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Кафедра «Системы обработки информации и управления» Курс «Технологии машинного обучения»

Отчет по лабораторной работе №1 Разведочный анализ данных. Исследование и визуализация данных

Группа: ИУ5-62Б

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Преподаватель: Гапанюк Ю.Е.

Цель лабораторной работы: изучение различных методов визуализация данных.

Описание задания

Выбрать набор данных (датасет).

Создать ноутбук, который содержит следующие разделы:

- 1. Текстовое описание выбранного набора данных.
- 2. Основные характеристики датасета.
- 3. Визуальное исследование датасета.
- 4. Информация о корреляции признаков.

Текст программы и примеры выполнения

```
import numpy as np
import pandas as pd
import seaborn as sns
import matplotlib.pyplot as plt
%matplotlib inline
sns.set(style="ticks")
from sklearn.datasets import *
sklearn data = load breast cancer()
# Возможные значения целевого признака
sklearn data['target names']
 Out[3]: array(['malignant', 'benign'], dtype='<U9')
data = pd.DataFrame(data=np.c_[sklearn_data['data'],
       sklearn data['target']],
       columns=np.append(sklearn_data['feature_names'], ['target']))
# Первые 5 строк датасета
data.head()
                                                 mean
                                                               mean
   mean
        mean
               mean
                    mean
                            mean
                                     mean
                                           mean
                                                        mean
                                                                       worst
                                                                             worst worst
                                                                                          worst
                                                               fractal ... texture perimeter
                                               concave
   radius texture perimeter
                    area smoothness compactness concavity
                                                                                   area smoothness co
                                                 points symmetry dimension
 0 17.99 10.38 122.80 1001.0
                           0.11840
                                   0.27760
                                           0.3001 0.14710
                                                      0.2419
                                                             0.07871 ... 17.33
                                                                             184.60 2019.0
                                                                                          0.1622
 1 20.57 17.77 132.90 1326.0
                                                              0.05667 ...
                                                                       23.41
                           0.08474
                                   0.07864
                                           0.0869
                                                0.07017
                                                        0.1812
                                                                             158.80 1956.0
                                                                                          0.1238
 2 19.69 21.25 130.00 1203.0 0.10960
                                                       0.2069
                                                              0.05999 ...
                                   0.15990
                                          0.1974 0.12790
                                                                       25.53
                                                                             152.50 1709.0
                                                                                          0.1444
 3 11.42 20.38 77.58 386.1
                           0.14250
                                   0.28390
                                           0.2414 0.10520
                                                        0.2597
                                                              0.09744 ...
                                                                       26.50
                                                                             98.87 567.7
                                                                                          0.2098
 4 20.29 14.34 135.10 1297.0
                           0.10030
                                   0.13280
                                          0.1980 0.10430
                                                              0.05883 ...
                                                                       16.67
                                                                                          0.1374
                                                        0.1809
                                                                             152.20 1575.0
5 rows × 31 columns
# Размер датасета - 569 строк, 31 колонка
data.shape
Out[6]: (569, 31)
# Список колонок
```

data.columns

Список колонок с типами данных data.dtypes

```
Out[8]: mean radius
                                    float64
        mean texture
                                    float64
                                   float64
float64
        mean perimeter
        mean area
                                   float64
        mean smoothness
                                   float64
        mean compactness
        mean concavity float64
mean concave points float64
mean symmetry float64
        mean symmetry
        mean fractal dimension float64
                                    float64
        radius error
        texture error
                                    float64
                                   float64
        perimeter error
                                   float64
        area error
                                 float64
float64
float64
        smoothness error
        compactness error
        concavity error
        concave points error float64
        symmetry error float64
fractal dimension error float64
worst radius float64
                                   float64
        worst texture
                                 float64
        worst perimeter
                                    float64
        worst area
                                   float64
        worst smoothness
                                   float64
        worst compactness
                                    float64
        worst concavity
        worst concave points
                                     float64
        worst symmetry
                                     float64
        worst fractal dimension float64
        target
                                    float64
        dtype: object
```

Наличие пустых значений data.isnull().sum()

```
Out[9]: mean radius
       mean texture
       mean perimeter
       mean area
       mean smoothness
                               0
       mean compactness
                               0
       mean concavity
                               0
       mean concave points
       mean symmetry
       mean fractal dimension 0
       radius error
                               0
                               0
       texture error
       perimeter error
       area error
                               0
       smoothness error
       compactness error
       concavity error
       concave points error 0
       symmetry error
                               0
       fractal dimension error 0
       worst radius
                                0
       worst texture
                               0
       worst perimeter
                               0
       worst area
       worst smoothness
       worst compactness
       worst concavity
                               0
       worst concave points
       worst symmetry
                                0
       worst fractal dimension
       dtype: int64
```

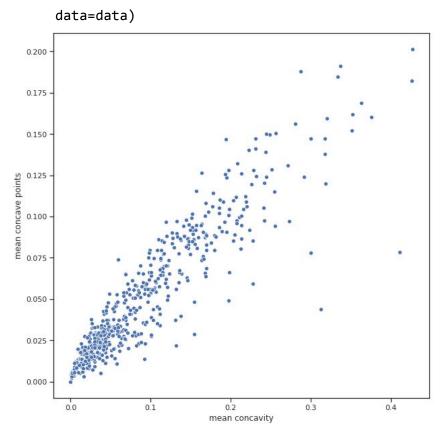
Основные статистические характеристики набора data.describe()

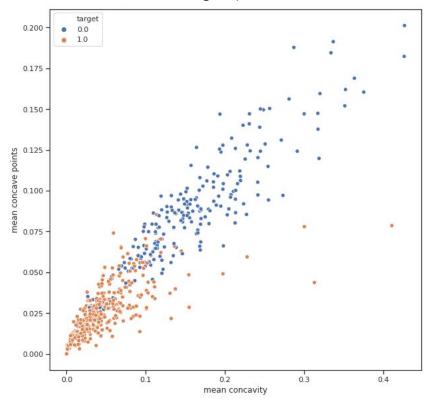
	mean radius	mean texture	mean perimeter	mean area	mean smoothness	mean compactness	mean concavity	concave points	mean symmetry	fractal dimension		worst texture	perir
count	569.000000	569.000000	569.000000	569.000000	569.000000	569.000000	569.000000	569.000000	569.000000	569.000000	***	569.000000	569.00
mean	14.127292	19.289649	91.969033	654.889104	0.096360	0.104341	0.088799	0.048919	0.181162	0.062798		25.677223	107.26
std	3.524049	4.301036	24.298981	351.914129	0.014064	0.052813	0.079720	0.038803	0.027414	0.007060		6.146258	33.60
min	6.981000	9.710000	43.790000	143.500000	0.052630	0.019380	0.000000	0.000000	0.106000	0.049960		12.020000	50.41
25%	11.700000	16.170000	75.170000	420.300000	0.086370	0.064920	0.029560	0.020310	0.161900	0.057700	***	21.080000	84.11
50%	13.370000	18.840000	86.240000	551.100000	0.095870	0.092630	0.061540	0.033500	0.179200	0.061540		25.410000	97.66
75%	15.780000	21.800000	104.100000	782.700000	0.105300	0.130400	0.130700	0.074000	0.195700	0.066120		29.720000	125.40
max	28.110000	39.280000	188.500000	2501.000000	0.163400	0.345400	0.426800	0.201200	0.304000	0.097440		49.540000	251.20

Уникальные значения для целевого признака data['target'].unique()

```
Out[11]: array([0., 1.])
```

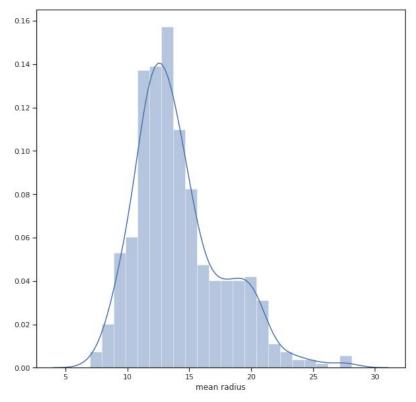
Зависимость количества вогнутых частей контура от вогнутости fig, ax = plt.subplots(figsize=(10,10)) sns.scatterplot(ax=ax, x='mean concavity', y='mean concave points',



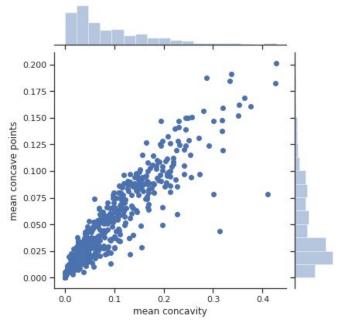


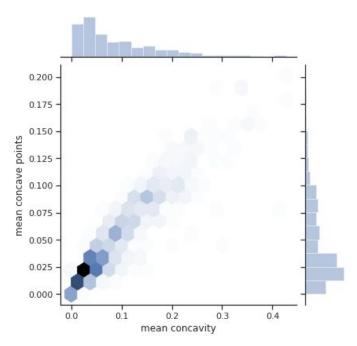
Распределение среднего значения радиуса

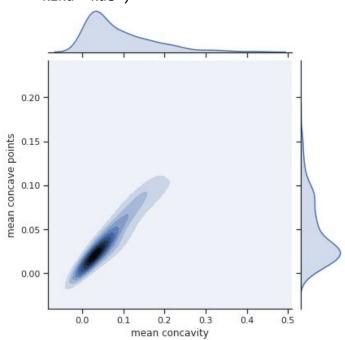
fig, ax = plt.subplots(figsize=(10,10))
sns.distplot(data['mean radius'])

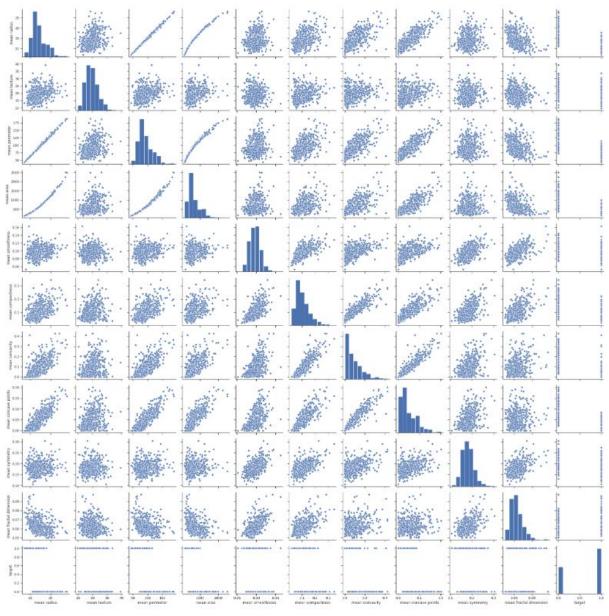


sns.jointplot(x='mean concavity', y='mean concave points', data=data)

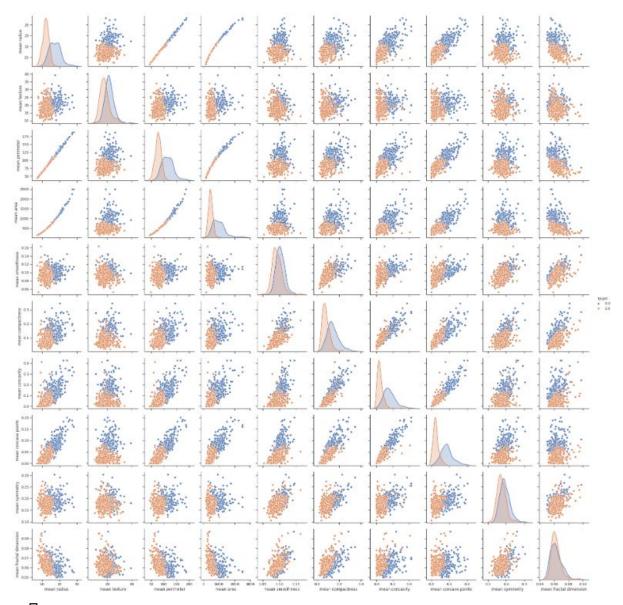




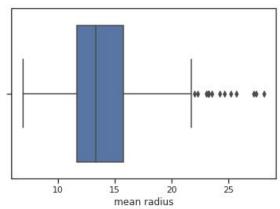




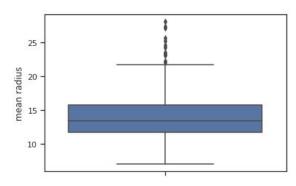
sns.pairplot(data1, hue='target')



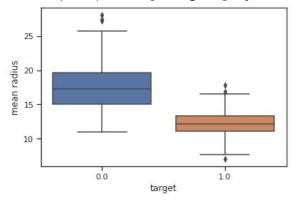
По горизонтали sns.boxplot(x=data['mean radius'])



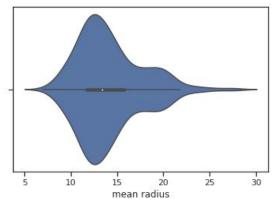
По вертикали sns.boxplot(y=data['mean radius'])



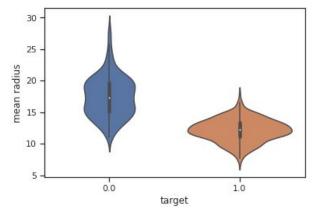
Распределение параметра mean radius, сгруппированное по target sns.boxplot(x=data['target'], y=data['mean radius'])



sns.violinplot(x=data['mean radius'])



Распределение параметра mean radius сгруппированные по target. sns.violinplot(x='target', y='mean radius', data=data)



data.corr(method='pearson')

	mean radius	mean texture	mean perimeter	mean area	mean smoothness	mean compactness	mean concavity	concave points	mean symmetry	fractal dimension		worst texture	perimete
mean radius	1.000000	0.323782	0.997855	0.987357	0.170581	0.506124	0.676764	0.822529	0.147741	-0.311631		0.297008	0.965137
mean texture	0.323782	1.000000	0.329533	0.321086	-0.023389	0.236702	0.302418	0.293464	0.071401	-0.076437	33	0.912045	0.358040
mean perimeter	0.997855	0.329533	1.000000	0.986507	0.207278	0.556936	0.716136	0.850977	0.183027	-0.261477		0.303038	0.97038
mean area	0.987357	0.321086	0.986507	1.000000	0.177028	0.498502	0.685983	0.823269	0.151293	-0.283110	-	0.287489	0.95912
mean smoothness	0.170581	-0.023389	0.207278	0.177028	1.000000	0.659123	0.521984	0.553695	0.557775	0.584792		0.036072	0.23885
mean compactness	0.506124	0.236702	0.556936	0.498502	0.659123	1.000000	0.883121	0.831135	0.602641	0.565369	10	0.248133	0.59021
mean concavity	0.676764	0.302418	0.716136	0.685983	0.521984	0.883121	1.000000	0.921391	0.500667	0.336783		0.299879	0.72956
mean concave points	0.822529	0.293464	0.850977	0.823269	0.553695	0.831135	0.921391	1.000000	0.462497	0.166917		0.292752	0.85592
mean symmetry	0.147741	0.071401	0.183027	0.151293	0.557775	0.602641	0.500667	0.462497	1.000000	0.479921		0.090651	0.21916
mean fractal dimension	-0.311631	-0.076437	-0.261477	-0.283110	0.584792	0.565369	0.336783	0.166917	0.479921	1.000000	170	-0.051269	-0.20515
radius error	0.679090	0.275869	0.691765	0.732562	0.301467	0.497473	0.631925	0.698050	0.303379	0.000111		0.194799	0.71968
texture error	-0.097317	0.386358	-0.086761	-0.066280	0.068406	0.046205	0.076218	0.021480	0.128053	0.164174	:::	0.409003	-0.10224
perimeter error	0.674172	0.281673	0.693135	0.726628	0.296092	0.548905	0.660391	0.710650	0.313893	0.039830	**	0.200371	0.72103
area error	0.735864	0.259845	0.744983	0.800086	0.246552	0.455653	0.617427	0.690299	0.223970	-0.090170	775	0.196497	0.76121
smoothness error	-0.222600	0.006614	-0.202694	-0.166777	0.332375	0.135299	0.098564	0.027653	0.187321	0.401964		-0.074743	-0.21730
ompactness error	0.206000	0.191975	0.250744	0.212583	0.318943	0.738722	0.670279	0.490424	0.421659	0.559837	***	0.143003	0.26051
concavity error	0.194204	0.143293	0.228082	0.207660	0.248396	0.570517	0.691270	0.439167	0.342627	0.446630		0.100241	0.22668
concave points error	0.376169	0.163851	0.407217	0.372320	0.380676	0.642262	0.683260	0.615634	0.393298	0.341198	***	0.086741	0.39499
symmetry error	-0.104321	0.009127	-0.081629	-0.072497	0.200774	0.229977	0.178009	0.095351	0.449137	0.345007	12	-0.077473	-0.10375
fractal dimension error	-0.042641	0.054458	-0.005523	-0.019887	0.283607	0.507318	0.449301	0.257584	0.331786	0.688132	777	-0.003195	-0.00100
worst radius	0.969539	0.352573	0.969476	0.962746	0.213120	0.535315	0.688236	0.830318	0.185728	-0.253691		0.359921	0.99370
worst texture	0.297008	0.912045	0.303038	0.287489	0.036072	0.248133	0.299879	0.292752	0.090651	-0.051269	11	1.000000	0.36509
worst perimeter	0.965137	0.358040	0.970387	0.959120	0.238853	0.590210	0.729565	0.855923	0.219169	-0.205151		0.365098	1.00000
worst area	0.941082	0.343546	0.941550	0.959213	0.206718	0.509604	0.675987	0.809630	0.177193	-0.231854	-	0.345842	0.97757
worst smoothness	0.119616	0.077503	0.150549	0.123523	0.805324	0.565541	0.448822	0.452753	0.426675	0.504942		0.225429	0.23677
worst ompactness	0.413463	0.277830	0.455774	0.390410	0.472468	0.865809	0.754968	0.667454	0.473200	0.458798	100	0.360832	0.52940
worst concavity	0.526911	0.301025	0.563879	0.512606	0.434926	0.816275	0.884103	0.752399	0.433721	0.346234		0.368366	0.61834
worst concave points	0.744214	0.295316	0.771241	0.722017	0.503053	0.815573	0.861323	0.910155	0.430297	0.175325		0.359755	0.81632
worst symmetry	0.163953	0.105008	0.189115	0.143570	0.394309	0.510223	0.409464	0.375744	0.699826	0.334019	111	0.233027	0.26949
worst fractal dimension	0.007066	0.119205	0.051019	0.003738	0.499316	0.687382	0.514930	0.368661	0.438413	0.767297	120	0.219122	0.13895
target	-0.730029	-0.415185	-0.742636	-0.708984	-0.358560	-0.596534	-0.696360	-0.776614	-0.330499	0.012838		-0.456903	-0.78291

data.corr(method='kendall')

	mean radius	mean texture	mean perimeter	mean area	mean smoothness	mean compactness	mean concavity	concave points	mean symmetry	fractal dimension	***	worst texture	worst perimeter
mean radius	1.000000	0.229159	0.963320	0.985565	0.099549	0.340020	0.465087	0.566917	0.081502	-0.246220	***	0.210302	0.862763
mean texture	0.229159	1.000000	0.234353	0.230829	0.017135	0.184220	0.236079	0.209629	0.075493	-0.039255		0.741293	0.254406
mean perimeter	0.963320	0.234353	1.000000	0.956965	0.122434	0.375540	0.497587	0.596716	0.101781	-0.214661		0.216032	0.881245
mean area	0.985565	0.230829	0.956965	1.000000	0.092541	0.333534	0.461843	0.561760	0.076963	-0.252131		0.212051	0.863409
mean smoothness	0.099549	0.017135	0.122434	0.092541	1.000000	0.491072	0.364105	0.398511	0.381515	0.417070		0.041361	0.152343
mean compactness	0.340020	0.184220	0.375540	0.333534	0.491072	1.000000	0.719194	0.653022	0.392366	0.345923		0.174449	0.412628
mean concavity	0.465087	0.236079	0.497587	0.461843	0.364105	0.719194	1.000000	0.775266	0.311354	0.173476	***	0.227797	0.531750
mean concave points	0.566917	0.209629	0.596716	0.561760	0.398511	0.653022	0.775266	1.000000	0.291970	0.094885		0.200509	0.620728
mean symmetry	0.081502	0.075493	0.101781	0.076963	0.381515	0.392366	0.311354	0.291970	1.000000	0.297681		0.081521	0.129378
mean fractal dimension	-0.246220	-0.039255	-0.214661	-0.252131	0.417070	0.345923	0.173476	0.094885	0.297681	1.000000		-0.031406	-0.174835
radius error	0.384712	0.247098	0.393716	0.387101	0.223561	0.351001	0.405383	0.454104	0.225514	0.002996		0.191005	0.425010
texture error	-0.095861	0.309294	-0.091170	-0.094179	0.061806	0.032274	0.035346	0.005238	0.095181	0.105633		0.348027	-0.094206
perimeter error	0.398999	0.264142	0.414246	0.400951	0.220743	0.409292	0.459626	0.490678	0.237409	0.038443		0.205631	0.455179
area error	0.549079	0.270659	0.557127	0.552309	0.196414	0.372483	0.460080	0.532389	0.191490	-0.081134	•••	0.221482	0.585220
smoothness error	-0.226065	0.024484	-0.215165	-0.226658	0.230123	0.084992	0.048788	0.012047	0.136064	0.276804		-0.024264	-0.211233
compactness error	0.181153	0.180535	0.211562	0.177378	0.274218	0.619218	0.559088	0.427162	0.307858	0.333806	***	0.142983	0.237664
concavity error	0.255945	0.197820	0.283680	0.254040	0.247024	0.570663	0.678378	0.497183	0.256674	0.232522		0.158908	0.305778
concave points error	0.286742	0.162570	0.310856	0.283280	0.305479	0.537138	0.581517	0.568956	0.263132	0.196318		0.105170	0.316127
symmetry error	-0.168407	0.007114	-0.158856	-0.169859	0.101045	0.066251	0.015244	-0.019819	0.262925	0.214262	***	-0.070404	-0.171452
dimension error	-0.005832	0.099663	0.021156	-0.008733	0.286167	0.437206	0.351399	0.254332	0.281801	0.498389		0.055635	0.042561
worst radius	0.882063	0.246993	0.886941	0.883811	0.136219	0.372046	0.492914	0.590400	0.111969	-0.208569	***	0.250127	0.939026
worst texture	0.210302	0.741293	0.216032	0.212051	0.041361	0.174449	0.227797	0.200509	0.081521	-0.031406		1.000000	0.257984
worst perimeter	0.862763	0.254406	0.881245	0.863409	0.152343	0.412628	0.531750	0.620728	0.129378	-0.174835	***	0.257984	1.000000
worst area	0.882035	0.248096	0.885246	0.885906	0.128881	0.363980	0.488281	0.583169	0.104677	-0.215901	•••	0.251341	0.931692
worst smoothness	0.082284	0.069336	0.102428	0.077793	0.608475	0.412274	0.338902	0.339906	0.291003	0.348018	***	0.148002	0.158814
worst compactness	0.332970	0.199777	0.365026	0.328257	0.335814	0.724842	0.654070	0.557303	0.308333	0.274333		0.234597	0.426479
worst concavity	0.421100	0.235242	0.449549	0.418822	0.300847	0.647942	0.787870	0.635728	0.275028	0.162783	***	0.266734	0.507132
worst concave points	0.532569	0.217743	0.559819	0.528375	0.349195	0.633090	0.734047	0.783933	0.276077	0.092549		0.247731	0.615378
worst symmetry	0.114141	0.081482	0.130283	0.112032	0.270602	0.312991	0.263490	0.240447	0.520061	0.204803		0.154258	0.186325
worst fractal dimension	0.024103	0.078289	0.053103	0.020265	0.357792	0.498231	0.377455	0.285028	0.281841	0.566543		0.130159	0.113309
target	-0.599082	-0.377644	-0.611775	-0.599992	-0.304033	-0.497971	-0.599449	-0.635873	-0.271924	0.021173	***	-0.389654	-0.650879

31 rows × 31 columns

data.corr(method='spearman')

	mean radius	mean texture	mean perimeter	mean area	mean smoothness	mean compactness	mean concavity	concave	mean symmetry	fractal dimension		worst texture	worst perimeter
mean radius	1.000000	0.340956	0.997802	0.999602	0.148510	0.497578	0.645728	0.759702	0.120242	-0.349931		0.314911	0.971555
mean texture	0.340956	1.000000	0.348142	0.344145	0.024649	0.266499	0.342646	0.306891	0.110130	-0.059303	-	0.909218	0.375273
mean perimeter	0.997802	0.348142	1.000000	0.997068	0.182923	0.543925	0.681958	0.788629	0.150049	-0.304891		0.323109	0.978980
mean area	0.999602	0.344145	0.997068	1.000000	0.138053	0.488988	0.642557	0.755165	0.113928	-0.358425		0.318178	0.971822
mean smoothness	0.148510	0.024649	0.182923	0.138053	1.000000	0.678806	0.518511	0.565172	0.542228	0.588465	***	0.060645	0.226345
mean compactness	0.497578	0.266499	0.543925	0.488988	0.678806	1.000000	0.896518	0.848295	0.552203	0.499195	2.22	0.255305	0.592254
mean concavity	0.645728	0.342646	0.681958	0.642557	0.518511	0.896518	1.000000	0.927352	0.446793	0.258174	***	0.335866	0.722424
mean concave points	0.759702	0.306891	0.788629	0.755165	0.565172	0.848295	0.927352	1.000000	0.423767	0.142659	515	0.300562	0.813960
mean symmetry	0.120242	0.110130	0.150049	0.113928	0.542228	0.552203	0.446793	0.423767	1.000000	0.428467		0.118890	0.190526
mean fractal dimension	-0.349931	-0.059303	-0.304891	-0.358425	0.588465	0.499195	0.258174	0.142659	0.428467	1.000000	20	-0.047791	-0.247456
radius error	0.550247	0.363621	0.560326	0.553388	0.334282	0.506582	0.575277	0.635054	0.337912	0.001477		0.283581	0.592509
texture error	-0.144499	0.450720	-0.137578	-0.142469	0.091283	0.047766	0.051318	0.008710	0.139124	0.157103	777	0.496551	-0.142855
perimeter error	0.565520	0.386813	0.582789	0.568237	0.331360	0.583520	0.646199	0.679841	0.354888	0.055309	2.2	0.302553	0.626896
area error	0.738077	0.395139	0.745824	0.741518	0.296059	0.539511	0.644344	0.726982	0.288322	-0.120333	33	0.327857	0.768336
smoothness error	-0.326385	0.037048	-0.311147	-0.327431	0.338692	0.127381	0.070321	0.016798	0.206106	0.401530	111	-0.036290	-0.308749
compactness error	0.264904	0.263591	0.308620	0.260362	0.392455	0.817875	0.761230	0.608388	0.435714	0.481139	77	0.209979	0.344865
concavity error	0.364555	0.287188	0.402277	0.362308	0.354730	0.772283	0.858306	0.674668	0.367637	0.344007	111	0.235945	0.432895
concave points error	0.410576	0.238610	0.441996	0.406468	0.438826	0.732425	0.774656	0.758438	0.382736	0.286393	***	0.157304	0.448363
symmetry error	-0.241376	0.008945	-0.228187	-0.243507	0.150740	0.098388	0.022753	-0.028353	0.384123	0.314165		-0.104702	-0.246712
fractal dimension error	-0.008411	0.147605	0.032429	-0.012688	0.413429	0.621121	0.513593	0.378374	0.402630	0.683800	<u></u>	0.083174	0.063012
worst radius	0.978604	0.366547	0.981244	0.979258	0.203453	0.542626	0.682316	0.787411	0.164552	-0.294540	***	0.371230	0.993548
worst texture	0.314911	0.909218	0.323109	0.318178	0.060645	0.255305	0.335866	0.300562	0.118890	-0.047791	210	1.000000	0.381022
worst perimeter	0.971555	0.375273	0.978980	0.971822	0.226345	0.592254	0.722424	0.813960	0.190526	-0.247456		0.381022	1.000000
worst area	0.978863	0.368335	0.980864	0.980264	0.191735	0.531590	0.676628	0.780395	0.154462	-0.304927	-	0.372376	0.992433
worst smoothness	0.125789	0.101401	0.156611	0.119712	0.796085	0.578902	0.488775	0.490035	0.424230	0.493474	***	0.217799	0.241172
worst compactness	0.491357	0.290917	0.534565	0.485813	0.481384	0.901029	0.849985	0.758309	0.440828	0.403653	212	0.342319	0.613070
worst concavity	0.596043	0.339725	0.632106	0.593736	0.429107	0.837921	0.938543	0.827281	0.394481	0.242611	***	0.387009	0.700572
worst concave points	0.727265	0.319235	0.757526	0.723390	0.498868	0.825473	0.904938	0.937075	0.397477	0.139152	***	0.365309	0.812983
worst symmetry	0.174698	0.120693	0.199007	0.170860	0.393579	0.450333	0.383667	0.355477	0.710359	0.295046		0.226816	0.281383
worst fractal dimension	0.044564	0.116144	0.088961	0.038758	0.511457	0.688986	0.541838	0.421110	0.410069	0.760771	333	0.193191	0.179003
	-0.732785	-0.461971	-0.748496	-0.734122	-0.371892	-0.609288	-0.733308	-0.777877	-0.332567	0.025903		-0.476720	-0.796319

31 rows × 31 columns

sns.heatmap(data.corr())

