

## Wczytanie danych

```
In [1]: import pandas as pd
df = pd.read_csv("IHME_HEALTH_SPENDING_1995_2018_Y2021M09D22.CSV", encoding='latin-1', e
df.head()
```

```
Out[1]:
```

	location_id	location_name	iso3	level	year	the_total_mean	the_total_lower	the_total_upper	the_total_ppp
0	160	Afghanistan	AFG	Country	1995	528409	417121	665425	2
1	160	Afghanistan	AFG	Country	1996	516915	412035	651034	2
2	160	Afghanistan	AFG	Country	1997	509874	413424	636436	2
3	160	Afghanistan	AFG	Country	1998	485561	394629	605041	2
4	160	Afghanistan	AFG	Country	1999	463720	382723	564170	1

5 rows × 84 columns

## Załadowanie matplotlib

```
In [2]: import matplotlib.pyplot as plt
```

## Podgląd danych

```
In [3]: df["location_name"].unique()
```

```
Out[3]: array(['Afghanistan', 'Albania', 'Algeria', 'American Samoa', 'Andorra',
'Angola', 'Antigua and Barbuda', 'Argentina', 'Armenia',
'Australia', 'Austria', 'Azerbaijan', 'Bahamas', 'Bahrain',
'Bangladesh', 'Barbados', 'Belarus', 'Belgium', 'Belize', 'Benin',
'Bermuda', 'Bhutan', 'Bolivia (Plurinational State of)',
'Bosnia and Herzegovina', 'Botswana', 'Brazil',
'Brunei Darussalam', 'Bulgaria', 'Burkina Faso', 'Burundi',
'Cabo Verde', 'Cambodia', 'Cameroon', 'Canada',
'Central African Republic', 'Chad', 'Chile', 'China', 'Colombia',
'Comoros', 'Congo', 'Cook Islands', 'Costa Rica', 'Croatia',
'Cuba', 'Cyprus', 'Czechia', 'Côte d'Ivoire',
'Democratic People's Republic of Korea',
'Democratic Republic of the Congo', 'Denmark', 'Djibouti',
'Dominica', 'Dominican Republic', 'Ecuador', 'Egypt',
'El Salvador', 'Equatorial Guinea', 'Eritrea', 'Estonia',
'Eswatini', 'Ethiopia', 'Fiji', 'Finland', 'France', 'Gabon',
'Gambia', 'Georgia', 'Germany', 'Ghana', 'Greece', 'Greenland',
'Grenada', 'Guam', 'Guatemala', 'Guinea', 'Guinea-Bissau',
'Guyana', 'Haiti', 'Honduras', 'Hungary', 'Iceland', 'India',
'Indonesia', 'Iran (Islamic Republic of)', 'Iraq', 'Ireland',
'Israel', 'Italy', 'Jamaica', 'Japan', 'Jordan', 'Kazakhstan',
'Kenya', 'Kiribati', 'Kuwait', 'Kyrgyzstan',
'Lao People's Democratic Republic', 'Latvia', 'Lebanon', 'Lesotho',
'Liberia', 'Libya', 'Lithuania', 'Luxembourg', 'Madagascar',
'Malawi', 'Malaysia', 'Maldives', 'Mali', 'Malta',
'Marshall Islands', 'Mauritania', 'Mauritius', 'Mexico',
'Micronesia (Federated States of)', 'Monaco', 'Mongolia',
'Montenegro', 'Morocco', 'Mozambique', 'Myanmar', 'Namibia',
'Nauru', 'Nepal', 'Netherlands', 'New Zealand', 'Nicaragua',
'Niger', 'Nigeria', 'Niue', 'North Macedonia',
'Northern Mariana Islands', 'Norway', 'Oman', 'Pakistan', 'Palau',
'Palestine', 'Panama', 'Papua New Guinea', 'Paraguay', 'Peru',
'Philippines', 'Poland', 'Portugal', 'Puerto Rico', 'Qatar',
```

```
'Republic of Korea', 'Republic of Moldova', 'Romania',
'Russian Federation', 'Rwanda', 'Saint Kitts and Nevis',
'Saint Lucia', 'Saint Vincent and the Grenadines', 'Samoa',
'San Marino', 'Sao Tome and Principe', 'Saudi Arabia', 'Senegal',
'Serbia', 'Seychelles', 'Sierra Leone', 'Singapore', 'Slovakia',
'Slovenia', 'Solomon Islands', 'Somalia', 'South Africa',
'South Sudan', 'Spain', 'Sri Lanka', 'Sudan', 'Suriname', 'Sweden',
'Switzerland', 'Syrian Arab Republic',
'Taiwan (Province of China)', 'Tajikistan', 'Thailand',
'Timor-Leste', 'Togo', 'Tokelau', 'Tonga', 'Trinidad and Tobago',
'Tunisia', 'Turkey', 'Turkmenistan', 'Tuvalu', 'Uganda', 'Ukraine',
'United Arab Emirates', 'United Kingdom',
'United Republic of Tanzania', 'United States Virgin Islands',
'United States of America', 'Uruguay', 'Uzbekistan', 'Vanuatu',
'Venezuela (Bolivarian Republic of)', 'Viet Nam', 'Yemen',
'Zambia', 'Zimbabwe', 'Global', 'High income', 'Low income',
'Lower-middle income', 'Upper-middle income',
'Central Europe, Eastern Europe, and Central Asia', 'High-income',
'Latin America and Caribbean', 'North Africa and Middle East',
'South Asia', 'Southeast Asia, East Asia, and Oceania',
'Sub-Saharan Africa']], dtype=object)
```

```
In [149]: d1 = df[df["location_name"] == "Sierra Leone"]
          d1[["year", "the_total_mean"]]
```

```
Out[149]:
```

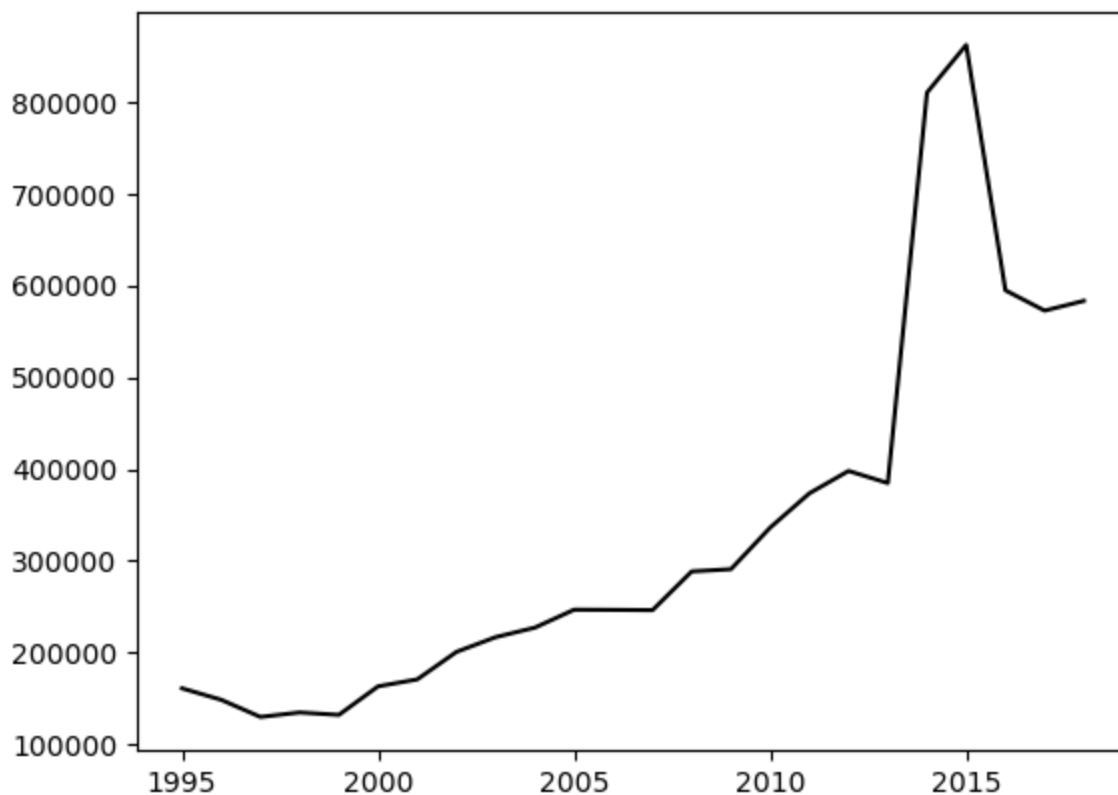
	year	the_total_mean
<b>3888</b>	1995	161382
<b>3889</b>	1996	148878
<b>3890</b>	1997	130216
<b>3891</b>	1998	135092
<b>3892</b>	1999	132452
<b>3893</b>	2000	163519
<b>3894</b>	2001	171104
<b>3895</b>	2002	201043
<b>3896</b>	2003	217092
<b>3897</b>	2004	227436
<b>3898</b>	2005	246956
<b>3899</b>	2006	246768
<b>3900</b>	2007	246467
<b>3901</b>	2008	288623
<b>3902</b>	2009	291038
<b>3903</b>	2010	336302
<b>3904</b>	2011	373600
<b>3905</b>	2012	397972
<b>3906</b>	2013	384762
<b>3907</b>	2014	809772
<b>3908</b>	2015	861612
<b>3909</b>	2016	594553

3910	2017	572442
3911	2018	583077

Wykres - średnia wydawanych pieniędzy na służbę zdrowia w danym roku w Sierra Leone (x, y, styl linii)

```
In [150]: plt.plot(h["year"], dl["the_total_mean"], 'k-')
```

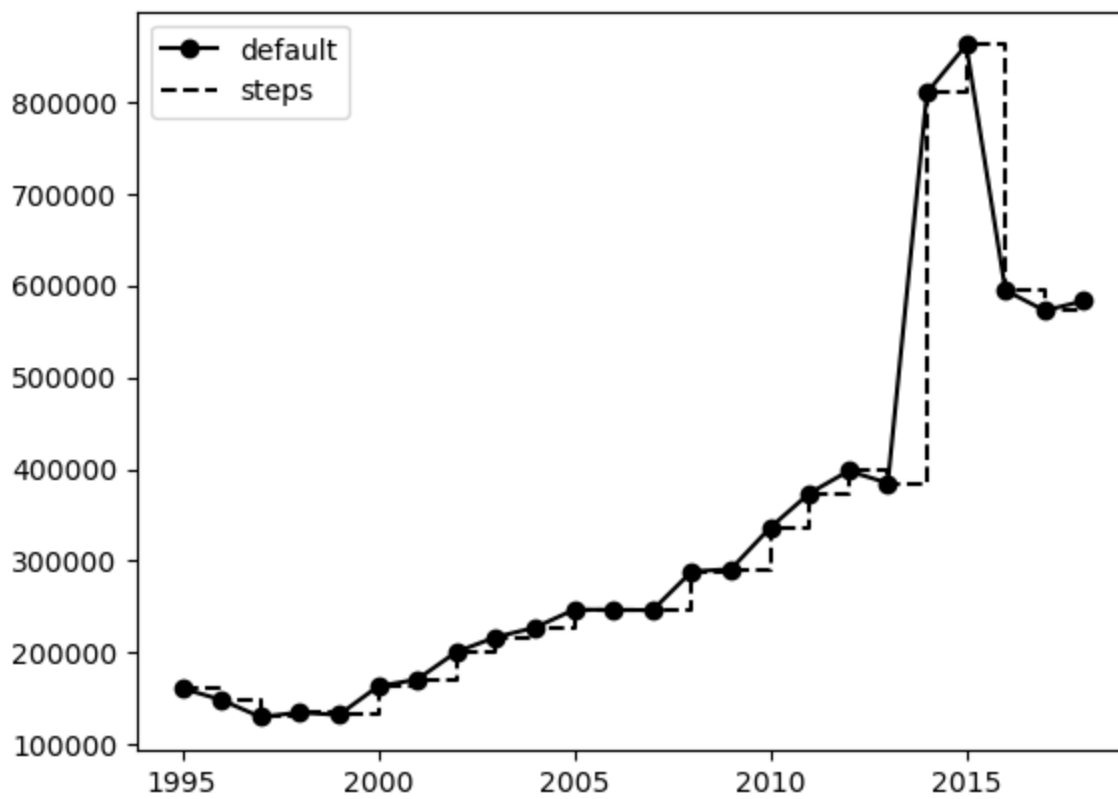
```
Out[150]: [<matplotlib.lines.Line2D at 0x16495431790>]
```



Różne style rysowania

```
In [151]: plt.plot(dl["year"], dl["the_total_mean"], 'ko-', label="default")
plt.plot(dl["year"], dl["the_total_mean"], 'k--', drawstyle='steps-post', label="steps")
plt.legend()
```

```
Out[151]: <matplotlib.legend.Legend at 0x16495973e80>
```



Grupy wykresów

(rozmiar x, rozmiar y, identyfikator)

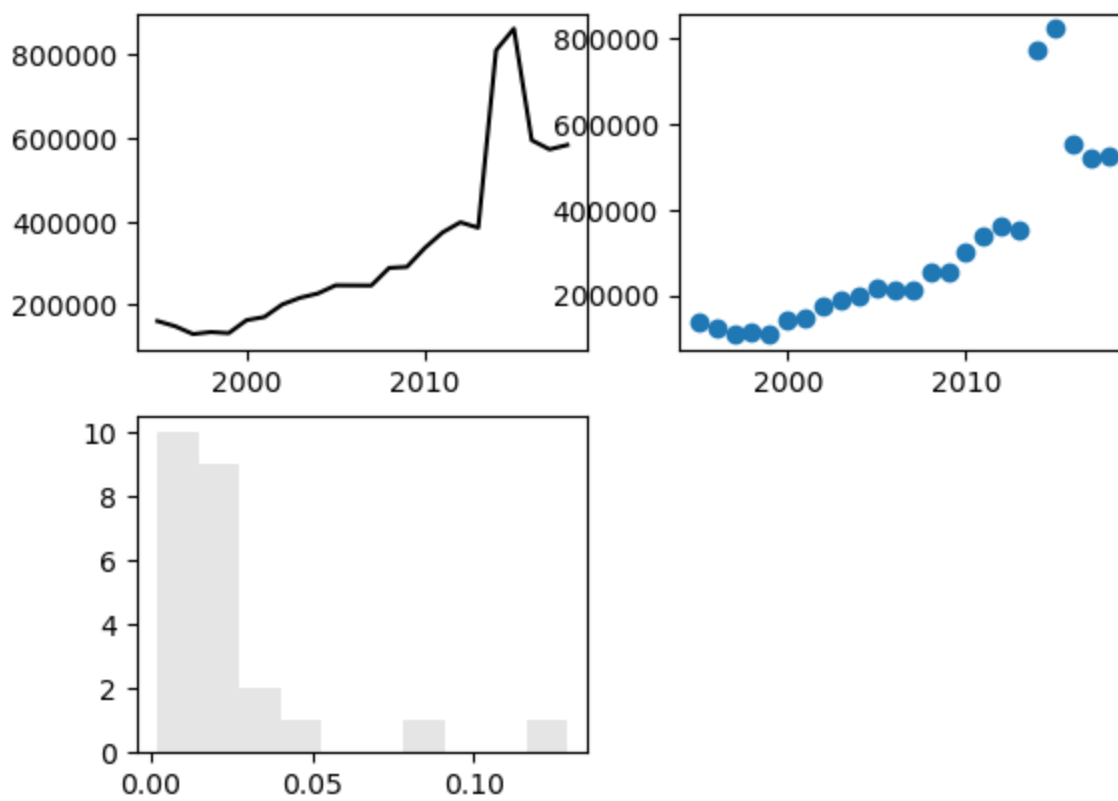
```
In [153]: fig = plt.figure()

ax1 = fig.add_subplot(2,2,1)
ax1.plot(d1["year"], d1["the_total_mean"], 'k-')

ax2 = fig.add_subplot(2,2,2)
ax2.scatter(d1["year"], d1["the_total_lower"])

ax3 = fig.add_subplot(2,2,3)
ax3.hist(d1["dah_per_gdp_lower"], bins = 10, color = 'k', alpha=0.1)
#bins = ilość "pól" na wykresie

Out[153]: (array([10.,  9.,  2.,  1.,  0.,  0.,  1.,  0.,  0.,  1.]),
 array([0.002 , 0.0147, 0.0274, 0.0401, 0.0528, 0.0655, 0.0782, 0.0909,
        0.1036, 0.1163, 0.129 ]),
 <BarContainer object of 10 artists>)
```



Legenda i etykiety osi

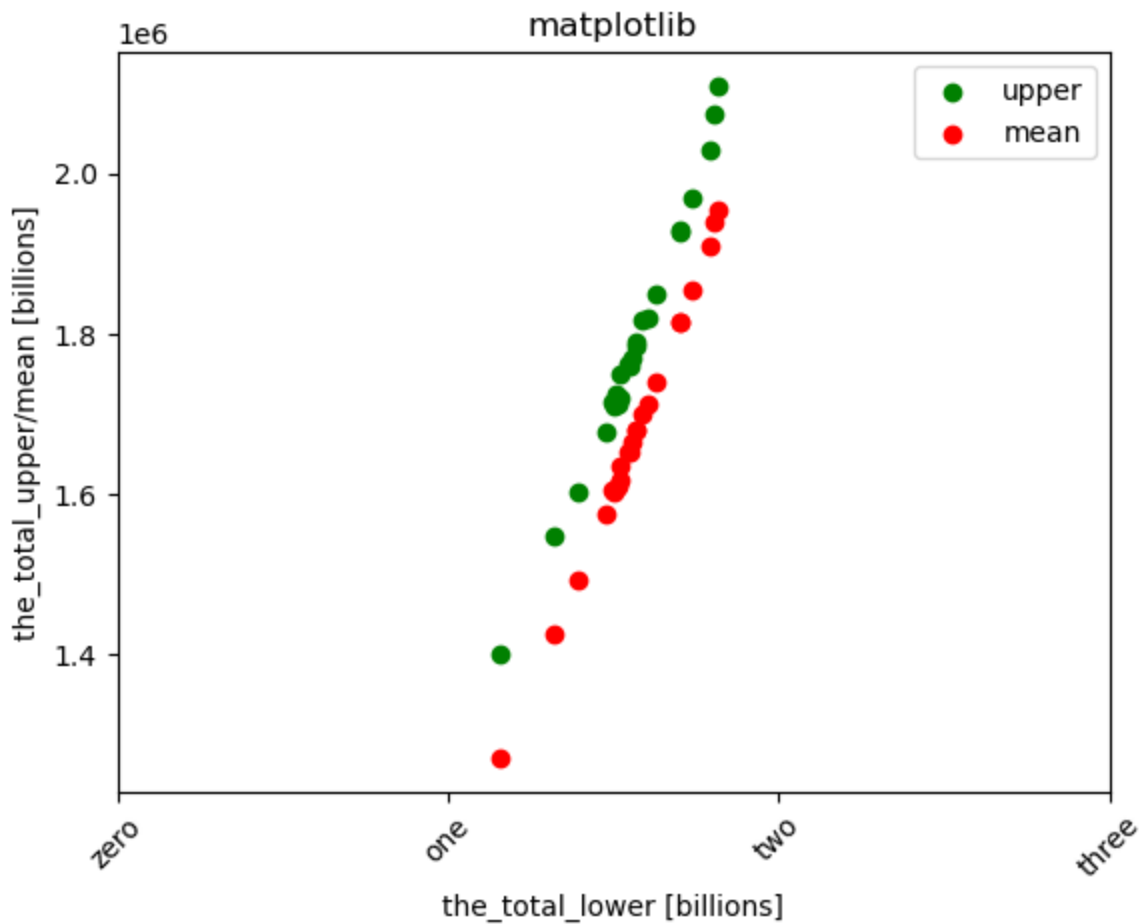
In [154...

```
d2 = df[df["location_name"] == "El Salvador"]

fig = plt.figure()
ax = fig.add_subplot(1, 1, 1)

ax.scatter(d2["the_total_lower"], d2["the_total_upper"], color='g', label="upper")
ax.scatter(d2["the_total_lower"], d2["the_total_mean"], color='r', label="mean")
ax.set_xticks([0, 1000000, 2000000, 3000000])
ax.set_xticklabels(['zero', 'one', 'two', 'three'], rotation=45, fontsize='medium')
ax.set_title('matplotlib')
ax.set_xlabel('the_total_lower [billions]')
ax.set_ylabel('the_total_upper/mean [billions]')
ax.legend(loc='best')

plt.savefig('figure.png', dpi=400, bbox_inches='tight')
```



Zapis do pliku

(ścieżka, dpi, ucinanie białych fragmentów wokół obrazu)

Zapis musi być wykonany przed wyświetleniem, inaczej obraz będzie pusty - (wyświetlenie czyści wykres)

```
In [9]: plt.savefig('figure.png', dpi=400, bbox_inches='tight')
```

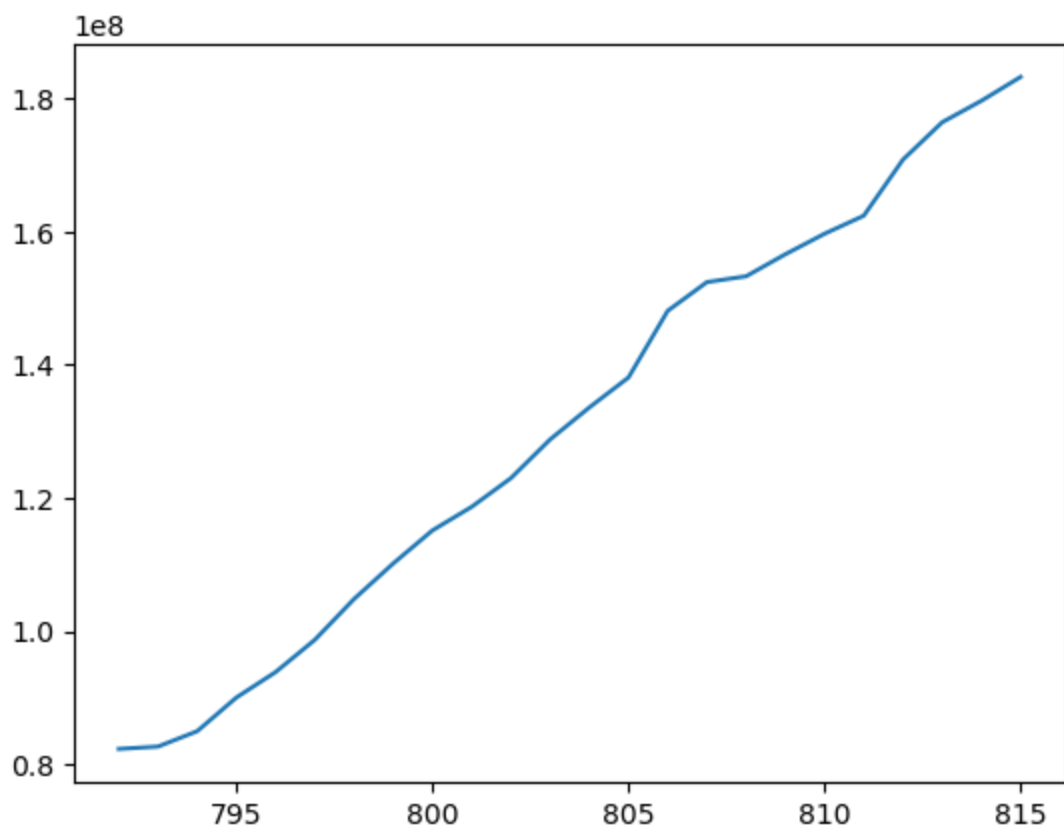
<Figure size 640x480 with 0 Axes>

Wykresy pandas

```
In [155]: d3 = df[df["location_name"] == "Canada"]

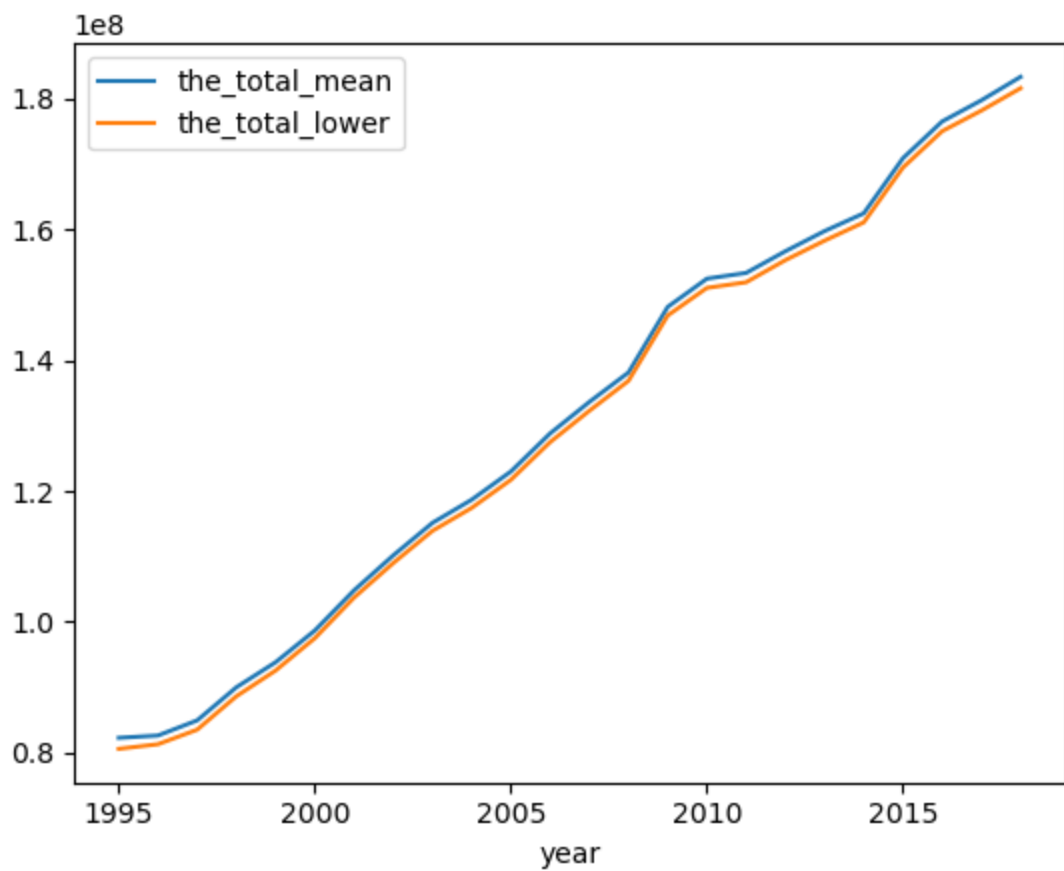
figure = pd.Series(d3["the_total_mean"])
figure.plot()
```

Out[155]: <AxesSubplot:>



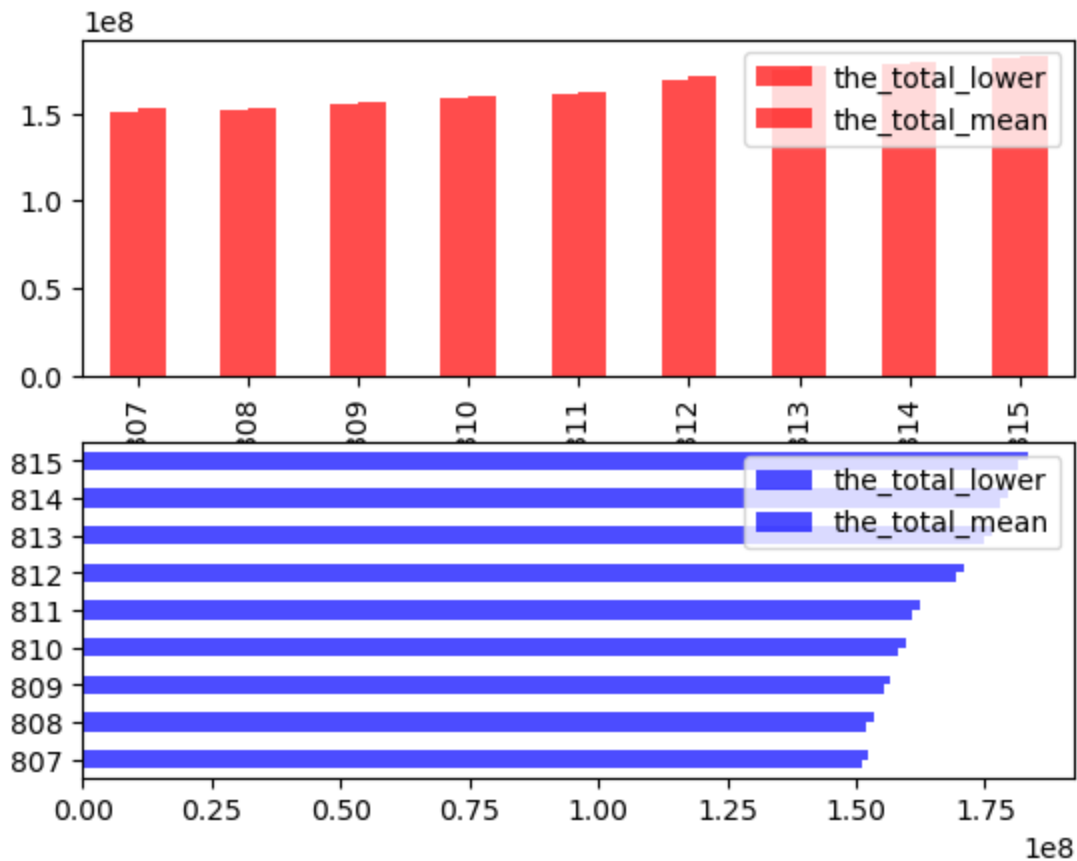
```
In [161]: d4 = d3[["the_total_mean", "the_total_lower", "year"]]
figure = d4
figure.plot(x = "year")
```

Out[161]: <AxesSubplot:xlabel='year'>



```
In [162... fig, axes = plt.subplots(2, 1)
d5 = d4[d4["year"] > 2009]
d5 = d5[["the_total_lower", "the_total_mean"]]
data = d5
data.plot.bar(ax=axes[0], color='r', alpha=0.7) #rysowanie w pionie
data.plot.barh(ax=axes[1], color='b', alpha=0.7) #rysowanie w poziomie
```

Out[162]: <AxesSubplot:>



```
In [165... d6 = df[df["year"] > 2015]
d6 = d6[["the_total_upper", "the_total_ppp_lower"]]
d6 = d6.head(10)
d6
```

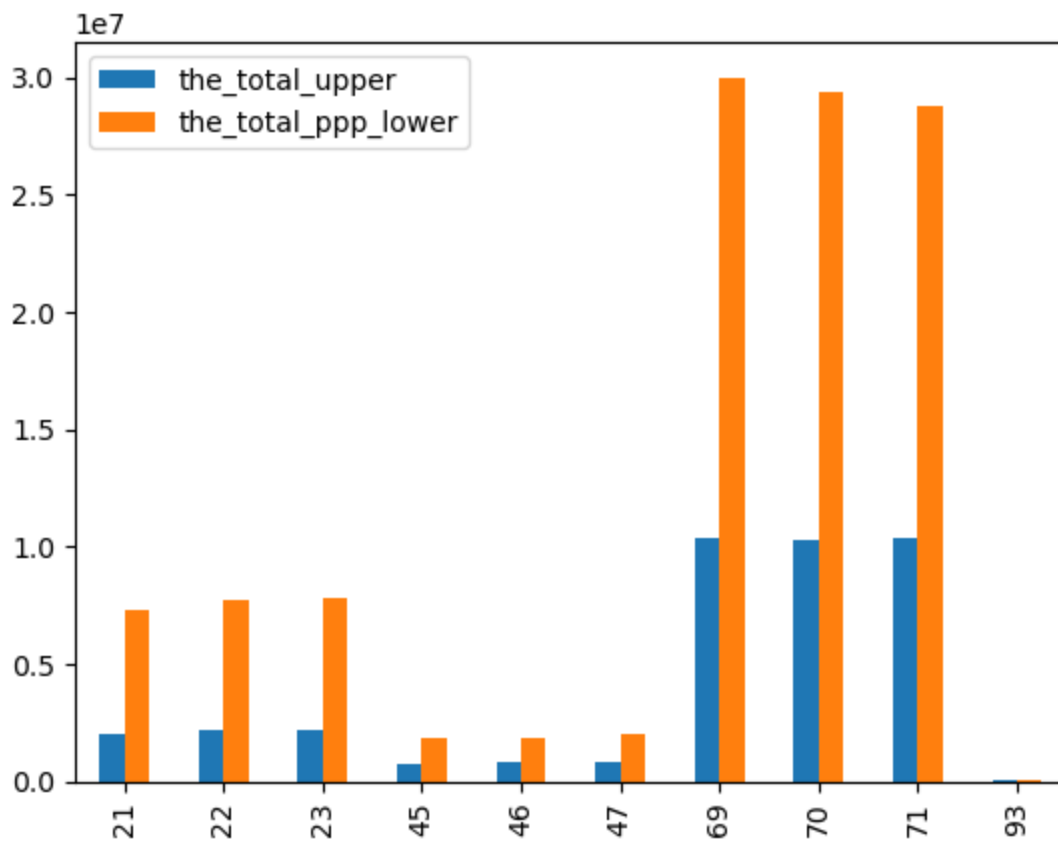
Out[165]:

	the_total_upper	the_total_ppp_lower
21	2028013	7253099
22	2142606	7709396
23	2207902	7779658
45	738868	1795580
46	779525	1872224
47	838110	1990826
69	10365602	30006433
70	10242469	29389584
71	10379786	28755496
93	36712	27535

```
In [166... d6.plot.bar()
```

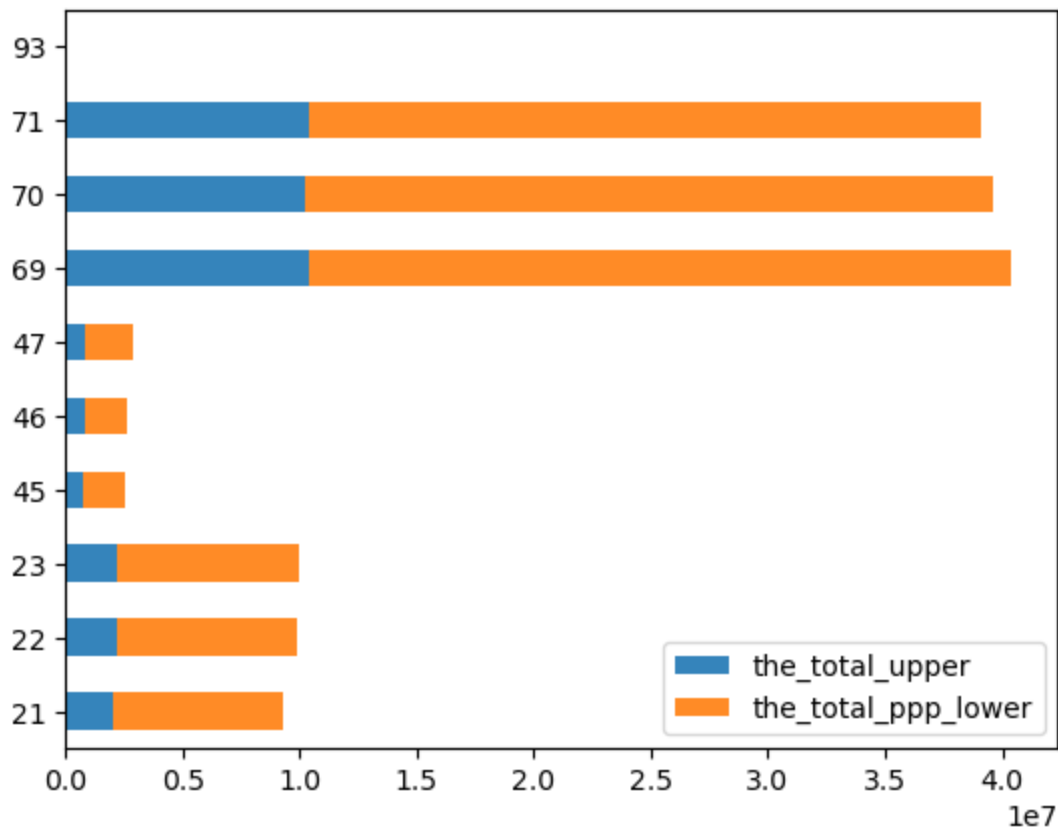


Out[166]: <AxesSubplot:>



In [167]: d6.plot.barh(stacked=True, alpha=0.9)

Out[167]: <AxesSubplot:>



Seaborn

In [177]: import seaborn as sbn

```
In [178... d7 = df
d7 = d7[d7["year"] > 2006]
d7
```

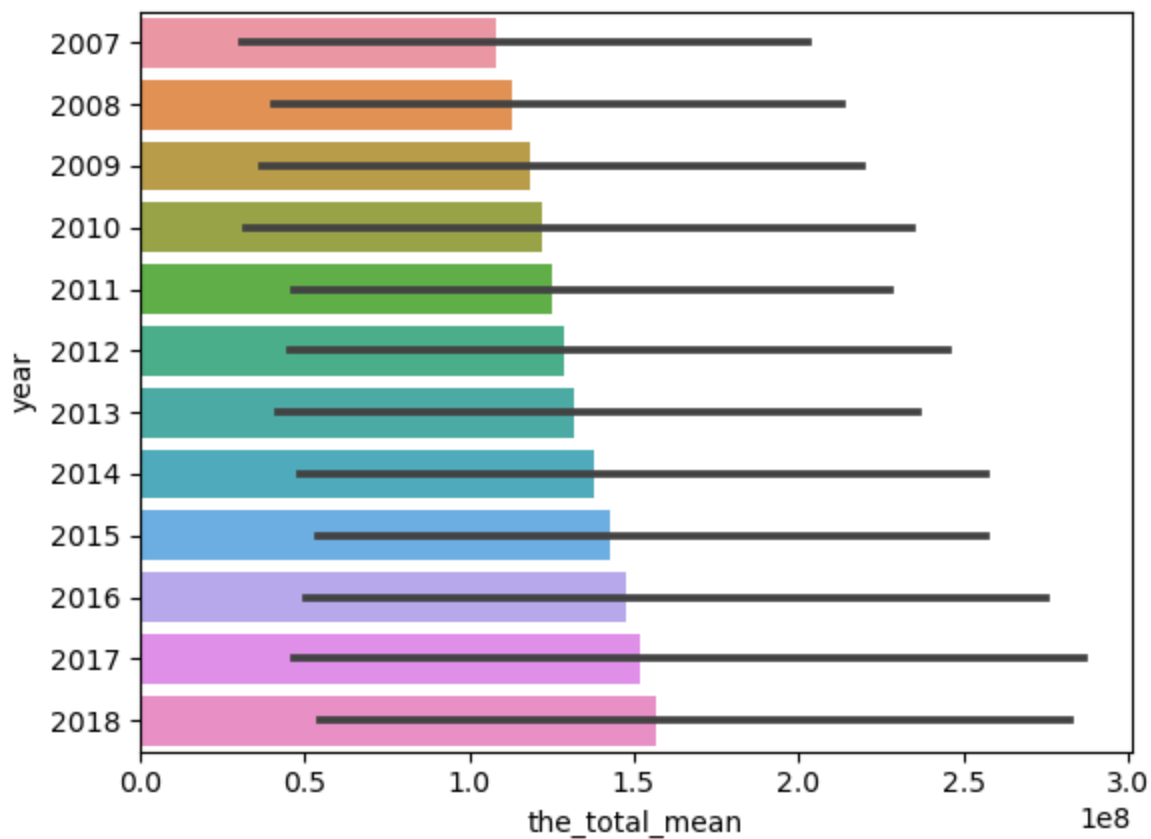
Out[178]:

	location_id	location_name	iso3	level	year	the_total_mean	the_total_lower	the_total_upper	the_total
12	160	Afghanistan	AFG	Country	2007	1040372	956086	1141413	
13	160	Afghanistan	AFG	Country	2008	1066858	982415	1161963	
14	160	Afghanistan	AFG	Country	2009	1236730	1149054	1337448	
15	160	Afghanistan	AFG	Country	2010	1262196	1166456	1364153	
16	160	Afghanistan	AFG	Country	2011	1373092	1273961	1482720	
...	...	...	...	...	...	...	...	...	...
5227	166	Sub-Saharan Africa	S3	GBD Super Regions	2014	71349683	69713253	73018691	
5228	166	Sub-Saharan Africa	S3	GBD Super Regions	2015	73465621	71828527	75186691	
5229	166	Sub-Saharan Africa	S3	GBD Super Regions	2016	73972108	72267558	75733371	
5230	166	Sub-Saharan Africa	S3	GBD Super Regions	2017	77406545	75367505	79506397	
5231	166	Sub-Saharan Africa	S3	GBD Super Regions	2018	78994327	76466329	81632889	

2616 rows × 84 columns

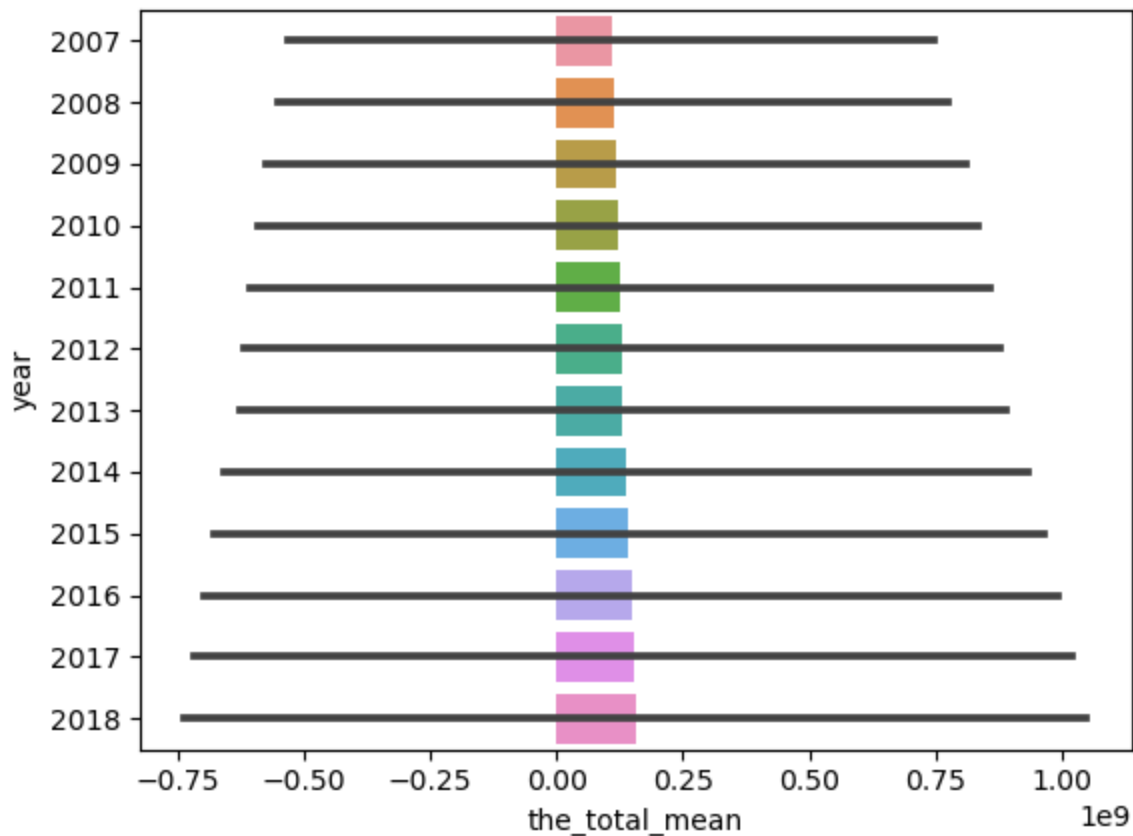
```
In [179... sbn.barplot(x='the_total_mean', y='year', data=d7, orient='h')
#automatycznie wyświetla przedział ufności
```

Out[179]: <AxesSubplot:xlabel='the\_total\_mean', ylabel='year'>



```
In [180]: sbn.barplot(x='the_total_mean', y='year', data=d7, orient='h', ci='sd')
#wersja z std dev
```

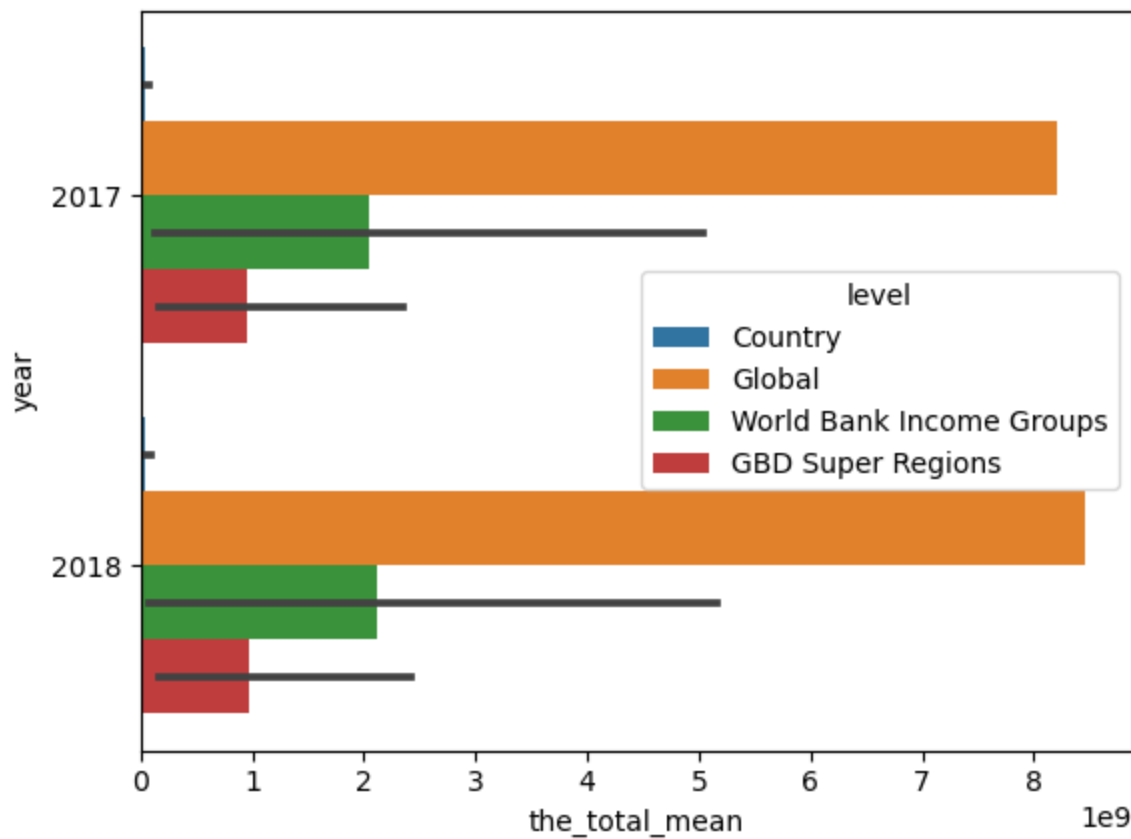
```
Out[180]: <AxesSubplot:xlabel='the_total_mean', ylabel='year'>
```



Dodanie nowej wartości katerycznej hue

```
In [182]: d7 = d7[d7["year"] > 2016]
sbn.barplot(x='the_total_mean', y='year', hue='level', data=d7, orient='h')
```

Out[182]: <AxesSubplot:xlabel='the\_total\_mean', ylabel='year'>



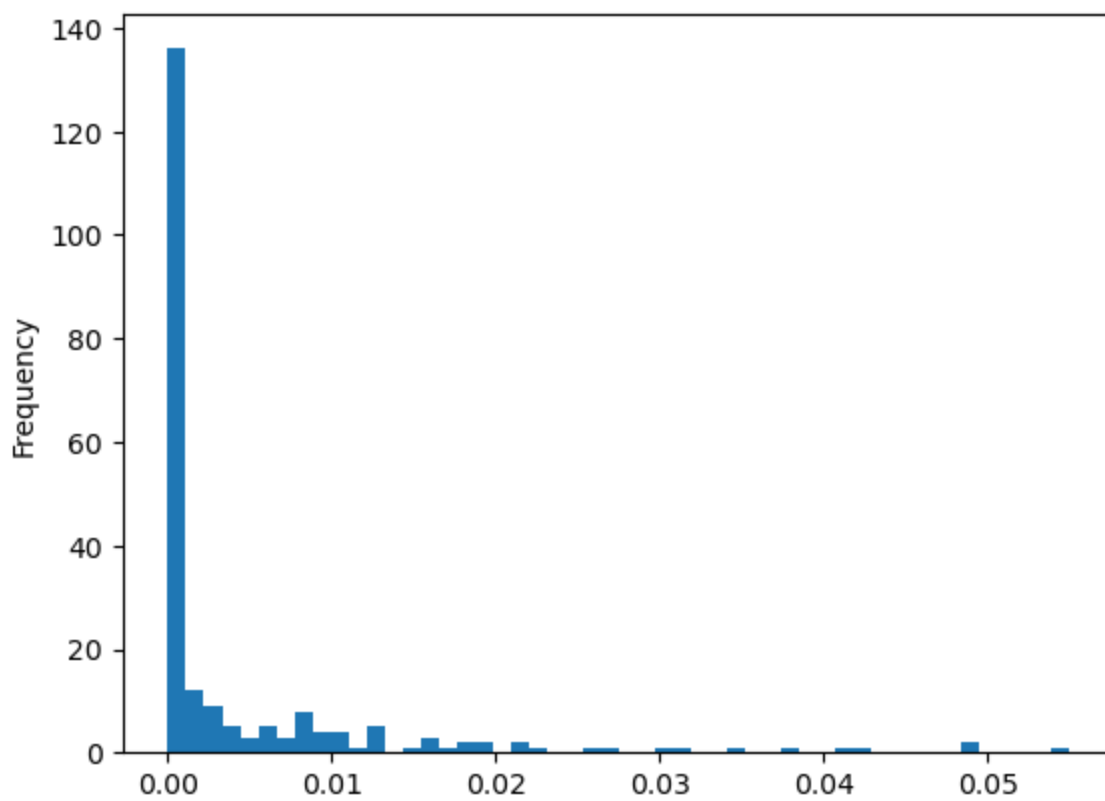
### Histogram

```
In [183... d8 = df[df["year"] > 2017]
d8 = d8["dah_per_gdp_mean"]
d8
```

```
Out[183]: 23      0.013
47      0.001
71      0.000
95      0.000
119     0.000
...
5135    0.000
5182    0.001
5183    0.001
5207    0.000
5231    0.006
Name: dah_per_gdp_mean, Length: 218, dtype: float64
```

```
In [184... d8.plot.hist(bins=50)
```

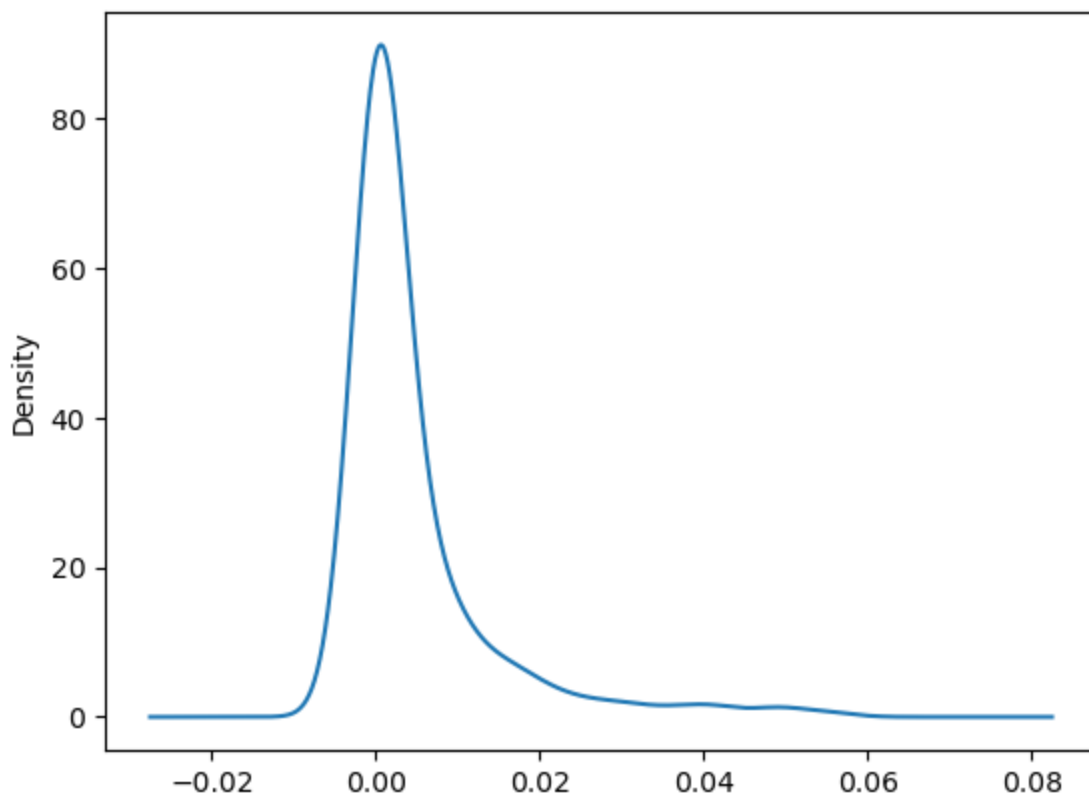
```
Out[184]: <AxesSubplot:ylabel='Frequency'>
```



Wykres gęstości - wykres prawdopodobieństwa obserwowanych danych

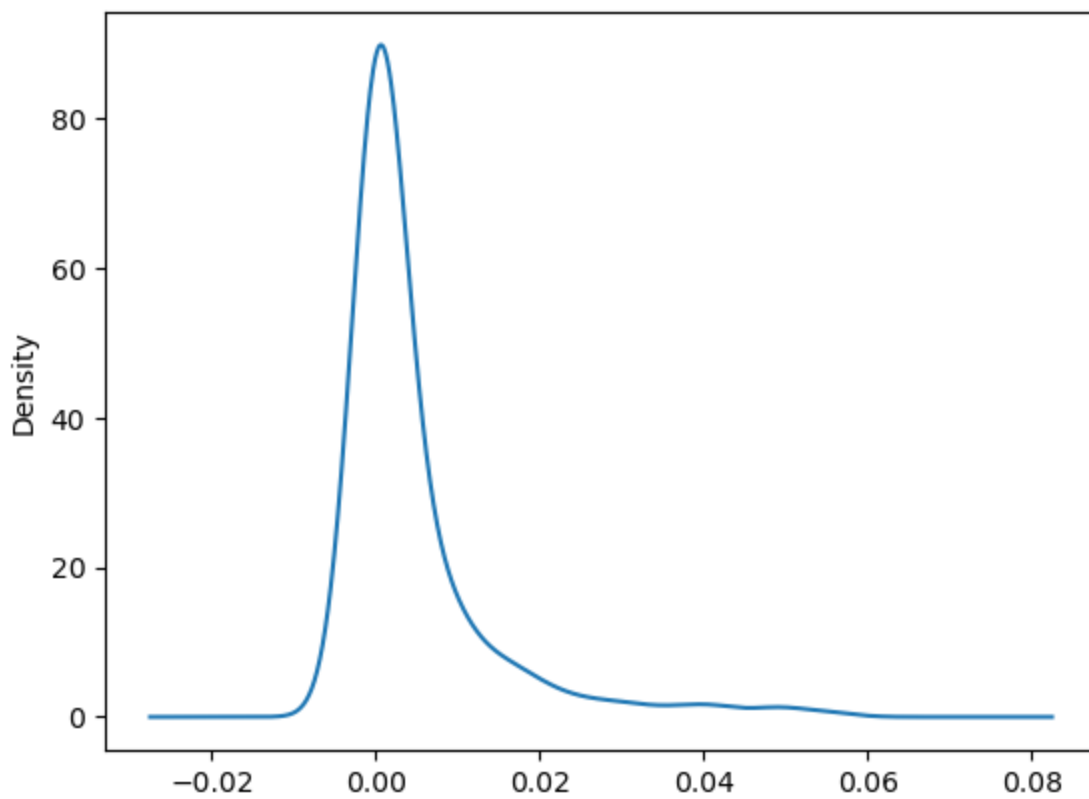
```
In [185...] d8.plot.kde()
```

```
Out[185]: <AxesSubplot:ylabel='Density'>
```



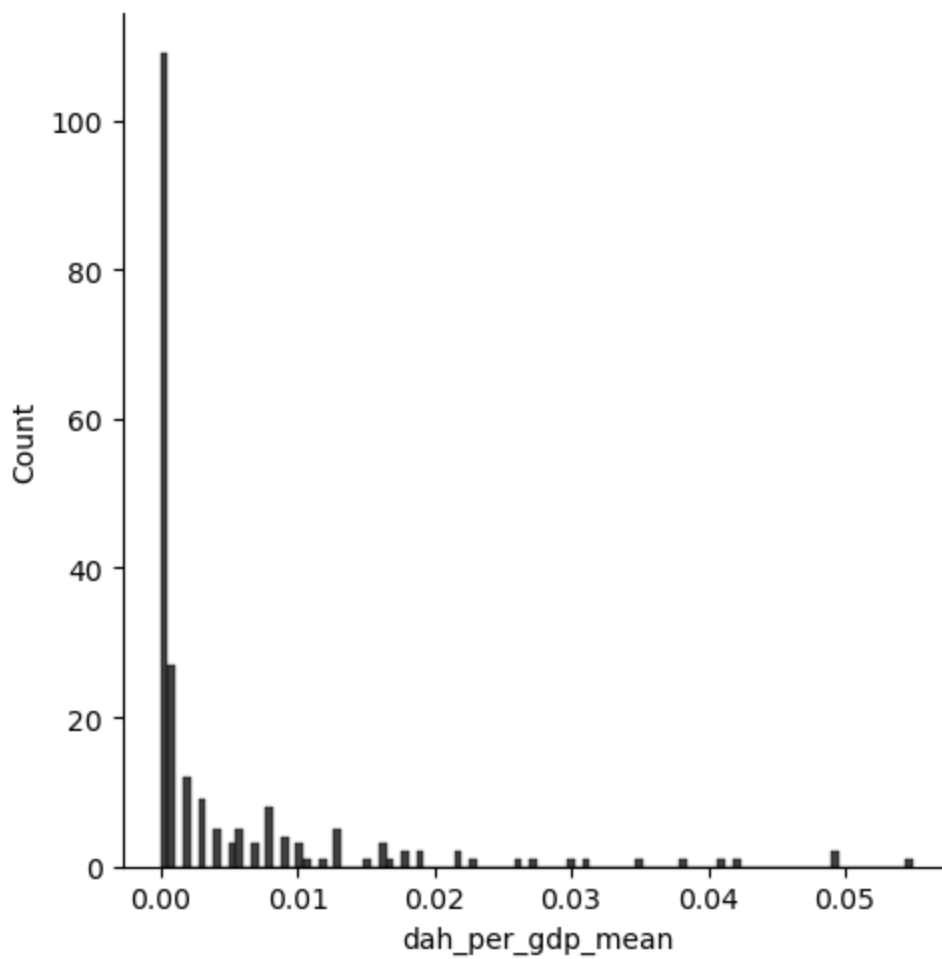
```
In [186...] d8.plot.density()
```

```
Out[186]: <AxesSubplot:ylabel='Density'>
```



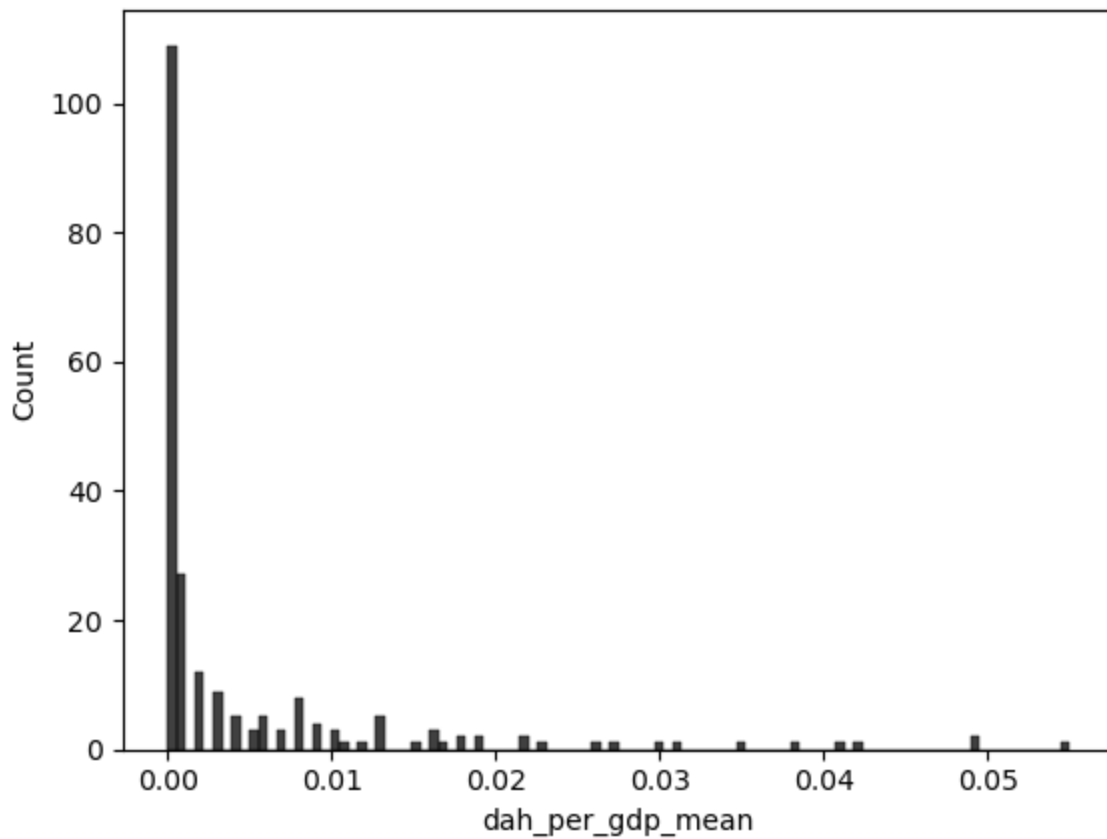
```
In [187...] sbn.displot(d8, bins=100, color='k')
```

```
Out[187]: <seaborn.axisgrid.FacetGrid at 0x16498f7d820>
```



```
In [188...] sbn.histplot(d8, bins=100, color='k')
```

```
Out[188]: <AxesSubplot:xlabel='dah_per_gdp_mean', ylabel='Count'>
```



Wykresy punktowe i bitowe

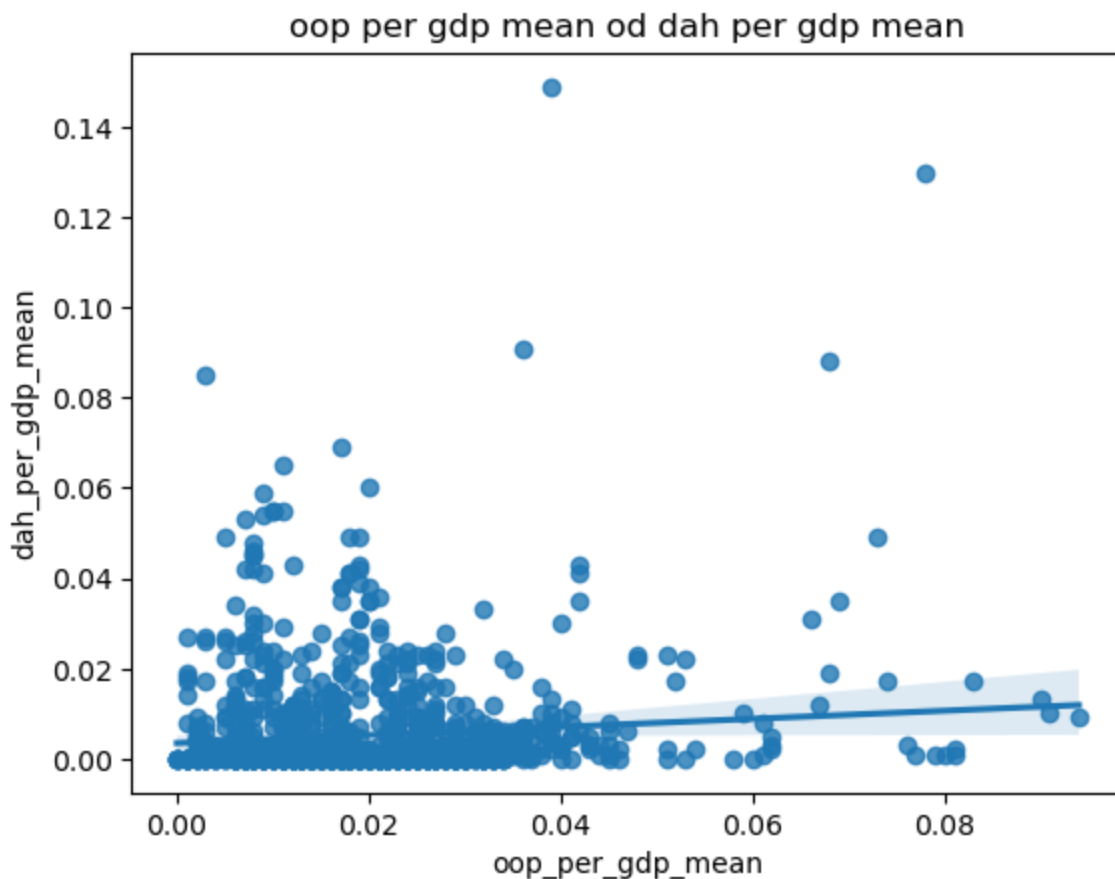
```
In [189]: d9 = df
          d9 = d9[d9["year"] > 2012]
          d9
```

Out[189]:	location_id	location_name	iso3	level	year	the_total_mean	the_total_lower	the_total_upper	the_total
18	160	Afghanistan	AFG	Country	2013	1554494	1435933	1674751	
19	160	Afghanistan	AFG	Country	2014	1664981	1541417	1800126	
20	160	Afghanistan	AFG	Country	2015	1822293	1693212	1960564	
21	160	Afghanistan	AFG	Country	2016	1882415	1747511	2028013	
22	160	Afghanistan	AFG	Country	2017	1992736	1857448	2142606	
...	...	...	...	...	...	...	...	...	
5227	166	Sub-Saharan Africa	S3	GBD Super Regions	2014	71349683	69713253	73018691	
5228	166	Sub-Saharan Africa	S3	GBD Super Regions	2015	73465621	71828527	75186691	
5229	166	Sub-Saharan Africa	S3	GBD Super Regions	2016	73972108	72267558	75733371	
5230	166	Sub-Saharan Africa	S3	GBD Super Regions	2017	77406545	75367505	79506397	
5231	166	Sub-Saharan Africa	S3	GBD Super Regions	2018	78994327	76466329	81632889	

1308 rows × 84 columns

```
In [190]: sbn.regplot(x='oop_per_gdp_mean', y='dah_per_gdp_mean', data=d9)
plt.title('oop per gdp mean od dah per gdp mean'.format('oop_per_gdp_mean', 'dah_per_gdp_mean'))

Out[190]: Text(0.5, 1.0, 'oop per gdp mean od dah per gdp mean')
```



Macierz wykresów

```
In [191]: d10 = df
d10 = d10[d10["year"] > 2010].head(50)
d10 = d10[["the_total_mean", "the_total_ppp_mean", "dah_per_gdp_mean", "oop_per_gdp_mean"]
d10
```

```
Out[191]:
```

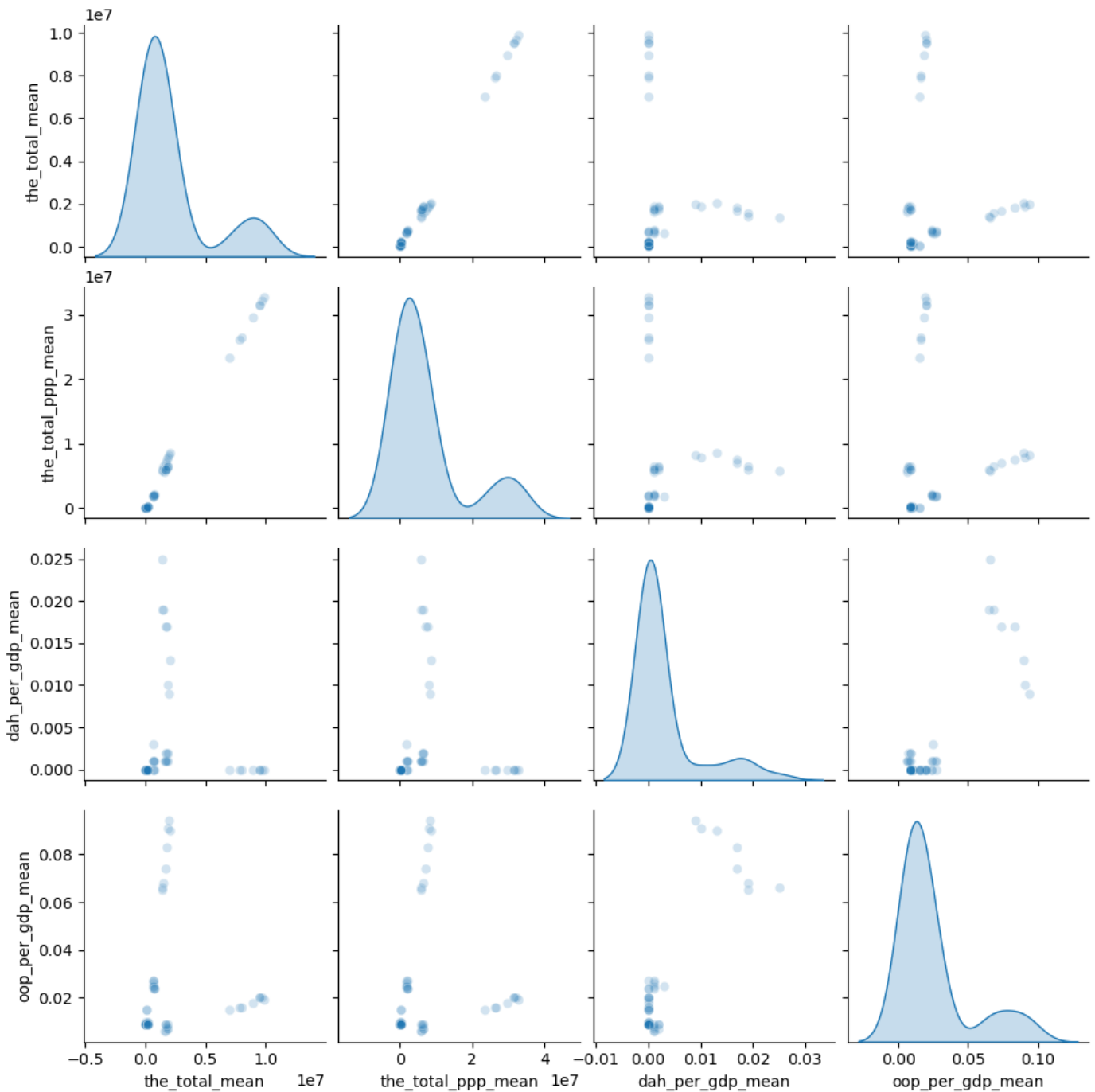
	the_total_mean	the_total_ppp_mean	dah_per_gdp_mean	oop_per_gdp_mean
16	1373092	5699060	0.025	0.066
17	1410474	5854216	0.019	0.065
18	1554494	6451977	0.019	0.068
19	1664981	6910557	0.017	0.074
20	1822293	7563486	0.017	0.083
21	1882415	7813023	0.010	0.091
22	1992736	8270915	0.009	0.094
23	2037487	8456655	0.013	0.090
40	639655	1782716	0.003	0.025
41	641496	1787846	0.001	0.026
42	659893	1839119	0.000	0.027



<b>43</b>	707623	1972142	0.001	0.027
<b>44</b>	689829	1922550	0.001	0.025
<b>45</b>	690713	1925014	0.000	0.024
<b>46</b>	724906	2020310	0.000	0.024
<b>47</b>	773638	2156125	0.001	0.024
<b>64</b>	7035126	23317461	0.000	0.015
<b>65</b>	8003953	26528574	0.000	0.016
<b>66</b>	7880135	26118187	0.000	0.016
<b>67</b>	8926232	29585404	0.000	0.018
<b>68</b>	9866905	32703203	0.000	0.019
<b>69</b>	9690605	32118869	0.000	0.020
<b>70</b>	9528786	31582532	0.000	0.020
<b>71</b>	9502698	31496063	0.000	0.020
<b>88</b>	33761	33761	0.000	0.009
<b>89</b>	32557	32557	0.000	0.009
<b>90</b>	31775	31775	0.000	0.009
<b>91</b>	31895	31895	0.000	0.009
<b>92</b>	32106	32106	0.000	0.009
<b>93</b>	31926	31926	0.000	0.009
<b>94</b>	31253	31253	0.000	0.010
<b>95</b>	32291	32291	0.000	0.009
<b>112</b>	204699	218073	0.000	0.009
<b>113</b>	197328	210220	0.000	0.010
<b>114</b>	196817	209676	0.000	0.010
<b>115</b>	197054	209929	0.000	0.009
<b>116</b>	201031	214165	0.000	0.009
<b>117</b>	216149	230271	0.000	0.009
<b>118</b>	225647	240390	0.000	0.009
<b>119</b>	234628	249957	0.000	0.009
<b>136</b>	1642328	5670017	0.001	0.006
<b>137</b>	1705780	5889079	0.001	0.006
<b>138</b>	1823689	6296151	0.002	0.007
<b>139</b>	1854933	6404019	0.001	0.007
<b>140</b>	1761334	6080878	0.001	0.008
<b>141</b>	1740257	6008108	0.002	0.009
<b>142</b>	1857264	6412066	0.002	0.009
<b>143</b>	1707322	5894405	0.001	0.009
<b>160</b>	69838	92019	0.000	0.015

```
In [192]: sbn.pairplot(d10, diag_kind='kde', plot_kws={'alpha': 0.2})
```

```
Out[192]: <seaborn.axisgrid.PairGrid at 0x1649a43d160>
```



Dane kateryczne

```
In [193]: d11 = df
d11 = d11[(d11["iso3"] == "S3") | (d11["iso3"] == "USA") | (d11["iso3"] == "CHN")]
d11 = d11[d11["year"] > 2010]
d11
```

```
Out[193]:
```

	location_id	location_name	iso3	level	year	the_total_mean	the_total_lower	the_total_upper	the_total
904	6	China	CHN	Country	2011	394499221	363955067	425030458	
905	6	China	CHN	Country	2012	438607436	408300708	470912636	
906	6	China	CHN	Country	2013	481628318	451394063	515950870	

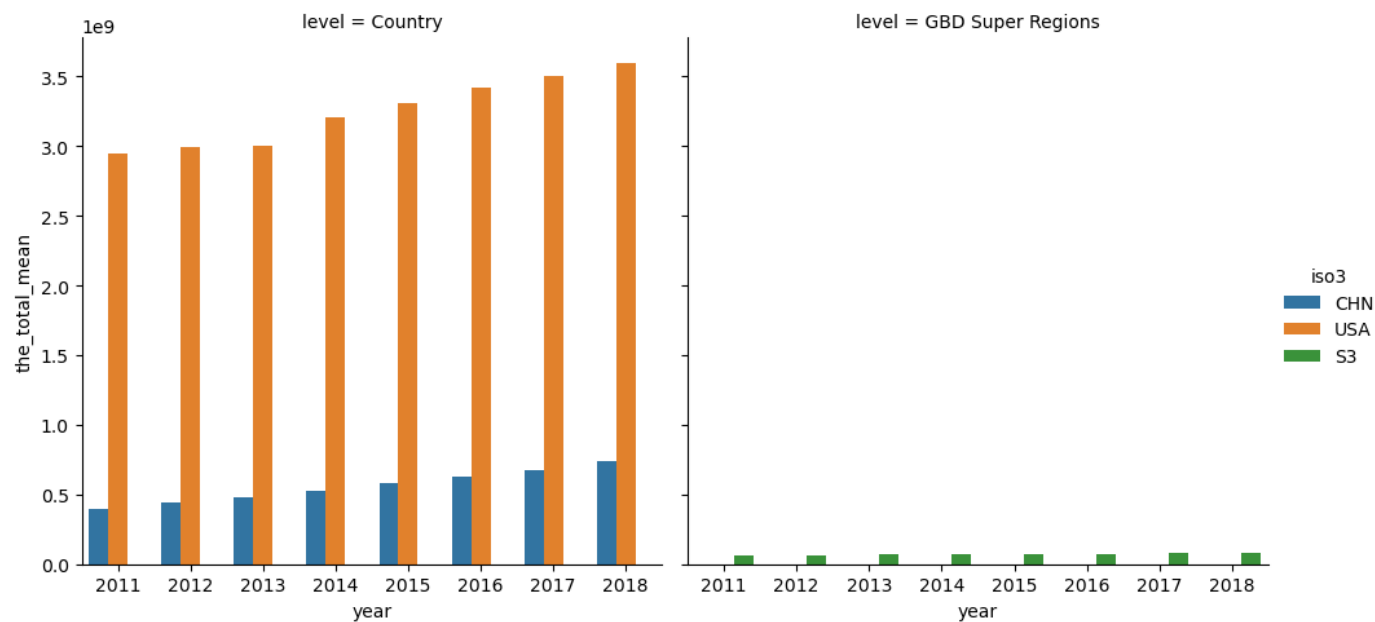
907	6	China	CHN	Country	2014	525586094	494048109	558205692
908	6	China	CHN	Country	2015	584192485	551263247	618708603
909	6	China	CHN	Country	2016	632511907	600721292	665591927
910	6	China	CHN	Country	2017	677343796	644644563	710047114
911	6	China	CHN	Country	2018	738123387	699261899	777328486
4696	102	United States of America	USA	Country	2011	2944162745	2890250905	2997085936
4697	102	United States of America	USA	Country	2012	2997075946	2948522176	3051844586
4698	102	United States of America	USA	Country	2013	3006573573	2953445463	3058500115
4699	102	United States of America	USA	Country	2014	3209771501	3159094694	3265764647
4700	102	United States of America	USA	Country	2015	3303976697	3250922048	3357576999
4701	102	United States of America	USA	Country	2016	3423031116	3370628273	3471875028
4702	102	United States of America	USA	Country	2017	3502754273	3448933896	3556604395
4703	102	United States of America	USA	Country	2018	3598369743	3529855473	3668158130
5224	166	Sub-Saharan Africa	S3	GBD Super Regions	2011	62011236	60507521	63569807
5225	166	Sub-Saharan Africa	S3	GBD Super Regions	2012	65111564	63505530	66755373
5226	166	Sub-Saharan Africa	S3	GBD Super Regions	2013	68804826	67166034	70485588
5227	166	Sub-Saharan Africa	S3	GBD Super Regions	2014	71349683	69713253	73018691
5228	166	Sub-Saharan Africa	S3	GBD Super Regions	2015	73465621	71828527	75186691
5229	166	Sub-Saharan Africa	S3	GBD Super Regions	2016	73972108	72267558	75733371
5230	166	Sub-Saharan Africa	S3	GBD Super Regions	2017	77406545	75367505	79506397
5231	166	Sub-Saharan Africa	S3	GBD Super Regions	2018	78994327	76466329	81632889

24 rows × 84 columns

```
In [194... sbn.catplot(x='year', y='the_total_mean', hue='iso3', col='level', kind='bar', data=d11)
```

```
#danymi kategoryzującymi jest level
```

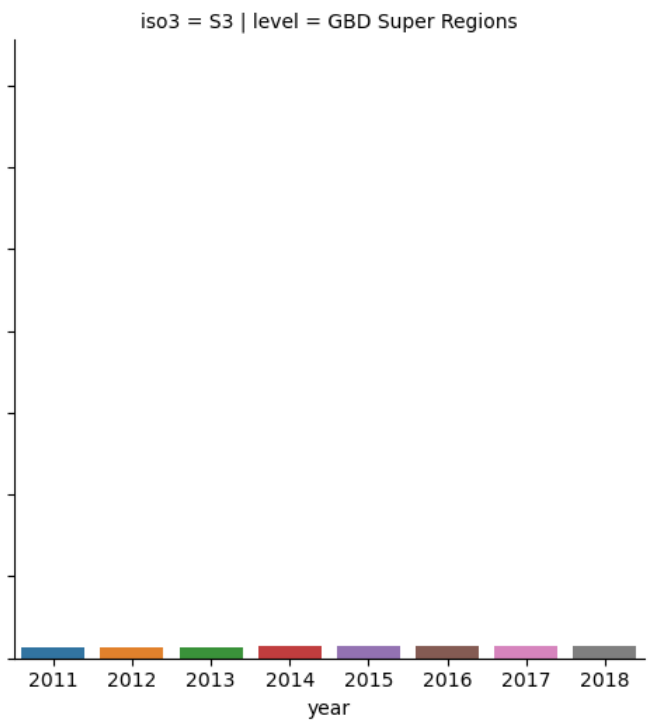
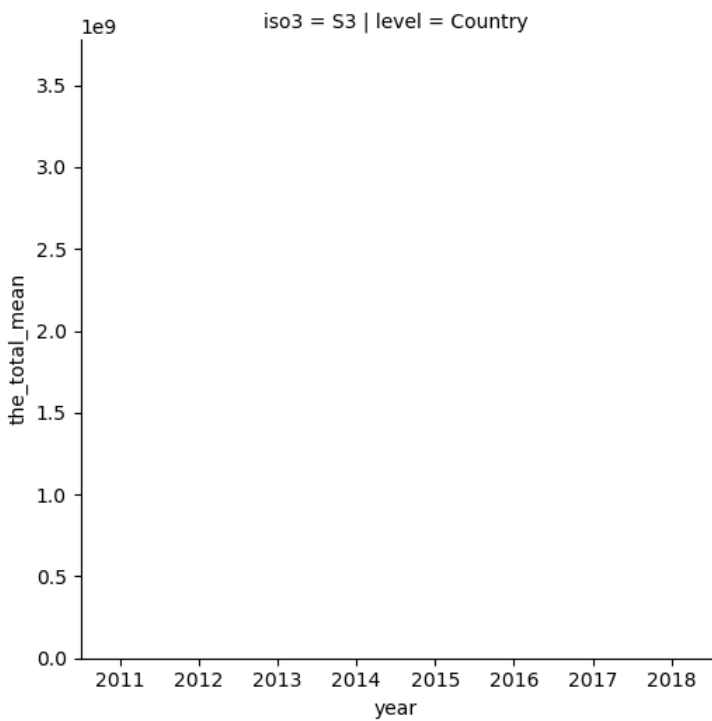
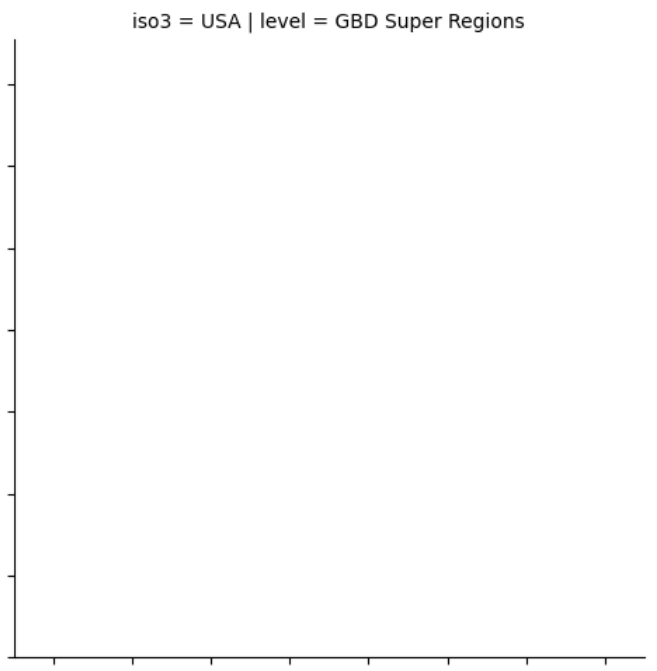
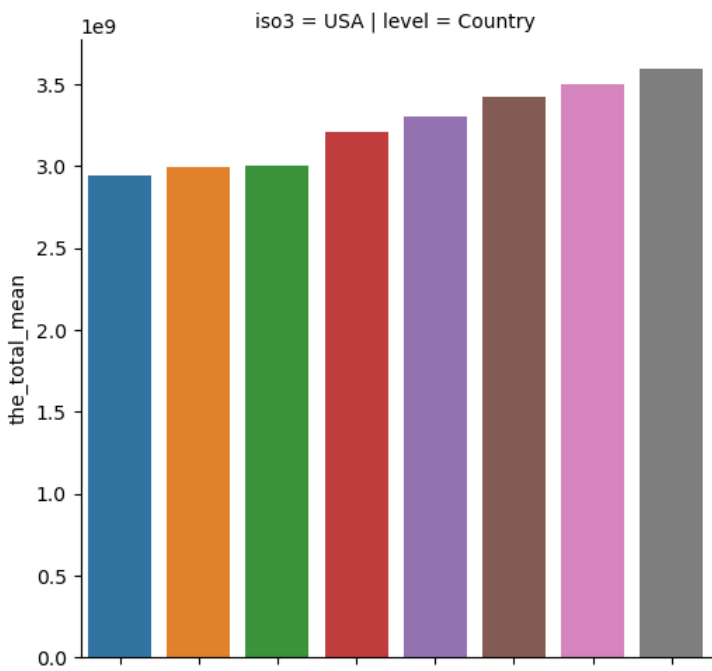
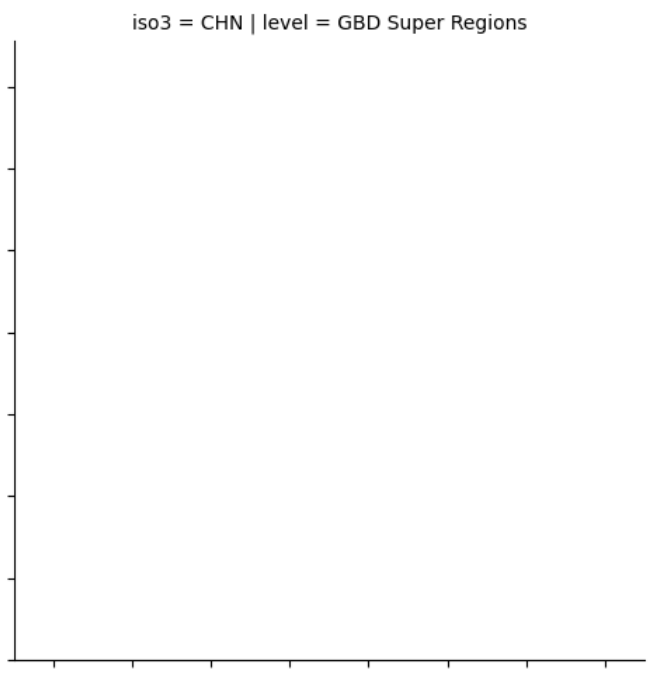
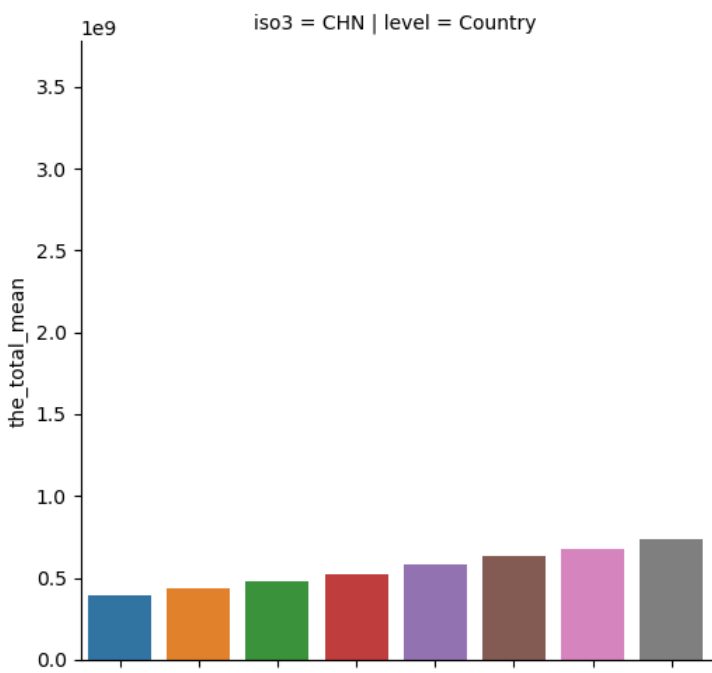
```
Out[194]: <seaborn.axisgrid.FacetGrid at 0x1649a2a6460>
```



Siatka aspektów

```
In [207... sbn.catplot(x='year', y='the_total_mean', row='iso3', col='level', kind='bar', data=d11)
```

```
Out[207]: <seaborn.axisgrid.FacetGrid at 0x1649b76e640>
```



## Wykresy blokowe

```
In [249... d12 = df[df["year"] > 2014]
d12 = d12[(d12["location_name"] == "Albania") | (d12["location_name"] == "Egypt") |
          (d12["location_name"] == "Latvia") | (d12["location_name"] == "Netherlands")]
d12
```

Out[249]:

	location_id	location_name	iso3	level	year	the_total_mean	the_total_lower	the_total_upper	the_total
<b>44</b>	43	Albania	ALB	Country	2015	689829	646378	738745	
<b>45</b>	43	Albania	ALB	Country	2016	690713	644271	738868	
<b>46</b>	43	Albania	ALB	Country	2017	724906	671771	779525	
<b>47</b>	43	Albania	ALB	Country	2018	773638	714327	838110	
<b>1340</b>	141	Egypt	EGY	Country	2015	15071072	14381859	15742578	
<b>1341</b>	141	Egypt	EGY	Country	2016	16078051	15343614	16813419	
<b>1342</b>	141	Egypt	EGY	Country	2017	16881770	16125703	17698948	
<b>1343</b>	141	Egypt	EGY	Country	2018	16764374	15786043	17787561	
<b>2372</b>	59	Latvia	LVA	Country	2015	1801007	1753510	1853748	
<b>2373</b>	59	Latvia	LVA	Country	2016	1897400	1847688	1946688	
<b>2374</b>	59	Latvia	LVA	Country	2017	2009249	1960480	2060583	
<b>2375</b>	59	Latvia	LVA	Country	2018	2131696	2066178	2198799	
<b>3020</b>	89	Netherlands	NLD	Country	2015	88930899	87386562	90536069	
<b>3021</b>	89	Netherlands	NLD	Country	2016	89554408	87964857	91154289	
<b>3022</b>	89	Netherlands	NLD	Country	2017	90480130	88820947	92135207	
<b>3023</b>	89	Netherlands	NLD	Country	2018	92143985	90088095	94254403	

16 rows × 84 columns

```
In [250... sbn.catplot(x='year', y='oop_per_gdp_mean', kind='box', data=d12)
#mediana, kwartyle, wartości odstające
```

Out[250]: <seaborn.axisgrid.FacetGrid at 0x164a5988cd0>

