid, Bess Armstrong, Simon MacCorkind...
43
44
      Lorraine Gary, Lance Guest, Mario Van Peebles,...
      Harrison Ford, Rutger Hauer, Sean Young, Edwar...
131
8739
                                                      NaN
8745
      Gene Wilder, Jack Albertson, Peter Ostrum, Roy...
      Judy Davis, Bryan Brown, Cathy Downes, Baz Luh...
8748
8763
                                                      NaN
8792
      Qiu Yuen, Charlie Chin, Jackie Chan, Hu Chin, ...
                                          country
                                                            date added \
41
                                   United States
                                                   September 16, 2021
42
                                   United States
                                                   September 16, 2021
43
                                   United States
                                                   September 16, 2021
44
                                                   September 16, 2021
                                   United States
131
                                                    September 1, 2021
                                   United States
                                                       March 31, 2017
8739
                                   United States
                                                       January 1, 2020
8745
      United States, East Germany, West Germany
8748
                                        Australia
                                                     November 1, 2016
8763
                                   United States
                                                       March 31, 2017
8792
                                                     November 1, 2016
                                        Hong Kong
      release_year rating duration \
41
              1975
                        PG
                            124 min
42
              1978
                            116 min
                        PG
43
              1983
                        PG
                             98 min
44
              1987
                     PG-13
                             91 min
131
              1982
                         R
                            117 min
              1943 TV-PG
8739
                             82 min
8745
              1971
                         G
                           100 min
```

```
8748
              1981
                             86 min
                       NR
8763
              1943
                   TV-PG
                             45 min
8792
              1973
                       NR.
                             81 min
                                               listed_in \
41
             Action & Adventure, Classic Movies, Dramas
42
                       Dramas, Horror Movies, Thrillers
43
           Action & Adventure, Horror Movies, Thrillers
           Action & Adventure, Horror Movies, Thrillers
44
131
        Action & Adventure, Classic Movies, Cult Movies
8739
                                           Documentaries
8745
     Children & Family Movies, Classic Movies, Come...
8748
                                  Classic Movies, Dramas
8763
                                           Documentaries
8792
               Action & Adventure, International Movies
                                             description
41
      When an insatiable great white shark terrorize...
42
      Four years after the last deadly shark attacks...
43
      After the staff of a marine theme park try to ...
44
      After another deadly shark attack, Ellen Brody...
131
      In a smog-choked dystopian Los Angeles, blade ...
8739 This installment of Frank Capra's acclaimed do...
8745 Zany Willy Wonka causes a stir when he announc...
8748 After the death of a long-ago lover, married p...
8763 Filmmaker John Huston narrates this Oscar-nomi...
8792 Aided only by a tough female police officer, a...
```

# 2 USO DEI MODELLI

[217 rows x 12 columns]

# 3 Utilizzo della Random Forest Classifier

```
[11]: import category_encoders as ce
    from sklearn.model_selection import train_test_split
    from sklearn.ensemble import RandomForestClassifier
    from sklearn.metrics import classification_report

# 'release_year' è la variabile target
X = df.drop('release_year', axis=1)
y = df['release_year']

# splitto i dati in train e test set
```

```
⇔random_state=42)
# creo un codificatore di tutte le variabili categoriali
encoder = ce.OrdinalEncoder(cols=['show_id', 'type', 'title', 'director', __
# adatto e trasformo con il codificatore i train data
X_train = encoder.fit_transform(X_train)
# adatto e trasformo con il codificatore i test data
X_test = encoder.transform(X_test)
# inizializzo il classificatore RandomForest con 100 stime
rfc = RandomForestClassifier(random_state=42)
# addestrqa il modello al train set
rfc.fit(X_train, y_train)
# effettua le predizioni sul test set
y_pred = rfc.predict(X_test)
accuracy = accuracy_score(y_test, y_pred)
cl_rep = classification_report(y_test, y_pred)
# visualizza l'accuratezza e il report di classificazione
print("Accuratezza del modello", accuracy)
print("\nReport di classificazione:\n", cl_rep)
```

Accuratezza del modello 0.1424517593643587

#### Report di classificazione:

|      | precision | recall | f1-score | support |
|------|-----------|--------|----------|---------|
|      |           |        |          |         |
| 1925 | 0.00      | 0.00   | 0.00     | 1       |
| 1942 | 0.00      | 0.00   | 0.00     | 1       |
| 1943 | 0.00      | 0.00   | 0.00     | 2       |
| 1954 | 0.00      | 0.00   | 0.00     | 2       |
| 1960 | 0.00      | 0.00   | 0.00     | 2       |
| 1961 | 0.00      | 0.00   | 0.00     | 1       |
| 1962 | 0.00      | 0.00   | 0.00     | 1       |
| 1963 | 0.00      | 0.00   | 0.00     | 2       |
| 1967 | 0.00      | 0.00   | 0.00     | 3       |
| 1969 | 0.00      | 0.00   | 0.00     | 1       |
| 1971 | 0.00      | 0.00   | 0.00     | 1       |
| 1973 | 0.00      | 0.00   | 0.00     | 2       |

| 1974 | 0.00 | 0.00 | 0.00 | 2   |
|------|------|------|------|-----|
| 1975 | 0.00 | 0.00 | 0.00 | 4   |
| 1976 | 0.00 | 0.00 | 0.00 | 3   |
| 1977 | 0.00 | 0.00 | 0.00 | 2   |
| 1978 | 0.00 | 0.00 | 0.00 | 1   |
| 1979 | 0.00 | 0.00 | 0.00 | 2   |
| 1980 | 0.00 | 0.00 | 0.00 | 1   |
| 1981 | 0.00 | 0.00 | 0.00 | 2   |
| 1982 | 0.00 | 0.00 | 0.00 | 6   |
| 1983 | 0.00 | 0.00 | 0.00 | 1   |
| 1984 | 0.00 | 0.00 | 0.00 | 3   |
| 1985 | 0.00 | 0.00 | 0.00 | 3   |
| 1986 | 0.00 | 0.00 | 0.00 | 3   |
| 1987 | 0.00 | 0.00 | 0.00 | 1   |
| 1988 | 0.00 | 0.00 | 0.00 | 2   |
|      |      |      |      |     |
| 1989 | 0.00 | 0.00 | 0.00 | 5   |
| 1990 | 0.00 | 0.00 | 0.00 | 3   |
| 1991 | 0.00 | 0.00 | 0.00 | 3   |
| 1992 | 0.00 | 0.00 | 0.00 | 6   |
| 1993 | 0.00 | 0.00 | 0.00 | 4   |
| 1994 | 0.00 | 0.00 | 0.00 | 3   |
| 1995 | 0.00 | 0.00 | 0.00 | 5   |
| 1996 | 0.00 | 0.00 | 0.00 | 9   |
| 1997 | 0.00 | 0.00 | 0.00 | 9   |
| 1998 | 0.00 | 0.00 | 0.00 | 7   |
| 1999 | 0.00 | 0.00 | 0.00 | 4   |
| 2000 | 0.17 | 0.17 | 0.17 | 6   |
| 2001 | 0.00 | 0.00 | 0.00 | 5   |
| 2002 | 0.00 | 0.00 | 0.00 | 5   |
| 2003 | 0.00 | 0.00 | 0.00 | 16  |
| 2004 | 0.00 | 0.00 | 0.00 | 17  |
| 2005 | 0.00 | 0.00 | 0.00 | 14  |
| 2006 | 0.00 | 0.00 | 0.00 | 26  |
| 2007 | 0.00 | 0.00 | 0.00 | 17  |
| 2008 | 0.02 | 0.08 | 0.03 | 24  |
| 2009 | 0.00 | 0.00 | 0.00 | 33  |
| 2010 | 0.20 | 0.02 | 0.04 | 42  |
| 2011 | 0.00 | 0.00 | 0.00 | 39  |
| 2012 | 0.14 | 0.02 | 0.03 | 51  |
| 2013 | 0.00 | 0.00 | 0.00 | 59  |
| 2014 | 0.00 | 0.00 | 0.00 | 69  |
| 2015 | 0.03 | 0.01 | 0.01 | 101 |
| 2016 | 0.16 | 0.09 | 0.11 | 194 |
| 2017 | 0.13 | 0.28 | 0.11 | 202 |
| 2017 | 0.16 | 0.30 | 0.21 | 211 |
| 2019 | 0.14 | 0.17 | 0.21 | 189 |
| 2019 | 0.15 | 0.17 | 0.19 | 193 |
| 2020 | 0.13 | 0.20 | 0.19 | 136 |
| ZVZI | 0.30 | 0.10 | 0.20 | 100 |

```
0.03
                             0.03
                                       0.02
                                                 1762
   macro avg
weighted avg
                   0.12
                             0.14
                                       0.12
                                                 1762
C:\Users\zetam\anaconda3\Lib\site-
packages\sklearn\metrics\_classification.py:1469: UndefinedMetricWarning:
Precision and F-score are ill-defined and being set to 0.0 in labels with no
predicted samples. Use `zero_division` parameter to control this behavior.
  _warn_prf(average, modifier, msg_start, len(result))
C:\Users\zetam\anaconda3\Lib\site-
packages\sklearn\metrics\_classification.py:1469: UndefinedMetricWarning:
Precision and F-score are ill-defined and being set to 0.0 in labels with no
predicted samples. Use `zero_division` parameter to control this behavior.
  _warn_prf(average, modifier, msg_start, len(result))
C:\Users\zetam\anaconda3\Lib\site-
```

packages\sklearn\metrics\\_classification.py:1469: UndefinedMetricWarning: Precision and F-score are ill-defined and being set to 0.0 in labels with no predicted samples. Use `zero\_division` parameter to control this behavior.

\_warn\_prf(average, modifier, msg\_start, len(result))

0.14

1762

accuracy

# 3.1 Uso della Logistic Regression

```
[4]: import category_encoders as ce
    from sklearn.model_selection import train_test_split
    from sklearn.linear_model import LogisticRegression
    from sklearn.metrics import accuracy_score, classification_report
    # 'release_year' è la variabile target
    X = df.drop('release_year', axis=1)
    y = df['release_year']
    # splitto i dati in train e test set
    →random_state=42)
    # creo un codificatore di tutte le variabili categoriali
    encoder = ce.OrdinalEncoder(cols=['show_id', 'type', 'title', 'director', _
     # adatto e trasformo con il codificatore i train data
    X_train = encoder.fit_transform(X_train)
    # adatto e trasformo con il codificatore i test data
    X_test = encoder.transform(X_test)
    # inizializzazione del classificatore di regressioni logistica
```

```
log_reg_classifier = LogisticRegression(random_state=42)

# addestra il modello sul train set
log_reg_classifier.fit(X_train, y_train)

# effettua le predizioni sul test set
y_pred = log_reg_classifier.predict(X_test)

# valutazione prestazioni modello
accuracy = accuracy_score(y_test, y_pred)
cl_rep = classification_report(y_test, y_pred)

# visualizza l'accuratezza e il report di classificazione
print("Accuratezza del modello", accuracy)
print("\nReport di classificazione:\n", cl_rep)
```

Accuratezza del modello 0.13904653802497163

#### Report di classificazione:

|      | precision | recall | f1-score | support |
|------|-----------|--------|----------|---------|
|      |           |        |          |         |
| 1925 | 0.00      | 0.00   | 0.00     | 1       |
| 1942 | 0.00      | 0.00   | 0.00     | 1       |
| 1943 | 0.00      | 0.00   | 0.00     | 2       |
| 1954 | 0.00      | 0.00   | 0.00     | 2       |
| 1960 | 0.00      | 0.00   | 0.00     | 2       |
| 1961 | 0.00      | 0.00   | 0.00     | 1       |
| 1962 | 0.00      | 0.00   | 0.00     | 1       |
| 1963 | 0.00      | 0.00   | 0.00     | 2       |
| 1967 | 0.00      | 0.00   | 0.00     | 3       |
| 1969 | 0.00      | 0.00   | 0.00     | 1       |
| 1971 | 0.00      | 0.00   | 0.00     | 1       |
| 1973 | 0.00      | 0.00   | 0.00     | 2       |
| 1974 | 0.00      | 0.00   | 0.00     | 2       |
| 1975 | 0.00      | 0.00   | 0.00     | 4       |
| 1976 | 0.00      | 0.00   | 0.00     | 3       |
| 1977 | 0.00      | 0.00   | 0.00     | 2       |
| 1978 | 0.00      | 0.00   | 0.00     | 1       |
| 1979 | 0.00      | 0.00   | 0.00     | 2       |
| 1980 | 0.00      | 0.00   | 0.00     | 1       |
| 1981 | 0.00      | 0.00   | 0.00     | 2       |
| 1982 | 0.00      | 0.00   | 0.00     | 6       |
| 1983 | 0.00      | 0.00   | 0.00     | 1       |
| 1984 | 0.00      | 0.00   | 0.00     | 3       |
| 1985 | 0.00      | 0.00   | 0.00     | 3       |
| 1986 | 0.00      | 0.00   | 0.00     | 3       |
| 1987 | 0.00      | 0.00   | 0.00     | 1       |
| 1988 | 0.00      | 0.00   | 0.00     | 2       |

| 1989         | 0.00 | 0.00 | 0.00 | 5    |
|--------------|------|------|------|------|
| 1990         | 0.00 | 0.00 | 0.00 | 3    |
| 1991         | 0.00 | 0.00 | 0.00 | 3    |
| 1992         | 0.00 | 0.00 | 0.00 | 6    |
| 1993         | 0.00 | 0.00 | 0.00 | 4    |
| 1994         | 0.00 | 0.00 | 0.00 | 3    |
| 1995         | 0.00 | 0.00 | 0.00 | 5    |
| 1996         | 0.00 | 0.00 | 0.00 | 9    |
| 1997         | 0.00 | 0.00 | 0.00 | 9    |
| 1998         | 0.00 | 0.00 | 0.00 | 7    |
| 1999         | 0.00 | 0.00 | 0.00 | 4    |
| 2000         | 0.00 | 0.00 | 0.00 | 6    |
| 2001         | 0.00 | 0.00 | 0.00 | 5    |
| 2002         | 0.00 | 0.00 | 0.00 | 5    |
| 2003         | 0.00 | 0.00 | 0.00 | 16   |
| 2004         | 0.00 | 0.00 | 0.00 | 17   |
| 2005         | 0.00 | 0.00 | 0.00 | 14   |
| 2006         | 0.00 | 0.00 | 0.00 | 26   |
| 2007         | 0.00 | 0.00 | 0.00 | 17   |
| 2008         | 0.00 | 0.00 | 0.00 | 24   |
| 2009         | 0.00 | 0.00 | 0.00 | 33   |
| 2010         | 0.00 | 0.00 | 0.00 | 42   |
| 2011         | 0.00 | 0.00 | 0.00 | 39   |
| 2012         | 0.00 | 0.00 | 0.00 | 51   |
| 2013         | 0.00 | 0.00 | 0.00 | 59   |
| 2014         | 0.00 | 0.00 | 0.00 | 69   |
| 2015         | 0.00 | 0.00 | 0.00 | 101  |
| 2016         | 0.12 | 0.29 | 0.18 | 194  |
| 2017         | 0.16 | 0.11 | 0.13 | 202  |
| 2018         | 0.10 | 0.09 | 0.10 | 211  |
| 2019         | 0.00 | 0.00 | 0.00 | 189  |
| 2020         | 0.13 | 0.47 | 0.20 | 193  |
| 2021         | 0.21 | 0.40 | 0.28 | 136  |
| accuracy     |      |      | 0.14 | 1762 |
| macro avg    | 0.01 | 0.02 | 0.01 | 1762 |
| weighted avg | 0.07 | 0.14 | 0.09 | 1762 |
|              |      |      |      |      |

C:\Users\zetam\anaconda3\Lib\site-

packages\sklearn\linear\_model\\_logistic.py:460: 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

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(
C:\Users\zetam\anaconda3\Lib\site-
packages\sklearn\metrics\_classification.py:1469: UndefinedMetricWarning:
Precision and F-score are ill-defined and being set to 0.0 in labels with no
predicted samples. Use `zero_division` parameter to control this behavior.
  warn prf(average, modifier, msg start, len(result))
C:\Users\zetam\anaconda3\Lib\site-
packages\sklearn\metrics\_classification.py:1469: UndefinedMetricWarning:
Precision and F-score are ill-defined and being set to 0.0 in labels with no
predicted samples. Use `zero_division` parameter to control this behavior.
  _warn_prf(average, modifier, msg_start, len(result))
C:\Users\zetam\anaconda3\Lib\site-
packages\sklearn\metrics\_classification.py:1469: UndefinedMetricWarning:
Precision and F-score are ill-defined and being set to 0.0 in labels with no
predicted samples. Use `zero_division` parameter to control this behavior.
  _warn_prf(average, modifier, msg_start, len(result))
```

# 3.2 Uso della Support Vector Classifier

```
[25]: import category encoders as ce
     from sklearn.model_selection import train_test_split
     from sklearn.svm import SVC
     from sklearn.metrics import accuracy_score, classification_report
     # 'release_year' è la variabile target
     X = df.drop('release_year', axis=1)
     y = df['release_year']
     # splitto i dati in train e test set
     X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2,_
      →random_state=42)
     # creo un codificatore di tutte le variabili categoriali
     ⇔'description'])
     # adatto e trasformo con il codificatore i train data
     X_train = encoder.fit_transform(X_train)
     # adatto e trasformo con il codificatore i test data
     X test = encoder.transform(X test)
     # inizializzazione del classificatore SVC
     svm cl = SVC(random state=42)
     # addestra il modello sul train set
     svm_cl.fit(X_train, y_train)
```

```
# effettua le predizioni sul test set
y_pred = svm_cl.predict(X_test)

# valutazione prestazioni modello
accuracy = accuracy_score(y_test, y_pred)
cl_rep = classification_report(y_test, y_pred)

# visualizza l'accuratezza e il report di classificazione
print("Accuratezza del modello", accuracy)
print("\nReport di classificazione:\n", cl_rep)
```

Accuratezza del modello 0.12776831345826234

# Report di classificazione:

|      | precision | recall | f1-score | support |
|------|-----------|--------|----------|---------|
| 1944 | 0.00      | 0.00   | 0.00     | 1       |
| 1963 | 0.00      | 0.00   | 0.00     | 1       |
| 1967 | 0.00      | 0.00   | 0.00     | 1       |
| 1968 | 0.00      | 0.00   | 0.00     | 1       |
| 1971 | 0.00      | 0.00   | 0.00     | 1       |
| 1974 | 0.00      | 0.00   | 0.00     | 2       |
| 1978 | 0.00      | 0.00   | 0.00     | 1       |
| 1980 | 0.00      | 0.00   | 0.00     | 1       |
| 1981 | 0.00      | 0.00   | 0.00     | 1       |
| 1982 | 0.00      | 0.00   | 0.00     | 5       |
| 1983 | 0.00      | 0.00   | 0.00     | 1       |
| 1986 | 0.00      | 0.00   | 0.00     | 1       |
| 1989 | 0.00      | 0.00   | 0.00     | 1       |
| 1990 | 0.00      | 0.00   | 0.00     | 1       |
| 1992 | 0.00      | 0.00   | 0.00     | 1       |
| 1993 | 0.00      | 0.00   | 0.00     | 3       |
| 1994 | 0.00      | 0.00   | 0.00     | 2       |
| 1995 | 0.00      | 0.00   | 0.00     | 2       |
| 1996 | 0.00      | 0.00   | 0.00     | 1       |
| 1997 | 0.00      | 0.00   | 0.00     | 4       |
| 1998 | 0.00      | 0.00   | 0.00     | 2       |
| 1999 | 0.00      | 0.00   | 0.00     | 5       |
| 2000 | 0.00      | 0.00   | 0.00     | 5       |
| 2001 | 0.00      | 0.00   | 0.00     | 5       |
| 2002 | 0.00      | 0.00   | 0.00     | 4       |
| 2003 | 0.00      | 0.00   | 0.00     | 4       |
| 2004 | 0.00      | 0.00   | 0.00     | 7       |
| 2005 | 0.00      | 0.00   | 0.00     | 4       |
| 2006 | 0.00      | 0.00   | 0.00     | 6       |
| 2007 | 0.00      | 0.00   | 0.00     | 6       |
| 2008 | 0.00      | 0.00   | 0.00     | 10      |

| 2009         | 0.00 | 0.00 | 0.00 | 9   |
|--------------|------|------|------|-----|
| 2010         | 0.00 | 0.00 | 0.00 | 8   |
| 2011         | 0.00 | 0.00 | 0.00 | 16  |
| 2012         | 0.00 | 0.00 | 0.00 | 17  |
| 2013         | 0.00 | 0.00 | 0.00 | 25  |
| 2014         | 0.00 | 0.00 | 0.00 | 22  |
| 2015         | 0.00 | 0.00 | 0.00 | 36  |
| 2016         | 0.00 | 0.00 | 0.00 | 46  |
| 2017         | 0.26 | 0.13 | 0.17 | 78  |
| 2018         | 0.12 | 0.87 | 0.21 | 70  |
| 2019         | 0.00 | 0.00 | 0.00 | 66  |
| 2020         | 0.17 | 0.07 | 0.10 | 61  |
| 2021         | 0.00 | 0.00 | 0.00 | 43  |
|              |      |      |      |     |
| accuracy     |      |      | 0.13 | 587 |
| macro avg    | 0.01 | 0.02 | 0.01 | 587 |
| weighted avg | 0.07 | 0.13 | 0.06 | 587 |

#### C:\Users\zetam\anaconda3\Lib\site-

packages\sklearn\metrics\\_classification.py:1469: UndefinedMetricWarning: Precision and F-score are ill-defined and being set to 0.0 in labels with no predicted samples. Use `zero\_division` parameter to control this behavior.

\_warn\_prf(average, modifier, msg\_start, len(result))

#### C:\Users\zetam\anaconda3\Lib\site-

packages\sklearn\metrics\\_classification.py:1469: UndefinedMetricWarning: Precision and F-score are ill-defined and being set to 0.0 in labels with no predicted samples. Use `zero\_division` parameter to control this behavior.

\_warn\_prf(average, modifier, msg\_start, len(result))

#### C:\Users\zetam\anaconda3\Lib\site-

packages\sklearn\metrics\\_classification.py:1469: UndefinedMetricWarning: Precision and F-score are ill-defined and being set to 0.0 in labels with no predicted samples. Use `zero\_division` parameter to control this behavior.

\_warn\_prf(average, modifier, msg\_start, len(result))