## rk1

## April 2, 2023

## 1 1 1.1 []: import numpy as np import pandas as pd import seaborn as sns import matplotlib.pyplot as plt from category\_encoders.count import CountEncoder as ce\_CountEncoder from sklearn.datasets import load\_breast\_cancer from sklearn.model\_selection import train\_test\_split from sklearn.preprocessing import RobustScaler %matplotlib inline sns.set(style="ticks") 1.2 $N_{2}1$ "count (frequency) encoding". 1.2.1 []: # data\_loaded = pd.read\_csv('data/hotel.csv', sep=",") data\_loaded.shape []: (4000, 36) []: data\_loaded.head() []: additional\_info \ O Room Service|Internet Access|Restaurant|Free I... Room Service | Gym/Spa 1 2 Restaurant|Swimming Pool 3 NaN Internet Access|Restaurant address area city \ 15th Mile, N.H.21, Manali, District Kullu, Himac... Manali Others

```
A-585, Sushant Lok-1, Near Iffco Chowk Metro S...
                                                          Sushant Lok Gurgaon
   Cobra Vaddo, Calungate Baga Road, Bardez, Calan... Calangute Area
                                                                            Goa
3
                                                  Simsa
                                                          Village Simsa
                                                                           Manali
4
          8180 Street No.-6, Arakashan Road, Paharganj
                                                              Paharganj
                                                                            Delhi
                        guest_recommendation hotel_brand hotel_category
  country
          crawl_date
    India
           2016-07-24
0
                                         85.0
                                                       NaN
                                                                  gostays
1
    India 2016-07-24
                                         87.0
                                                       NaN
                                                                  regular
2
    India 2016-07-24
                                         50.0
                                                                  regular
                                                       NaN
    India 2016-07-24
3
                                        100.0
                                                       NaN
                                                                  regular
    India 2016-07-24
                                         63.0
                                                       NaN
                                                                  regular
                                     hotel_description ... room_count \
  The standard check-in time is 12:00 PM and the...
                                                                 17
  The standard check-in time is 12:00 PM and the...
                                                                 18
1
2 The standard check-in time is 12:00 PM and the... ...
                                                                 15
3 The standard check-in time is 12:00 PM and the... ...
                                                                 24
4 The standard check-in time is 12:00 PM and the...
                                                                 20
                                       room_facilities \
O Room Service | Basic Bathroom Amenities | Cable /...
1 Room Service | Air Conditioning | Basic Bathroom...
2 Room Service | Air Conditioning | Cable / Satell...
3 Basic Bathroom Amenities | Cable / Satellite / P...
4 Basic Bathroom Amenities | Cable / Satellite / P...
                     room_type \
0
                  Deluxe Room
1
   Deluxe Room With Free WIFI
2
                Standard Room
                  Deluxe Room
3
4
         Standard Room Non AC
                                         similar_hotel site_review_count
  https://www.goibibo.com/hotels/woodchime-homes...
                                                                    87.0
1 https://www.goibibo.com/hotels/stepinn-iffco-c...
                                                                     8.0
2 https://www.goibibo.com/hotels/sunrise-beach-r...
                                                                     2.0
3 https://www.goibibo.com/hotels/green-cottages-...
                                                                     1.0
4 https://www.goibibo.com/hotels/delhi-continent...
                                                                  121.0
                                                    site_stay_review_rating \
   site review rating
0
                        Service Quality::3.9 | Amenities::3.7 | Food and D...
                        Service Quality::4.7 | Amenities::4.7 | Food and D...
1
2
                   2.5 Service Quality::2.5 | Amenities::2.5 | Food and D...
3
                        Service Quality::5.0 | Amenities::5.0 | Food and D...
4
                   2.8 Service Quality::2.7 | Amenities::2.6 | Food and D...
```

```
sitename
                            state
                                                             uniq_id
     O goibibo Himachal Pradesh
                                   2c8db027d43a9452a43e88eb30d9f983
     1 goibibo
                          Haryana
                                   e98f69f889c0235e6dc480e7df6de0de
     2 goibibo
                              Goa
                                   9b59d00eaffc273d83000ed7dcda0e83
     3 goibibo Himachal Pradesh df0971f9c5501af112485ee28b468ce5
     4 goibibo
                            Delhi 0c3514344c9cda8718f558e84bdb44ef
     [5 rows x 36 columns]
[]: data_features = list(zip(
     [i for i in data_loaded.columns],
     zip(
         [str(i) for i in data_loaded.dtypes],
         [i for i in data_loaded.isnull().sum()]
     )))
     #
     data features
[]: [('additional_info', ('object', 808)),
      ('address', ('object', 0)),
      ('area', ('object', 35)),
      ('city', ('object', 0)),
      ('country', ('object', 0)),
      ('crawl_date', ('object', 0)),
      ('guest_recommendation', ('float64', 1584)),
      ('hotel_brand', ('object', 3611)),
      ('hotel_category', ('object', 0)),
      ('hotel_description', ('object', 17)),
      ('hotel_facilities', ('object', 194)),
      ('hotel_star_rating', ('int64', 0)),
      ('image_count', ('int64', 0)),
      ('latitude', ('float64', 0)),
      ('locality', ('object', 35)),
      ('longitude', ('float64', 0)),
      ('pageurl', ('object', 0)),
      ('point_of_interest', ('object', 240)),
      ('property_id', ('object', 0)),
      ('property_name', ('object', 0)),
      ('property_type', ('object', 0)),
      ('province', ('object', 0)),
      ('qts', ('object', 1284)),
      ('query_time_stamp', ('object', 0)),
      ('review_count_by_category', ('object', 1585)),
      ('room_area', ('object', 2872)),
```

```
('room_count', ('int64', 0)),
      ('room_facilities', ('object', 270)),
      ('room_type', ('object', 0)),
      ('similar_hotel', ('object', 83)),
      ('site_review_count', ('float64', 1584)),
      ('site_review_rating', ('float64', 1584)),
      ('site_stay_review_rating', ('object', 0)),
      ('sitename', ('object', 0)),
      ('state', ('object', 0)),
      ('uniq_id', ('object', 0))]
[]: #
    cols_filter = ['uniq_id', 'property_name', 'property_type', 'city',

     'guest recommendation', 'sitename']
    data = data_loaded[cols_filter]
    data.head()
[]:
                                               property_name property_type \
                                uniq_id
    0 2c8db027d43a9452a43e88eb30d9f983
                                            Baragarh Regency
                                                                    Resort
    1 e98f69f889c0235e6dc480e7df6de0de Asian Suites A-585
                                                               Guest House
    2 9b59d00eaffc273d83000ed7dcda0e83
                                               Bevvan Resort
                                                                    Resort
    3 df0971f9c5501af112485ee28b468ce5
                                           Apple Inn Cottage
                                                                   Cottage
    4 0c3514344c9cda8718f558e84bdb44ef Anmol Hotel Pvt.Ltd
                                                                     Hotel
          city crawl_date guest_recommendation sitename
       Manali 2016-07-24
    0
                                            85.0 goibibo
    1 Gurgaon 2016-07-24
                                            87.0 goibibo
    2
           Goa 2016-07-24
                                            50.0 goibibo
    3
       Manali 2016-07-24
                                           100.0 goibibo
         Delhi 2016-07-24
                                            63.0 goibibo
[]: #
    def impute_na(df, variable, value):
        df[variable].fillna(value, inplace=True)
    impute_na(data, 'guest_recommendation', data['guest_recommendation'].mean())
    /var/folders/fs/5xh23h99763f_blp7m50x23h0000gq/T/ipykernel_3775/3897478908.py:3:
    SettingWithCopyWarning:
    A value is trying to be set on a copy of a slice from a DataFrame
    See the caveats in the documentation: https://pandas.pydata.org/pandas-
    docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
      df[variable].fillna(value, inplace=True)
[]: #
    data.isnull().sum()
```

```
[]: uniq_id
                              0
    property_name
                              0
    property_type
                              0
     city
                              0
                              0
     crawl_date
     guest_recommendation
                              0
     sitename
                              0
     dtype: int64
    1.2.2
                                      "count (frequence) encoding"
[]: ce_CountEncoder1 = ce_CountEncoder()
     data_COUNT_ENC = ce_CountEncoder1.fit_transform(data[data.columns.

difference(['uniq_id'])])
[]: data_COUNT_ENC
[]:
           city crawl_date guest_recommendation property_name property_type \
     0
             70
                         976
                                          85.000000
                                                                  1
                                                                                516
                         976
                                          87.000000
     1
            101
                                                                  1
                                                                                243
     2
            220
                         976
                                          50.000000
                                                                  1
                                                                                516
     3
             70
                         976
                                         100.000000
                                                                  1
                                                                                 75
     4
            137
                         976
                                          63.000000
                                                                  1
                                                                               2314
     3995
             16
                         799
                                          75.537666
                                                                  1
                                                                               2314
     3996
             62
                         799
                                          75.537666
                                                                  2
                                                                               2314
     3997
             65
                         799
                                          83.000000
                                                                  1
                                                                               2314
     3998
              3
                         799
                                          75.537666
                                                                  2
                                                                               2314
     3999
              1
                         799
                                                                               2314
                                          50.000000
                                                                  1
           sitename
               4000
     0
     1
               4000
     2
               4000
     3
               4000
     4
               4000
     3995
               4000
     3996
               4000
     3997
               4000
     3998
               4000
     3999
               4000
     [4000 rows x 6 columns]
[]: data['property_type'].unique()
```

```
[]: array(['Resort', 'Guest House', 'Cottage', 'Hotel', 'Homestay', 'Villa',
            'Palace', 'Lodge', 'Houseboat', 'Service Apartment', 'BnB',
            'Hostel', 'Bungalow', 'Tent', 'Luxury Yacht', 'Motel', 'Beach Hut',
            'Farm Stay'], dtype=object)
[]: data_COUNT_ENC['property_type'].unique()
[]: array([516,
                   243,
                           75, 2314,
                                      231,
                                              49,
                                                    11, 117,
                                                                78.
                                                                     183.
                                                                             10.
              46,
                    57,
                           3,
                                  9,
                                        2,
                                              7])
[]: ce_CountEncoder2 = ce_CountEncoder(normalize=True)
     data_FREQ_ENC = ce_CountEncoder2.fit_transform(data[data.columns.

difference(['uniq_id'])])
[ ]: data FREQ ENC
[]:
                    crawl_date
                                 guest_recommendation property_name
                                                                       property_type
              city
                       0.24400
                                            85.000000
     0
           0.01750
                                                              0.00025
                                                                              0.12900
     1
           0.02525
                       0.24400
                                            87.000000
                                                              0.00025
                                                                              0.06075
     2
           0.05500
                       0.24400
                                            50.000000
                                                              0.00025
                                                                              0.12900
     3
           0.01750
                       0.24400
                                           100.000000
                                                              0.00025
                                                                              0.01875
     4
           0.03425
                       0.24400
                                            63.000000
                                                              0.00025
                                                                              0.57850
     3995
           0.00400
                       0.19975
                                            75.537666
                                                              0.00025
                                                                              0.57850
     3996 0.01550
                                                              0.00050
                       0.19975
                                            75.537666
                                                                              0.57850
     3997
           0.01625
                       0.19975
                                            83.000000
                                                              0.00025
                                                                              0.57850
     3998
           0.00075
                       0.19975
                                            75.537666
                                                              0.00050
                                                                              0.57850
     3999
          0.00025
                       0.19975
                                            50.000000
                                                              0.00025
                                                                              0.57850
           sitename
     0
                1.0
                1.0
     1
     2
                1.0
     3
                1.0
     4
                1.0
                1.0
     3995
                1.0
     3996
     3997
                1.0
     3998
                1.0
     3999
                1.0
     [4000 rows x 6 columns]
[]: data_FREQ_ENC['property_type'].unique()
```

```
[]: array([1.290e-01, 6.075e-02, 1.875e-02, 5.785e-01, 5.775e-02, 1.225e-02,
            2.750e-03, 2.925e-02, 1.950e-02, 4.575e-02, 2.500e-03, 1.150e-02,
            1.425e-02, 7.500e-04, 2.250e-03, 5.000e-04, 1.750e-03])
    1.3
              №21
    1.4
[ ]: boston_dataset = load_breast_cancer()
     data = pd.DataFrame(boston_dataset.data,
                            columns=boston_dataset.feature_names)
     data['Y'] = boston_dataset.target
     data.shape
[]: (569, 31)
[]: data.head()
[]:
        mean radius
                     mean texture mean perimeter
                                                     mean area mean smoothness
     0
              17.99
                             10.38
                                             122.80
                                                        1001.0
                                                                         0.11840
     1
              20.57
                             17.77
                                             132.90
                                                        1326.0
                                                                         0.08474
     2
              19.69
                             21.25
                                             130.00
                                                        1203.0
                                                                         0.10960
     3
              11.42
                             20.38
                                             77.58
                                                         386.1
                                                                         0.14250
              20.29
                             14.34
                                            135.10
                                                        1297.0
                                                                         0.10030
        mean compactness
                          mean concavity mean concave points
                                                                 mean symmetry \
     0
                 0.27760
                                   0.3001
                                                        0.14710
                                                                         0.2419
     1
                 0.07864
                                   0.0869
                                                        0.07017
                                                                         0.1812
     2
                 0.15990
                                   0.1974
                                                        0.12790
                                                                         0.2069
     3
                 0.28390
                                   0.2414
                                                        0.10520
                                                                         0.2597
                 0.13280
                                   0.1980
                                                        0.10430
                                                                         0.1809
        mean fractal dimension ... worst texture worst perimeter
                                                                     worst area
     0
                       0.07871
                                             17.33
                                                             184.60
                                                                          2019.0
     1
                       0.05667
                                            23.41
                                                             158.80
                                                                          1956.0
     2
                                            25.53
                        0.05999
                                                             152.50
                                                                          1709.0
     3
                        0.09744
                                             26.50
                                                              98.87
                                                                           567.7
     4
                        0.05883
                                             16.67
                                                             152.20
                                                                          1575.0
        worst smoothness
                          worst compactness
                                             worst concavity worst concave points
     0
                  0.1622
                                      0.6656
                                                        0.7119
                                                                               0.2654
     1
                  0.1238
                                      0.1866
                                                        0.2416
                                                                               0.1860
     2
                  0.1444
                                      0.4245
                                                        0.4504
                                                                               0.2430
                  0.2098
                                                        0.6869
     3
                                      0.8663
                                                                               0.2575
```

0.4000

0.1625

0.2050

4

0.1374

```
0
                                           0.11890
                                                    0
                 0.4601
     1
                 0.2750
                                           0.08902
                                                    0
     2
                 0.3613
                                           0.08758
                                                    0
     3
                 0.6638
                                          0.17300
                                                    0
                 0.2364
                                                    0
                                          0.07678
     [5 rows x 31 columns]
[]: #
     data.describe()
            mean radius
                          mean texture
                                         mean perimeter
                                                             mean area
     count
             569.000000
                            569.000000
                                              569.000000
                                                            569.000000
     mean
              14.127292
                              19.289649
                                               91.969033
                                                            654.889104
     std
                3.524049
                                               24.298981
                                                            351.914129
                               4.301036
     min
                6.981000
                               9.710000
                                               43.790000
                                                            143.500000
     25%
              11.700000
                              16.170000
                                               75.170000
                                                            420.300000
     50%
              13.370000
                              18.840000
                                               86.240000
                                                            551.100000
     75%
              15.780000
                              21.800000
                                              104.100000
                                                            782.700000
              28.110000
                              39.280000
                                              188.500000
                                                           2501.000000
     max
            mean smoothness
                               mean compactness
                                                                   mean concave points
                                                  mean concavity
                  569.000000
                                     569.000000
                                                      569.000000
                                                                             569.000000
     count
     mean
                    0.096360
                                       0.104341
                                                         0.088799
                                                                               0.048919
                                       0.052813
     std
                    0.014064
                                                         0.079720
                                                                               0.038803
     min
                    0.052630
                                       0.019380
                                                         0.000000
                                                                               0.000000
     25%
                    0.086370
                                       0.064920
                                                         0.029560
                                                                               0.020310
     50%
                    0.095870
                                       0.092630
                                                         0.061540
                                                                               0.033500
     75%
                    0.105300
                                       0.130400
                                                         0.130700
                                                                               0.074000
                    0.163400
                                       0.345400
                                                         0.426800
                                                                               0.201200
     max
            mean symmetry
                            mean fractal dimension
                                                         worst texture
                569.000000
                                         569.000000
                                                             569.000000
     count
     mean
                  0.181162
                                            0.062798
                                                              25.677223
                  0.027414
                                            0.007060
                                                               6.146258
     std
                                            0.049960
                                                              12.020000
     min
                  0.106000
     25%
                  0.161900
                                            0.057700
                                                              21.080000
     50%
                                            0.061540
                  0.179200
                                                              25.410000
     75%
                  0.195700
                                            0.066120
                                                              29.720000
                  0.304000
                                            0.097440
                                                              49.540000
     max
            worst perimeter
                                worst area
                                             worst smoothness
                                                                worst compactness
                                569.000000
                  569.000000
                                                   569.000000
                                                                        569.000000
     count
     mean
                  107.261213
                                880.583128
                                                     0.132369
                                                                          0.254265
     std
                   33.602542
                                569.356993
                                                     0.022832
                                                                          0.157336
```

worst fractal dimension

worst symmetry

[]:

min

Y

0.071170

0.027290

185.200000

50.410000

```
50%
                  97.660000
                               686.500000
                                                   0.131300
                                                                       0.211900
     75%
                 125.400000
                             1084.000000
                                                   0.146000
                                                                       0.339100
                 251.200000
                             4254.000000
                                                   0.222600
                                                                       1.058000
     max
            worst concavity
                             worst concave points worst symmetry \
                 569.000000
                                        569.000000
                                                        569.000000
     count
    mean
                   0.272188
                                          0.114606
                                                           0.290076
     std
                   0.208624
                                          0.065732
                                                           0.061867
    min
                   0.000000
                                          0.000000
                                                           0.156500
     25%
                   0.114500
                                          0.064930
                                                           0.250400
     50%
                   0.226700
                                          0.099930
                                                           0.282200
     75%
                   0.382900
                                          0.161400
                                                           0.317900
    max
                   1.252000
                                          0.291000
                                                           0.663800
                                               Y
            worst fractal dimension
                         569.000000
                                     569.000000
     count
                                        0.627417
     mean
                            0.083946
     std
                            0.018061
                                        0.483918
    min
                            0.055040
                                        0.000000
     25%
                           0.071460
                                        0.000000
     50%
                           0.080040
                                        1.000000
     75%
                           0.092080
                                        1.000000
                           0.207500
                                        1.000000
    max
     [8 rows x 31 columns]
[ ]: # DataFrame
     X_ALL = data.drop('Y', axis=1)
[]: #
     def arr_to_df(arr_scaled):
         res = pd.DataFrame(arr_scaled, columns=X_ALL.columns)
         return res
[]: #
     X train, X_test, y_train, y_test = train_test_split(X ALL, data['Y'],
                                                           test_size=0.2,
                                                           random_state=1)
                    DataFrame
     X_train_df = arr_to_df(X_train)
     X_test_df = arr_to_df(X_test)
     X_train_df.shape, X_test_df.shape
[]: ((455, 30), (114, 30))
```

25%

84.110000

515.300000

0.116600

0.147200

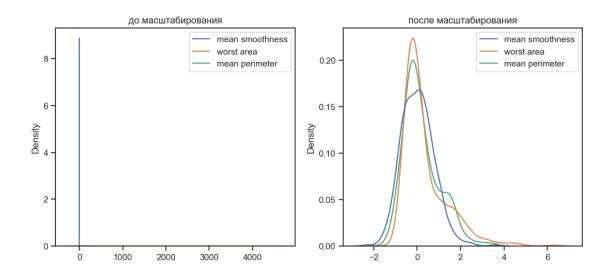
```
1.5
```

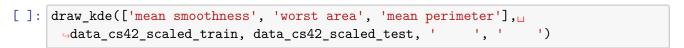
```
[]: cs41 = RobustScaler()
     data_cs41_scaled_temp = cs41.fit_transform(X_ALL)
             DataFrame
     data_cs41_scaled = arr_to_df(data_cs41_scaled_temp)
     data_cs41_scaled.describe()
[]:
            mean radius
                          mean texture
                                         mean perimeter
                                                                       mean smoothness
                                                           mean area
             569.000000
                            569.000000
                                             569.000000
                                                                            569.000000
     count
                                                          569.000000
               0.185611
                                                            0.286394
     mean
                              0.079867
                                               0.198031
                                                                              0.025900
     std
               0.863737
                              0.763950
                                               0.839923
                                                            0.971065
                                                                              0.742954
     min
              -1.565931
                             -1.621670
                                              -1.467335
                                                           -1.124724
                                                                             -2.284205
     25%
              -0.409314
                             -0.474245
                                              -0.382648
                                                           -0.360927
                                                                             -0.501849
     50%
               0.000000
                              0.000000
                                               0.000000
                                                            0.000000
                                                                              0.000000
     75%
                0.590686
                              0.525755
                                               0.617352
                                                            0.639073
                                                                              0.498151
                3.612745
                              3.630551
                                               3.534739
                                                            5.380519
                                                                              3.567353
     max
            mean compactness
                               mean concavity
                                                mean concave points
                                                                       mean symmetry
     count
                  569.000000
                                    569.000000
                                                          569.000000
                                                                          569.000000
     mean
                     0.178848
                                      0.269521
                                                            0.287188
                                                                            0.058043
                     0.806548
                                      0.788212
                                                                            0.811073
     std
                                                            0.722720
     min
                    -1.118662
                                     -0.608464
                                                           -0.623952
                                                                           -2.165680
     25%
                    -0.423183
                                     -0.316195
                                                           -0.245670
                                                                           -0.511834
     50%
                     0.000000
                                      0.00000
                                                            0.000000
                                                                            0.000000
     75%
                     0.576817
                                      0.683805
                                                            0.754330
                                                                            0.488166
                     3.860263
                                      3.611430
                                                            3.123487
                                                                            3.692308
     max
            mean fractal dimension
                                         worst radius
                                                        worst texture
                         569.000000
                                                           569.000000
     count
                                           569.000000
                           0.149360
                                             0.224773
                                                             0.030929
     mean
     std
                           0.838523
                                             0.836201
                                                             0.711372
     min
                          -1.375297
                                            -1.217993
                                                            -1.549769
     25%
                          -0.456057
                                            -0.339100
                                                            -0.501157
     50%
                           0.00000
                                             0.000000
                                                             0.00000
     75%
                           0.543943
                                             0.660900
                                                             0.498843
                           4.263658
                                             3.645329
                                                             2.792824
     max
            worst perimeter
                              worst area
                                           worst smoothness
                                                              worst compactness
                  569.000000
                              569.000000
                                                  569.000000
                                                                      569.000000
     count
                                0.341275
     mean
                    0.232531
                                                    0.036347
                                                                        0.220766
     std
                    0.813818
                                1.001155
                                                    0.776613
                                                                        0.819888
     min
                   -1.144345
                               -0.881484
                                                   -2.045238
                                                                       -0.962011
     25%
                   -0.328167
                               -0.301037
                                                   -0.500000
                                                                       -0.337155
     50%
                                                                        0.000000
                   0.000000
                                0.000000
                                                    0.000000
     75%
                    0.671833
                                0.698963
                                                    0.500000
                                                                        0.662845
                   3.718576
                                6.273079
                                                    3.105442
                                                                        4.409067
     max
```

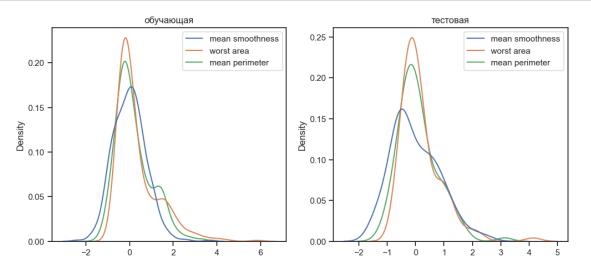
```
569.000000
                 569.000000
                                        569.000000
     count
     mean
                   0.169480
                                          0.152133
                                                           0.116675
     std
                   0.777289
                                          0.681376
                                                           0.916555
                  -0.844635
    min
                                         -1.035866
                                                         -1.862222
     25%
                  -0.418033
                                         -0.362807
                                                         -0.471111
     50%
                   0.000000
                                                          0.00000
                                          0.000000
     75%
                   0.581967
                                          0.637193
                                                          0.528889
                   3.820045
                                          1.980616
                                                          5.653333
    max
            worst fractal dimension
                         569.000000
     count
    mean
                           0.189419
     std
                           0.875910
    min
                          -1.212415
     25%
                          -0.416101
     50%
                           0.000000
     75%
                           0.583899
     max
                           6.181377
     [8 rows x 30 columns]
[]: cs42 = RobustScaler()
     cs42.fit(X_train)
     data_cs42_scaled_train_temp = cs42.transform(X_train)
     data_cs42_scaled_test_temp = cs42.transform(X_test)
             DataFrame
     data_cs42_scaled_train = arr_to_df(data_cs42_scaled_train_temp)
     data_cs42_scaled_test = arr_to_df(data_cs42_scaled_test_temp)
[]: #
     def draw_kde(col_list, df1, df2, label1, label2):
         fig, (ax1, ax2) = plt.subplots(
             ncols=2, figsize=(12, 5))
         ax1.set_title(label1)
         sns.kdeplot(data=df1[col_list], ax=ax1)
         ax2.set_title(label2)
         sns.kdeplot(data=df2[col_list], ax=ax2)
         plt.show()
[]: draw_kde(['mean smoothness', 'worst area', 'mean perimeter'], data,__

data_cs41_scaled, '
```

worst concavity worst concave points worst symmetry







```
1.6
5-23, 5-23 - " (boxplot)".
```

```
[]: sns.boxplot(data=data, x="mean smoothness")
```

[]: <Axes: xlabel='mean smoothness'>

