1348 333.796 16223.5

1543 330.369 16229.6

1390 326.449 16265.1

3.7

3.6

3.5

207431164.7 297.

207521914.2 298.

207524486.3 298.

```
In [1]: ▶
            import pandas as pd
            import numpy as np
            import matplotlib.pyplot as plt
            %matplotlib inline
            import plotly.graph_objects as go
            import plotly.express as px
            import seaborn as sns
⋈ file
In [3]:
    Out[3]:
                     Date House_Price_Index Interest_Rate No_of_property_Introduced
                                                                                 PPI Income Unemployment Working_Pop
                 1/1/2003
                                    128.461
                                                  1.24
                                                                         1654 144.400 10710.4
                                                                                                           185635346.4 182.
               0
                                                                                                      5.8
                  2/1/2003
                                    129.355
                                                  1.26
                                                                         1688 145.200 10674.0
                                                                                                      5.9
                                                                                                           185869692.3 183.
                  3/1/2003
                                    130.148
                                                  1.25
                                                                         1638 145.200 10696.5
                                                                                                           186085118.2 183.
                                                                                                      5.9
                  4/1/2003
                                    130.884
                                                  1.26
                                                                         1662 145.900 10752.7
                                                                                                           186470754.0 183.
                  5/1/2003
                                    131.735
                                                  1.26
                                                                         1733 145.800 10832.0
                                                                                                      6.1
                                                                                                           186649078.0 182.
                  8/1/2022
                                    301.473
                                                  2.33
                                                                         1355 342.753 16161.4
                                                                                                           207370651.0 295.
             235
                                                                                                      3.7
             236
                  9/1/2022
                                    299.353
                                                  2.56
                                                                         1438 336.464 16184.9
                                                                                                           207453580.5
```

240 rows × 26 columns

298.873

298.269

297.413

3.08

3.78

4.10

237 10/1/2022

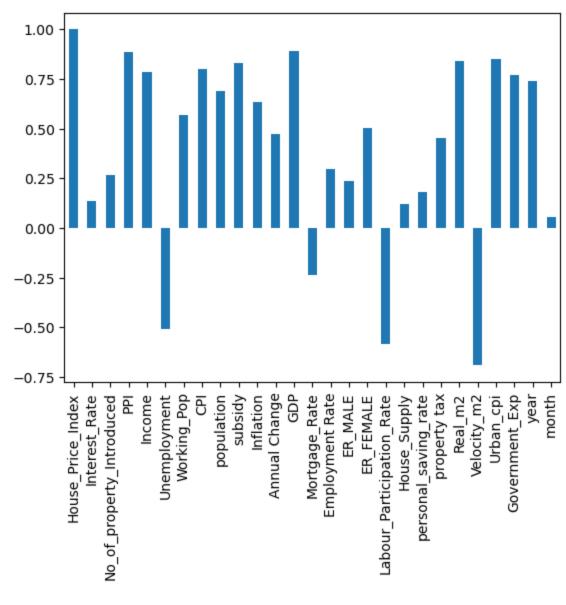
11/1/2022

12/1/2022

4

Data Preparation

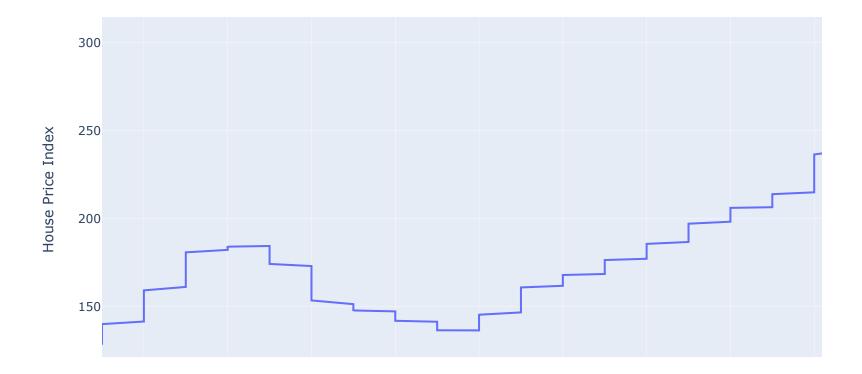
correlation with Output column



In []: **M**

House_Price_Index vs Date

House Price Index Over Years

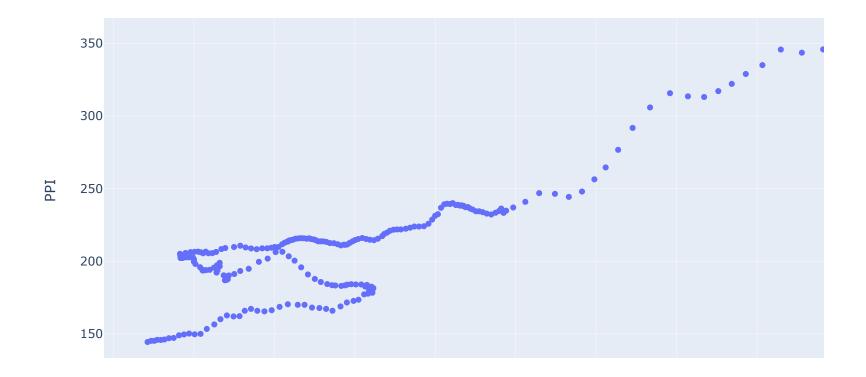


```
# there was rise in house price from 2004 to 2006
# dcline in house Price from 2007 upto 2012
# there was rise in house price index from 2013
# there was revolutionary change from 2020 and onword
```

```
In [ ]: • • •
```

PPI vs House_Price_Index

Scatter Plot: House Price Index vs. PPI

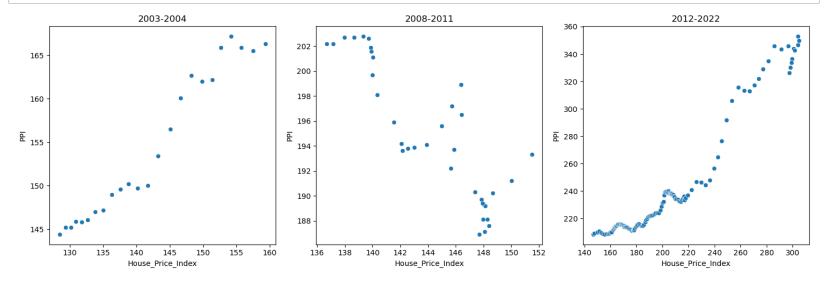


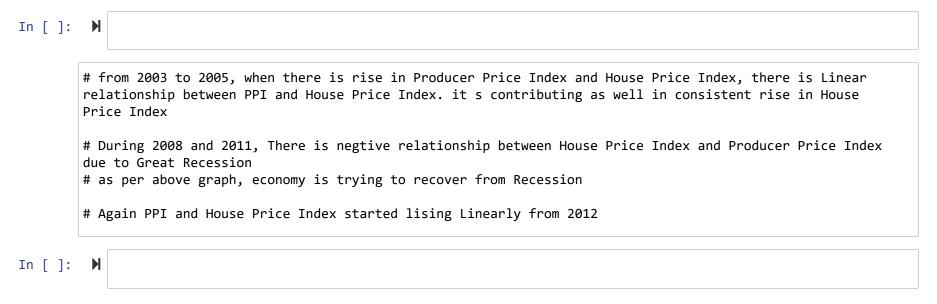
[#] The Producer Price Index by Commodity: Special Indexes: Construction Materials (PPI-CM) is a statistical measure of the change in prices paid by producers for materials and components used in construction

[#] there is sort of linear relationship between PPi and Price of Houses, if PPI increase then house prices will increase as well

in between 2008 to 2013, when PPI is high but house price index is low this is because of Great Recession, this means for construction high expenses was incurred as compared to price charged from customers

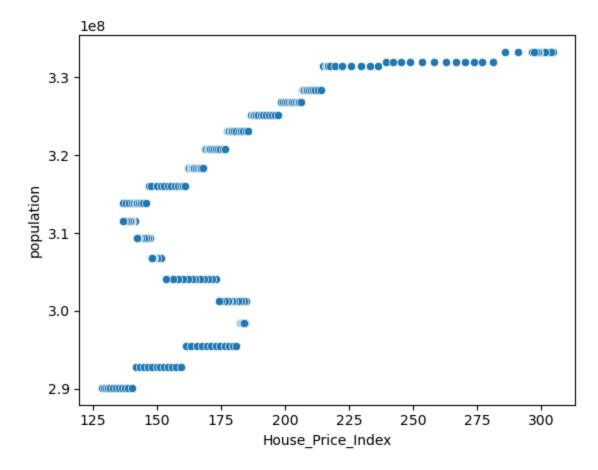
```
In [59]: N fig, axes = plt.subplots(nrows=1, ncols=3, figsize=(15, 5))
sns.scatterplot(data=first, x='House_Price_Index', y='PPI', ax=axes[0])
axes[0].set_title('2003-2004')
sns.scatterplot(data=second, x='House_Price_Index', y='PPI', ax=axes[1])
axes[1].set_title('2008-2011')
sns.scatterplot(data=third, x='House_Price_Index', y='PPI', ax=axes[2])
axes[2].set_title('2012-2022')
plt.tight_layout()
plt.show()
```





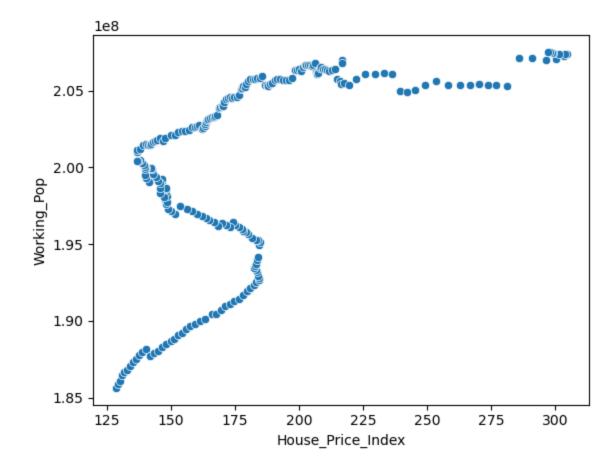
population and working Population vs House_Price_Index

Out[86]: <Axes: xlabel='House_Price_Index', ylabel='population'>



In [95]: N sns.scatterplot(data=file, y='Working_Pop', x='House_Price_Index')

Out[95]: <Axes: xlabel='House_Price_Index', ylabel='Working_Pop'>



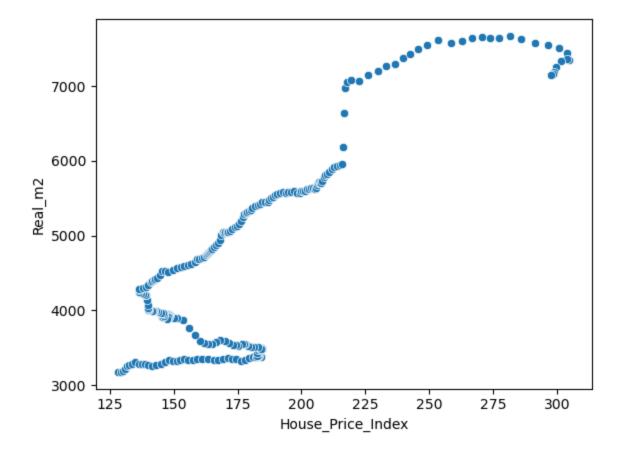
as per above both graphs, as you can see when population is rising the house price index is rising as well, but during 2008 to 2013 due to great recession house price index droped and then again started rising

In []: ▶

Real_m2 vs House_Price_Index

In [107]: ► sns.scatterplot(data=file, y='Real_m2', x='House_Price_Index')

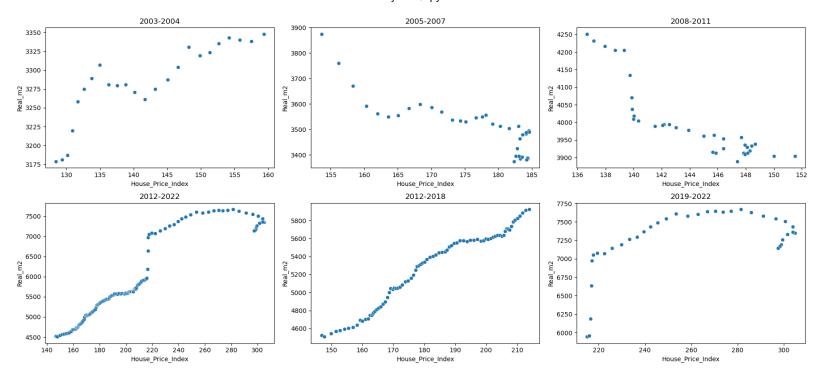
Out[107]: <Axes: xlabel='House_Price_Index', ylabel='Real_m2'>



Real M2 and House Price Index, there is linear relationship between real M2 and House Price index, affect of Great Recession can be seen in graph, otherwise there is clear linear relationship between Real M2 and House Price Index

```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

In [94]:
             sns.scatterplot(data=first, x='House_Price_Index', y='Real_m2', ax=axes[0, 0])
             axes[0, 0].set_title('2003-2004')
             sns.scatterplot(data=first1, x='House_Price_Index', y='Real_m2', ax=axes[0, 1])
             axes[0, 1].set_title('2005-2007')
             sns.scatterplot(data=second, x='House_Price_Index', y='Real_m2', ax=axes[0, 2])
             axes[0, 2].set_title('2008-2011')
             sns.scatterplot(data=third, x='House_Price_Index', y='Real_m2', ax=axes[1, 0])
             axes[1, 0].set_title('2012-2022')
             sns.scatterplot(data=fourth, x='House_Price_Index', y='Real_m2', ax=axes[1, 1])
             axes[1, 1].set_title('2012-2018')
             sns.scatterplot(data=fifth, x='House_Price_Index', y='Real_m2', ax=axes[1, 2])
             axes[1, 2].set_title('2019-2022')
             plt.tight_layout()
             plt.show()
```



When Real Money Stock is rising and House Price Index is rising as well # in Between 2003 and 2005, there is aggresive increase in Real M2 but House Price is increasing at normal rate in start

During 2008- 2011, there is negtive Linear Relationship between Real M2 and House Price Index, Supply of money after considering inflation is decreasing

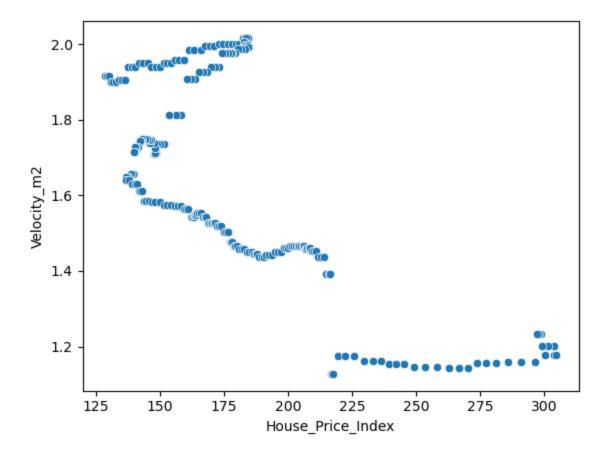
During 2019 and 2022, there was drastic chnage in Real M2 and then increase in real m2 was normal

In []: ▶

Velocity_m2 vs House_Price_Index

In [85]: ▶ sns.scatterplot(data=file, y='Velocity_m2', x='House_Price_Index')

Out[85]: <Axes: xlabel='House_Price_Index', ylabel='Velocity_m2'>



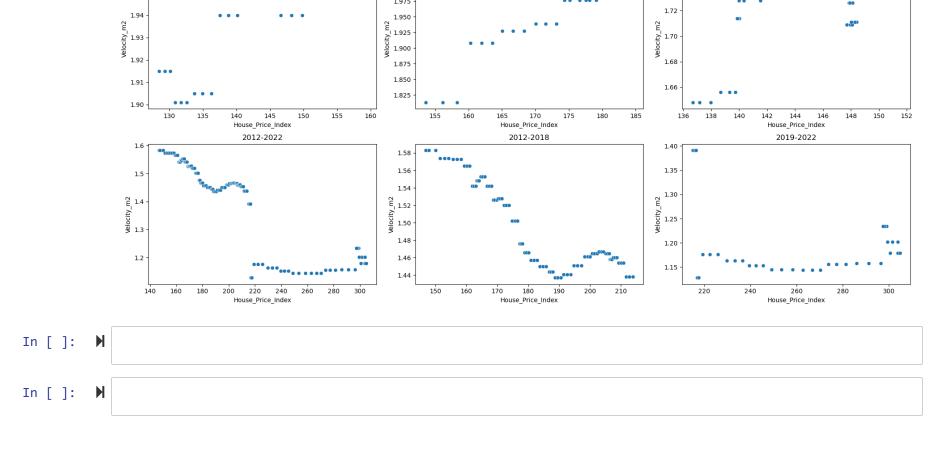
there is negtive Linear relationship between House Price Index and Velocity M2 and affect of Great Recession can be seen in graph

In []: ▶

```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

In [95]:
             sns.scatterplot(data=first, x='House_Price_Index', y='Velocity_m2', ax=axes[0, 0])
             axes[0, 0].set_title('2003-2004')
             sns.scatterplot(data=first1, x='House_Price_Index', y='Velocity_m2', ax=axes[0, 1])
             axes[0, 1].set_title('2005-2007')
             sns.scatterplot(data=second, x='House_Price_Index', y='Velocity_m2', ax=axes[0, 2])
             axes[0, 2].set_title('2008-2011')
             sns.scatterplot(data=third, x='House_Price_Index', y='Velocity_m2', ax=axes[1, 0])
             axes[1, 0].set_title('2012-2022')
             sns.scatterplot(data=fourth, x='House_Price_Index', y='Velocity_m2', ax=axes[1, 1])
             axes[1, 1].set_title('2012-2018')
             sns.scatterplot(data=fifth, x='House_Price_Index', y='Velocity_m2', ax=axes[1, 2])
             axes[1, 2].set_title('2019-2022')
             plt.tight_layout()
             plt.show()
```

2008-2011



2.025

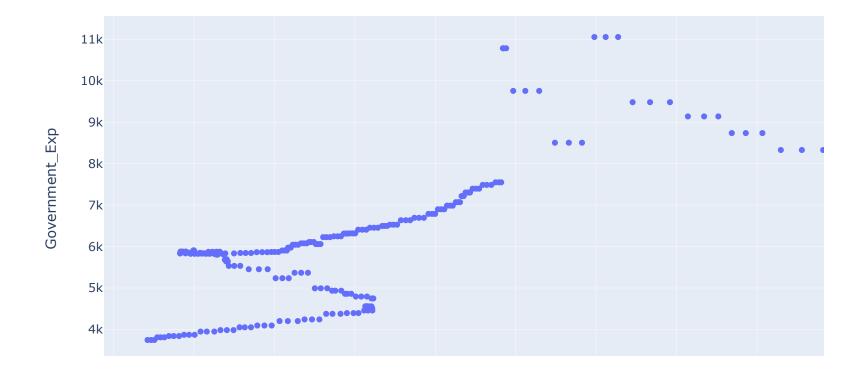
Government_Exp vs House_Price_Index

2003-2004

1.96

1.95

Scatter Plot: House Price Index vs. Government_Exp

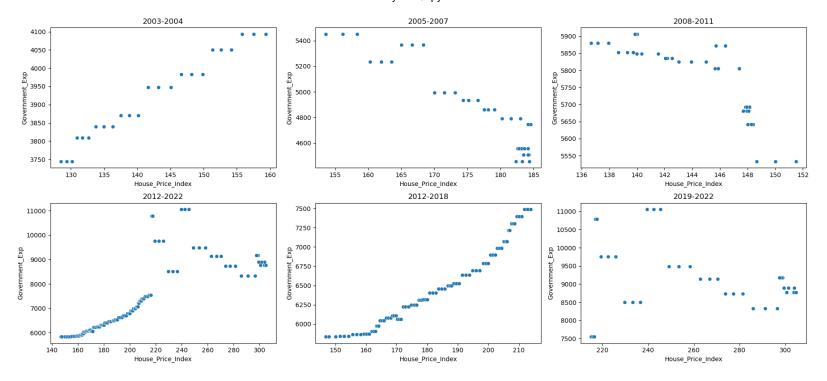


there is sort of Linear relationship between House Price Index and Government, there affect of Great Recession can be seen in graph

In []: • N

```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

In [96]:
             sns.scatterplot(data=first, x='House_Price_Index', y='Government_Exp', ax=axes[0, 0])
             axes[0, 0].set_title('2003-2004')
             sns.scatterplot(data=first1, x='House_Price_Index', y='Government_Exp', ax=axes[0, 1])
             axes[0, 1].set_title('2005-2007')
             sns.scatterplot(data=second, x='House_Price_Index', y='Government_Exp', ax=axes[0, 2])
             axes[0, 2].set_title('2008-2011')
             sns.scatterplot(data=third, x='House_Price_Index', y='Government_Exp', ax=axes[1, 0])
             axes[1, 0].set_title('2012-2022')
             sns.scatterplot(data=fourth, x='House_Price_Index', y='Government_Exp', ax=axes[1, 1])
             axes[1, 1].set_title('2012-2018')
             sns.scatterplot(data=fifth, x='House_Price_Index', y='Government_Exp', ax=axes[1, 2])
             axes[1, 2].set_title('2019-2022')
             plt.tight_layout()
             plt.show()
```



During 2003 and 2005, there is linear relationship between House Price Index and Governement exp, economy growth is normal

During 2008 and 2011 and 2005 and 2007 , when there was situation of Great Recession, there was drop of Government expensiture

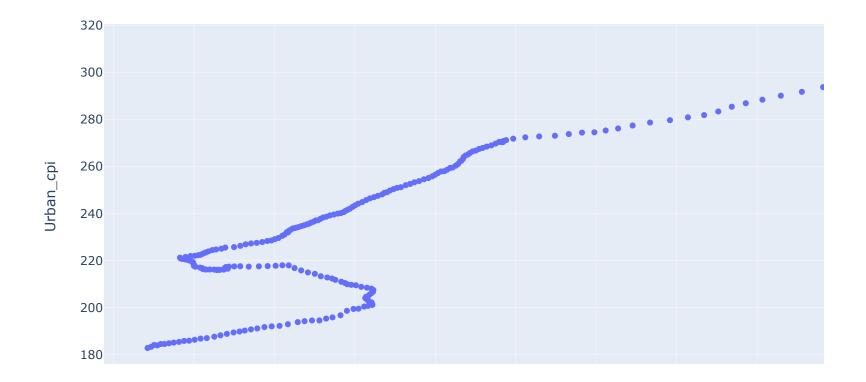
During 2012 - 2018, government incurred expenditure to revive the economy from Recession as per requirement

during 2019 to 2022, which was period of covid, government incurred even high as compared to previous records

In []: ▶

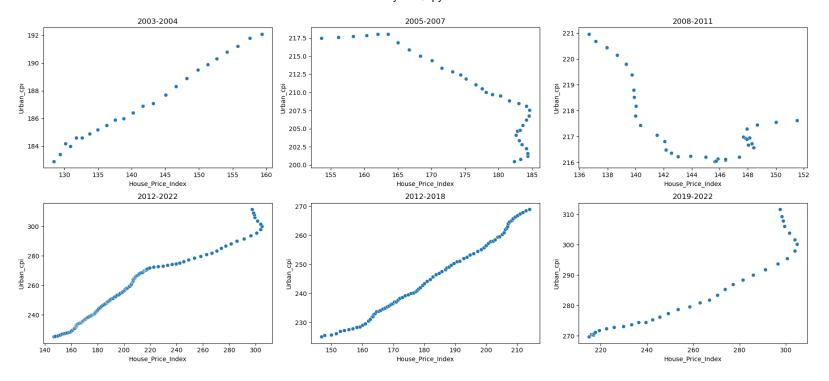
Urban_cpi vs House_Price_Index

Scatter Plot: House Price Index vs. Urban_cpi



```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

In [98]:
             sns.scatterplot(data=first, x='House_Price_Index', y='Urban_cpi', ax=axes[0, 0])
             axes[0, 0].set_title('2003-2004')
             sns.scatterplot(data=first1, x='House_Price_Index', y='Urban_cpi', ax=axes[0, 1])
             axes[0, 1].set_title('2005-2007')
             sns.scatterplot(data=second, x='House_Price_Index', y='Urban_cpi', ax=axes[0, 2])
             axes[0, 2].set_title('2008-2011')
             sns.scatterplot(data=third, x='House_Price_Index', y='Urban_cpi', ax=axes[1, 0])
             axes[1, 0].set_title('2012-2022')
             sns.scatterplot(data=fourth, x='House_Price_Index', y='Urban_cpi', ax=axes[1, 1])
             axes[1, 1].set_title('2012-2018')
             sns.scatterplot(data=fifth, x='House_Price_Index', y='Urban_cpi', ax=axes[1, 2])
             axes[1, 2].set_title('2019-2022')
             plt.tight_layout()
             plt.show()
```



There is Linear relationship between Urban_cpi and House Price Index, also the affect of Great Recession can be seen in graph

During 2005-2007 and 2008-2011, When there was Great Recession, drop of Urban Consumer Price Index and House Price Index can be seen

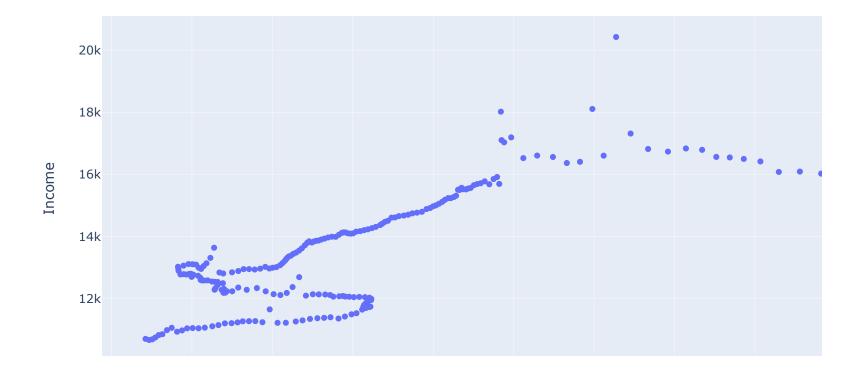
During 2012-2018, consistent rise in urban consumer price index and House Price Index can be seen when economy started Recovering from Great Recession

During 2021 and 2022, there was drastic change in Consumer Price Index, this could be due to end of lockdown due to covid

In []: •

Income vs House_Price_Index

Scatter Plot: House Price Index vs. Income



[#] Income vs House Price Index

[#] there is sort of Linear Relationship Between Income and House Price Index, it contains some Outliers

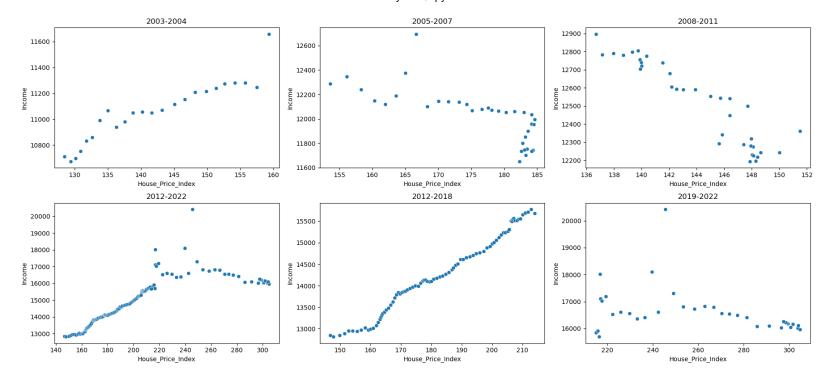
[#] also the affect of Great Recession can be seen

[#] if income will increase then demand of houses will increase too which will lead to high price index, if supply of house is not enough to meet demand

income does not contribute much in increasing the House Price Index

```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

In [100]:
              sns.scatterplot(data=first, x='House_Price_Index', y='Income', ax=axes[0, 0])
              axes[0, 0].set_title('2003-2004')
              sns.scatterplot(data=first1, x='House_Price_Index', y='Income', ax=axes[0, 1])
              axes[0, 1].set_title('2005-2007')
              sns.scatterplot(data=second, x='House_Price_Index', y='Income', ax=axes[0, 2])
              axes[0, 2].set_title('2008-2011')
              sns.scatterplot(data=third, x='House_Price_Index', y='Income', ax=axes[1, 0])
              axes[1, 0].set_title('2012-2022')
              sns.scatterplot(data=fourth, x='House_Price_Index', y='Income', ax=axes[1, 1])
              axes[1, 1].set_title('2012-2018')
              sns.scatterplot(data=fifth, x='House_Price_Index', y='Income', ax=axes[1, 2])
              axes[1, 2].set_title('2019-2022')
              plt.tight_layout()
              plt.show()
```



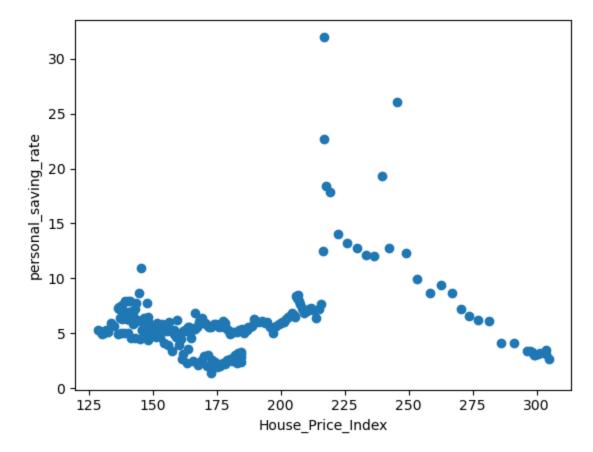
There are Two siuation first is of Great Recession and Covid # During 2005-2007 and 2008-2011, there was situation of Great Recession, reduction can be seen in income level and House Price Index

During the 2019-2022, small drop can be seen in House Price Index and Income Level

In []: ▶

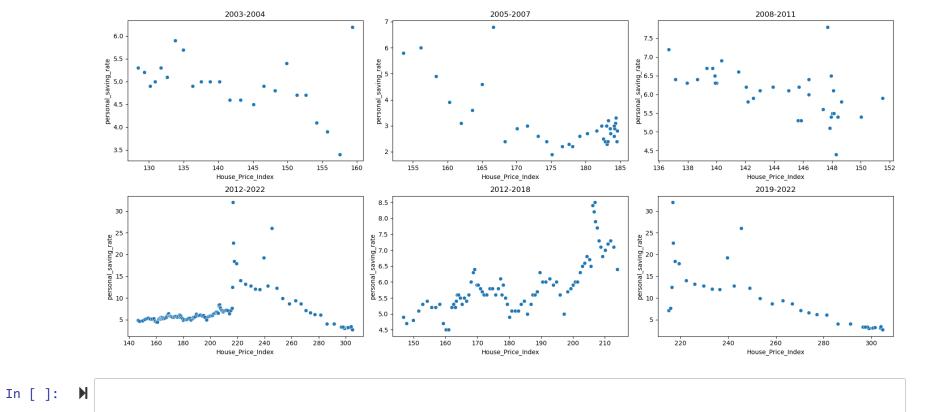
personal_saving_rate vs House Price Index

Out[121]: Text(0, 0.5, 'personal_saving_rate')



```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

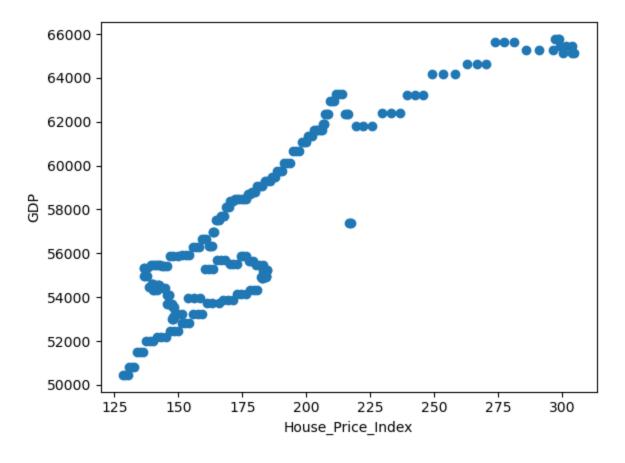
In [101]:
              sns.scatterplot(data=first, x='House_Price_Index', y='personal_saving_rate', ax=axes[0, 0])
              axes[0, 0].set_title('2003-2004')
              sns.scatterplot(data=first1, x='House_Price_Index', y='personal_saving_rate', ax=axes[0, 1])
              axes[0, 1].set_title('2005-2007')
              sns.scatterplot(data=second, x='House_Price_Index', y='personal_saving_rate', ax=axes[0, 2])
              axes[0, 2].set_title('2008-2011')
              sns.scatterplot(data=third, x='House_Price_Index', y='personal_saving_rate', ax=axes[1, 0])
              axes[1, 0].set_title('2012-2022')
              sns.scatterplot(data=fourth, x='House_Price_Index', y='personal_saving_rate', ax=axes[1, 1])
              axes[1, 1].set_title('2012-2018')
              sns.scatterplot(data=fifth, x='House_Price_Index', y='personal_saving_rate', ax=axes[1, 2])
              axes[1, 2].set_title('2019-2022')
              plt.tight_layout()
              plt.show()
```



GDP vs House Price Index

```
In [122]:  plt.scatter(file['House_Price_Index'], file['GDP'])
  plt.xlabel('House_Price_Index')
  plt.ylabel('GDP')
```

Out[122]: Text(0, 0.5, 'GDP')

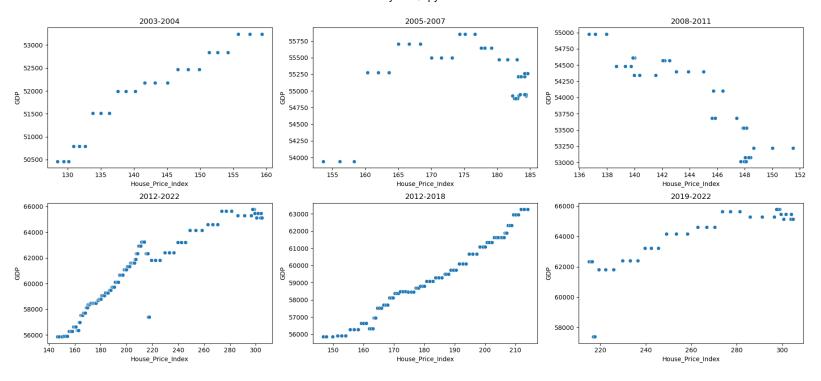


GDP vs House Price Index

There is Linear relationship between GDP and House Price Index, when GDp increase then House Price Index will incease as well

```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

In [102]:
              sns.scatterplot(data=first, x='House_Price_Index', y='GDP', ax=axes[0, 0])
              axes[0, 0].set_title('2003-2004')
              sns.scatterplot(data=first1, x='House_Price_Index', y='GDP', ax=axes[0, 1])
              axes[0, 1].set_title('2005-2007')
              sns.scatterplot(data=second, x='House_Price_Index', y='GDP', ax=axes[0, 2])
              axes[0, 2].set_title('2008-2011')
              sns.scatterplot(data=third, x='House_Price_Index', y='GDP', ax=axes[1, 0])
              axes[1, 0].set_title('2012-2022')
              sns.scatterplot(data=fourth, x='House_Price_Index', y='GDP', ax=axes[1, 1])
              axes[1, 1].set_title('2012-2018')
              sns.scatterplot(data=fifth, x='House_Price_Index', y='GDP', ax=axes[1, 2])
              axes[1, 2].set_title('2019-2022')
              plt.tight_layout()
              plt.show()
```



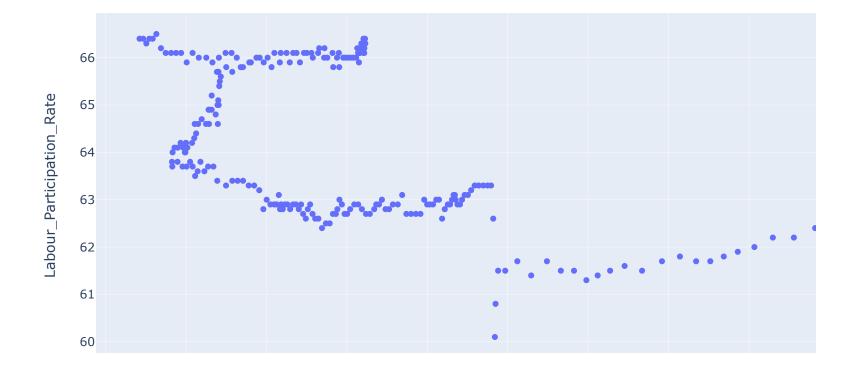
if we do not consider the situation of covid and Great Recession, there was linear relationship between GDP and House Price Index

During 2008 and 2011, there was drop in GDP and House Price Index due to Great Recession # During 2019-2022, there was drop in gdp during COVID but after slowly is started to reach on top

In []: ▶

Labour_Participation_Rate vs House Price index

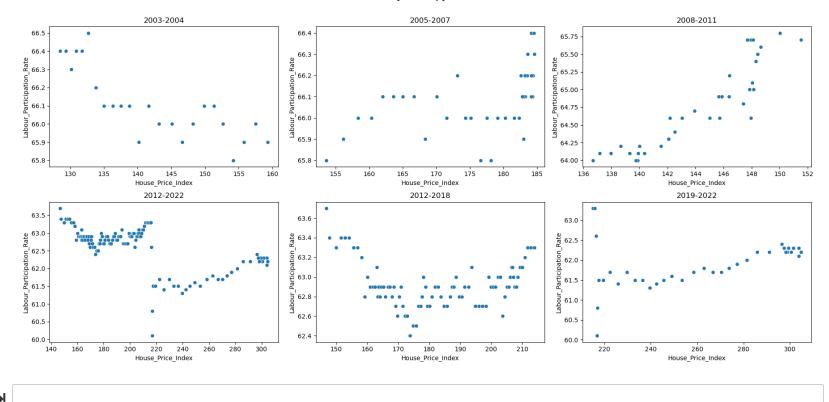
Scatter Plot: House Price Index vs. Labour_Participation_Rate



```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

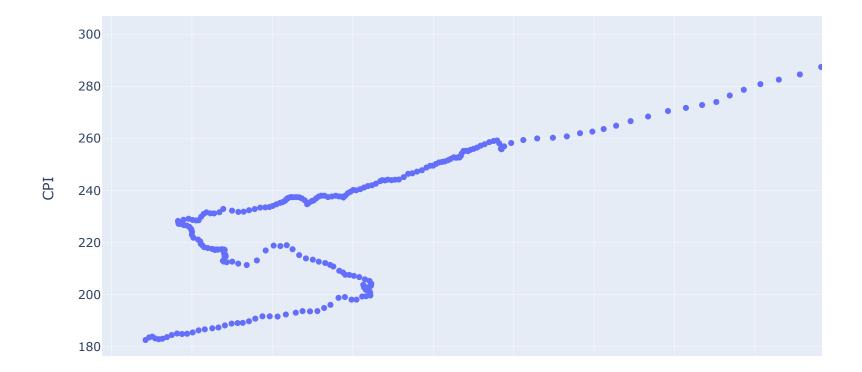
In [107]:
              sns.scatterplot(data=first, x='House_Price_Index', y='Labour_Participation_Rate', ax=axes[0, 0])
              axes[0, 0].set_title('2003-2004')
              sns.scatterplot(data=first1, x='House_Price_Index', y='Labour_Participation_Rate', ax=axes[0, 1])
              axes[0, 1].set_title('2005-2007')
              sns.scatterplot(data=second, x='House_Price_Index', y='Labour_Participation_Rate', ax=axes[0, 2])
              axes[0, 2].set_title('2008-2011')
              sns.scatterplot(data=third, x='House_Price_Index', y='Labour_Participation_Rate', ax=axes[1, 0])
              axes[1, 0].set_title('2012-2022')
              sns.scatterplot(data=fourth, x='House_Price_Index', y='Labour_Participation_Rate', ax=axes[1, 1])
              axes[1, 1].set_title('2012-2018')
              sns.scatterplot(data=fifth, x='House_Price_Index', y='Labour_Participation_Rate', ax=axes[1, 2])
              axes[1, 2].set_title('2019-2022')
              plt.tight_layout()
              plt.show()
```

In []:



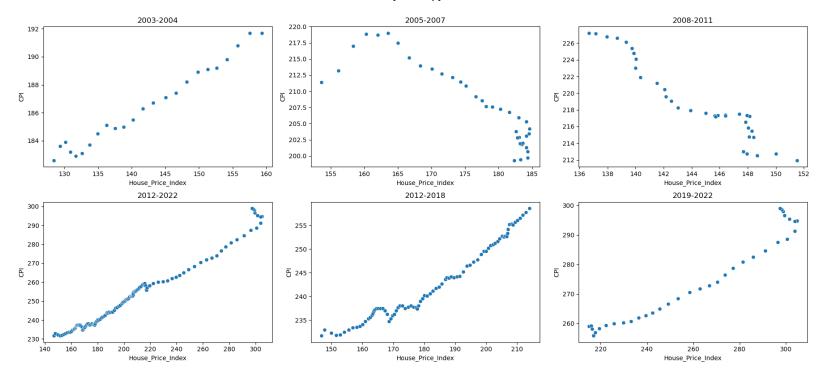
CPI vs House Price Index

Scatter Plot: House Price Index vs. CPI



```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

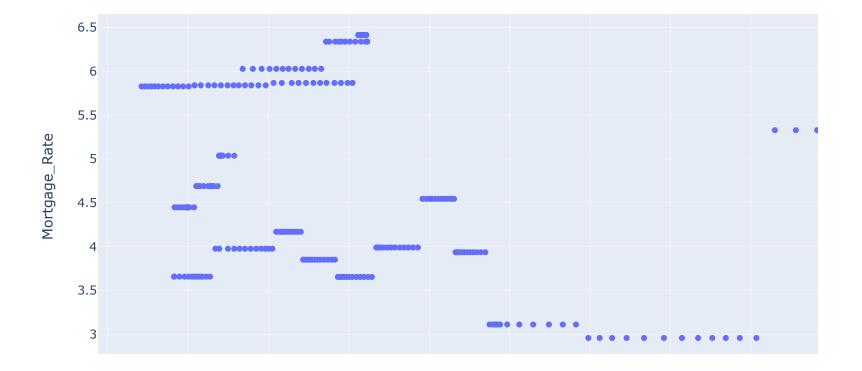
In [108]:
              sns.scatterplot(data=first, x='House_Price_Index', y='CPI', ax=axes[0, 0])
              axes[0, 0].set_title('2003-2004')
              sns.scatterplot(data=first1, x='House_Price_Index', y='CPI', ax=axes[0, 1])
              axes[0, 1].set_title('2005-2007')
              sns.scatterplot(data=second, x='House_Price_Index', y='CPI', ax=axes[0, 2])
              axes[0, 2].set_title('2008-2011')
              sns.scatterplot(data=third, x='House_Price_Index', y='CPI', ax=axes[1, 0])
              axes[1, 0].set_title('2012-2022')
              sns.scatterplot(data=fourth, x='House_Price_Index', y='CPI', ax=axes[1, 1])
              axes[1, 1].set_title('2012-2018')
              sns.scatterplot(data=fifth, x='House_Price_Index', y='CPI', ax=axes[1, 2])
              axes[1, 2].set_title('2019-2022')
              plt.tight_layout()
              plt.show()
```



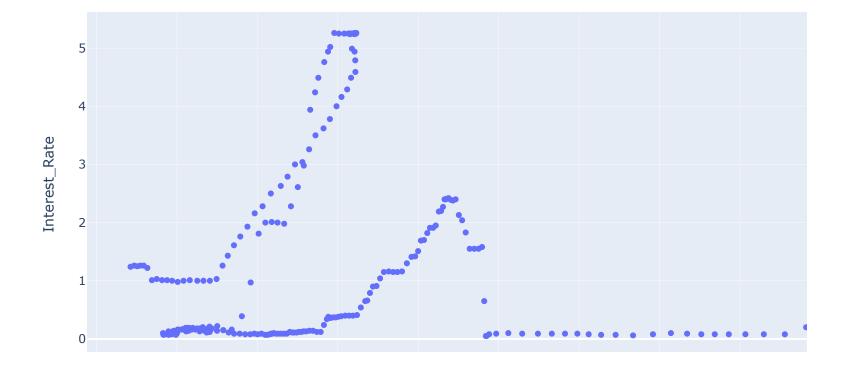
it is same as urban cpi, during Great Recession there was decrese in CPI
there was little drop in CPI during COVID

Mortgage_Rate/Interest_Rate vs House Price Index

Scatter Plot: House Price Index vs. Mortgage_Rate



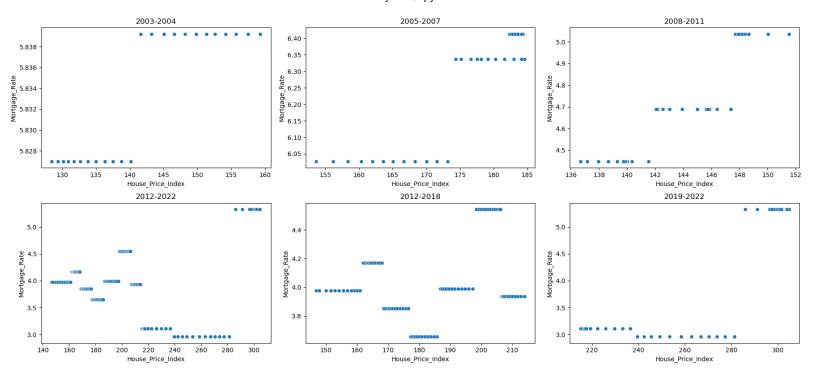
Scatter Plot: House Price Index vs. Interest_Rate



In []: **M**

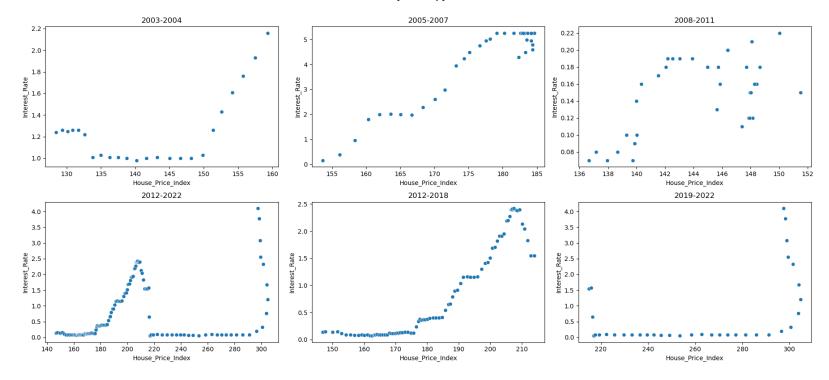
```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

In [109]:
              sns.scatterplot(data=first, x='House_Price_Index', y='Mortgage_Rate', ax=axes[0, 0])
              axes[0, 0].set_title('2003-2004')
              sns.scatterplot(data=first1, x='House_Price_Index', y='Mortgage_Rate', ax=axes[0, 1])
              axes[0, 1].set_title('2005-2007')
              sns.scatterplot(data=second, x='House_Price_Index', y='Mortgage_Rate', ax=axes[0, 2])
              axes[0, 2].set_title('2008-2011')
              sns.scatterplot(data=third, x='House_Price_Index', y='Mortgage_Rate', ax=axes[1, 0])
              axes[1, 0].set_title('2012-2022')
              sns.scatterplot(data=fourth, x='House_Price_Index', y='Mortgage_Rate', ax=axes[1, 1])
              axes[1, 1].set_title('2012-2018')
              sns.scatterplot(data=fifth, x='House_Price_Index', y='Mortgage_Rate', ax=axes[1, 2])
              axes[1, 2].set_title('2019-2022')
              plt.tight_layout()
              plt.show()
```



```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

In [110]:
              sns.scatterplot(data=first, x='House_Price_Index', y='Interest_Rate', ax=axes[0, 0])
              axes[0, 0].set_title('2003-2004')
              sns.scatterplot(data=first1, x='House_Price_Index', y='Interest_Rate', ax=axes[0, 1])
              axes[0, 1].set_title('2005-2007')
              sns.scatterplot(data=second, x='House_Price_Index', y='Interest_Rate', ax=axes[0, 2])
              axes[0, 2].set_title('2008-2011')
              sns.scatterplot(data=third, x='House_Price_Index', y='Interest_Rate', ax=axes[1, 0])
              axes[1, 0].set_title('2012-2022')
              sns.scatterplot(data=fourth, x='House_Price_Index', y='Interest_Rate', ax=axes[1, 1])
              axes[1, 1].set_title('2012-2018')
              sns.scatterplot(data=fifth, x='House_Price_Index', y='Interest_Rate', ax=axes[1, 2])
              axes[1, 2].set_title('2019-2022')
              plt.tight_layout()
              plt.show()
```



it is effective interest rate which is charged by central bank from other bank banks for lending

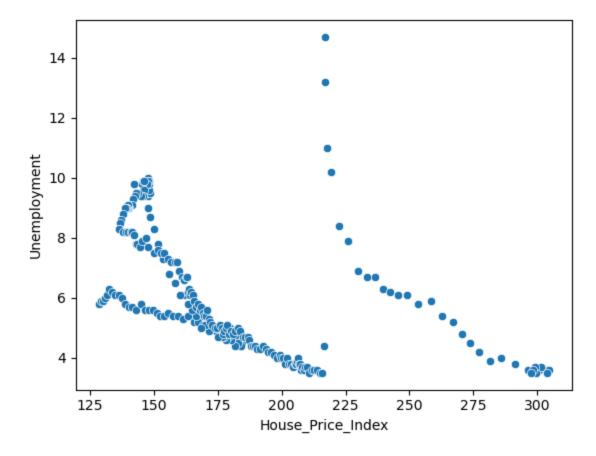
when there was situation of Great Recession and COVID, Effective Interest rate increased, # During 2019-2021, there was drop of economic activities, requirement of funds droped as well, this led to the lower efective interest rate

In []: ▶

Unemployment vs House Price Index

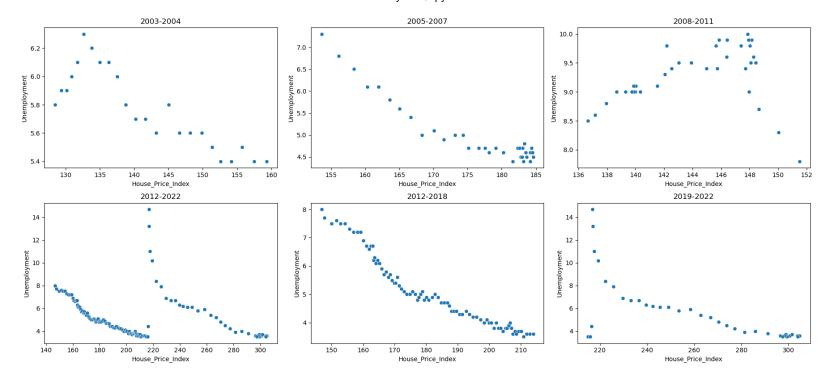
In [139]: sns.scatterplot(data=file, y='Unemployment', x='House_Price_Index')

Out[139]: <Axes: xlabel='House_Price_Index', ylabel='Unemployment'>



```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

In [111]:
              sns.scatterplot(data=first, x='House_Price_Index', y='Unemployment', ax=axes[0, 0])
              axes[0, 0].set_title('2003-2004')
              sns.scatterplot(data=first1, x='House_Price_Index', y='Unemployment', ax=axes[0, 1])
              axes[0, 1].set_title('2005-2007')
              sns.scatterplot(data=second, x='House_Price_Index', y='Unemployment', ax=axes[0, 2])
              axes[0, 2].set_title('2008-2011')
              sns.scatterplot(data=third, x='House_Price_Index', y='Unemployment', ax=axes[1, 0])
              axes[1, 0].set_title('2012-2022')
              sns.scatterplot(data=fourth, x='House_Price_Index', y='Unemployment', ax=axes[1, 1])
              axes[1, 1].set_title('2012-2018')
              sns.scatterplot(data=fifth, x='House_Price_Index', y='Unemployment', ax=axes[1, 2])
              axes[1, 2].set_title('2019-2022')
              plt.tight_layout()
              plt.show()
```



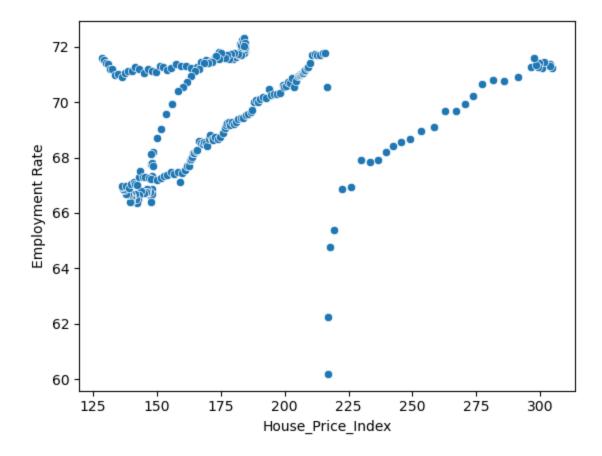
there is Negtive Linear Relationship Between House Price Index and Unmeployment # During 2003 to 2007, there was drop in unemployment but during period of Great Recession, there was increase in unemployment

In []: • N

Employment Rate vs House Price Index

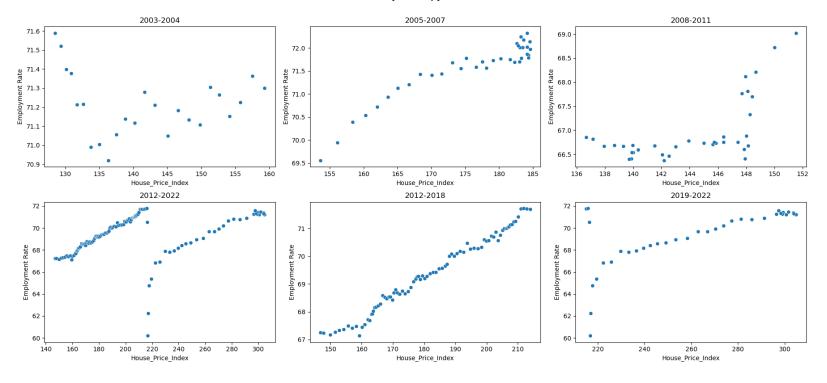
In [140]: ▶ sns.scatterplot(data=file, y='Employment Rate', x='House_Price_Index')

Out[140]: <Axes: xlabel='House_Price_Index', ylabel='Employment Rate'>



```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

In [112]:
              sns.scatterplot(data=first, x='House_Price_Index', y='Employment Rate', ax=axes[0, 0])
              axes[0, 0].set_title('2003-2004')
              sns.scatterplot(data=first1, x='House_Price_Index', y='Employment Rate', ax=axes[0, 1])
              axes[0, 1].set_title('2005-2007')
              sns.scatterplot(data=second, x='House_Price_Index', y='Employment Rate', ax=axes[0, 2])
              axes[0, 2].set_title('2008-2011')
              sns.scatterplot(data=third, x='House_Price_Index', y='Employment Rate', ax=axes[1, 0])
              axes[1, 0].set_title('2012-2022')
              sns.scatterplot(data=fourth, x='House_Price_Index', y='Employment Rate', ax=axes[1, 1])
              axes[1, 1].set_title('2012-2018')
              sns.scatterplot(data=fifth, x='House_Price_Index', y='Employment Rate', ax=axes[1, 2])
              axes[1, 2].set_title('2019-2022')
              plt.tight_layout()
              plt.show()
```

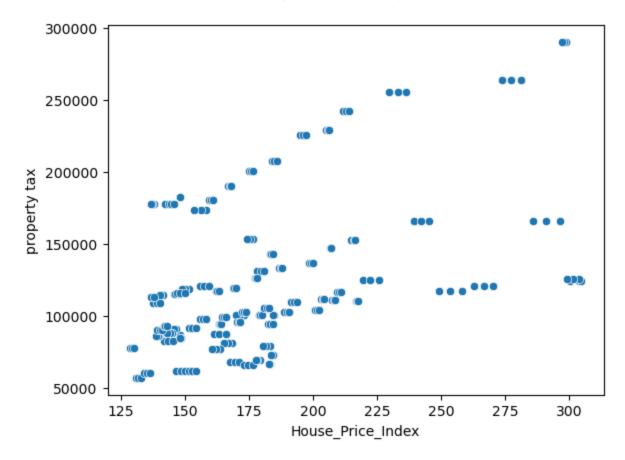


There is Linerar relationship Between Employment Rate and House Price Index # During 2008-2011, disturbance can be seen when there was Great Recession and effect can be seen on House Price Index

In []: ▶

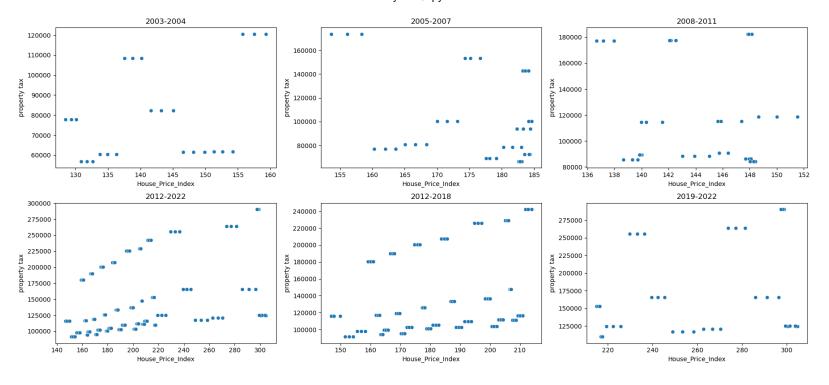
property tax vs House_Price_Index

Out[143]: <Axes: xlabel='House_Price_Index', ylabel='property tax'>



```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

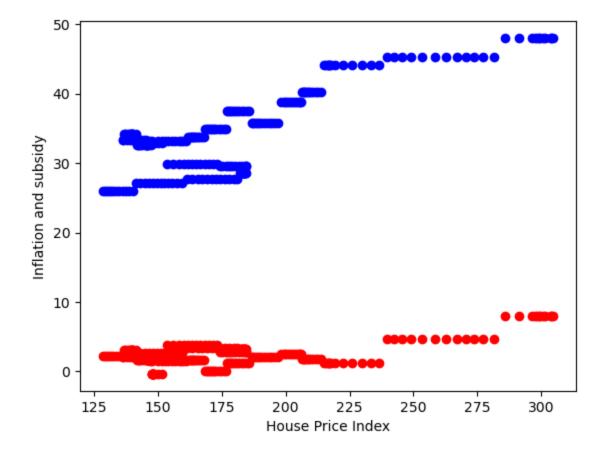
In [113]:
              sns.scatterplot(data=first, x='House_Price_Index', y='property tax', ax=axes[0, 0])
              axes[0, 0].set_title('2003-2004')
              sns.scatterplot(data=first1, x='House_Price_Index', y='property tax', ax=axes[0, 1])
              axes[0, 1].set_title('2005-2007')
              sns.scatterplot(data=second, x='House_Price_Index', y='property tax', ax=axes[0, 2])
              axes[0, 2].set_title('2008-2011')
              sns.scatterplot(data=third, x='House_Price_Index', y='property tax', ax=axes[1, 0])
              axes[1, 0].set_title('2012-2022')
              sns.scatterplot(data=fourth, x='House_Price_Index', y='property tax', ax=axes[1, 1])
              axes[1, 1].set_title('2012-2018')
              sns.scatterplot(data=fifth, x='House_Price_Index', y='property tax', ax=axes[1, 2])
              axes[1, 2].set_title('2019-2022')
              plt.tight_layout()
              plt.show()
```



graph shows that there is a positive correlation between property tax and the HPI. This means that when the HPI increases, property taxes also increase. This is because property taxes are calculated based on the assessed value of property, which is typically based on the market value of the property.

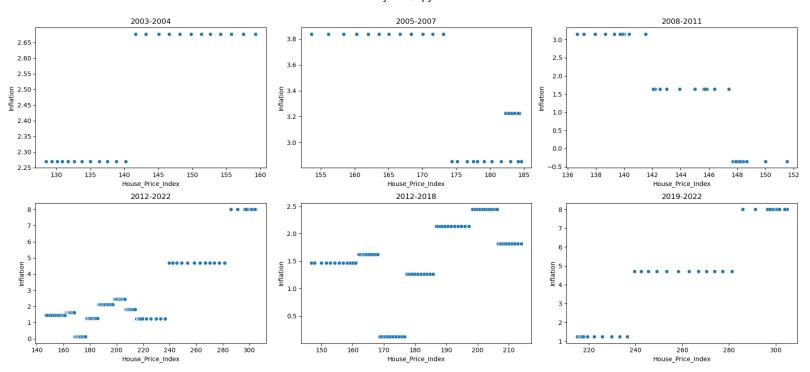
inflation and Subsidy vs House Price Index

Out[147]: Text(0.5, 0, 'House Price Index')



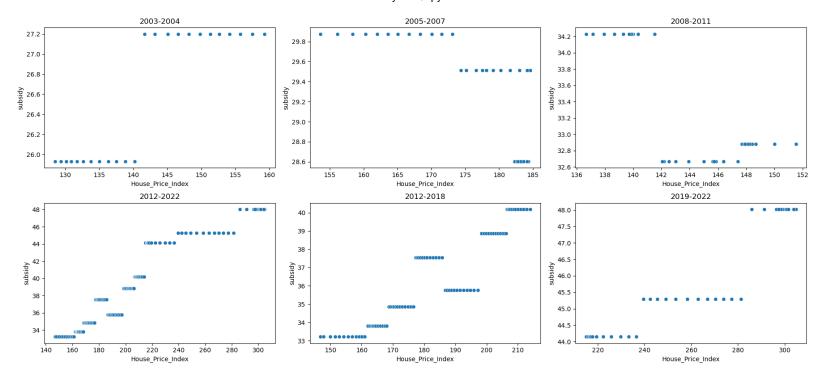
```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

In [114]:
              sns.scatterplot(data=first, x='House_Price_Index', y='Inflation', ax=axes[0, 0])
              axes[0, 0].set_title('2003-2004')
              sns.scatterplot(data=first1, x='House_Price_Index', y='Inflation', ax=axes[0, 1])
              axes[0, 1].set_title('2005-2007')
              sns.scatterplot(data=second, x='House_Price_Index', y='Inflation', ax=axes[0, 2])
              axes[0, 2].set_title('2008-2011')
              sns.scatterplot(data=third, x='House_Price_Index', y='Inflation', ax=axes[1, 0])
              axes[1, 0].set_title('2012-2022')
              sns.scatterplot(data=fourth, x='House_Price_Index', y='Inflation', ax=axes[1, 1])
              axes[1, 1].set_title('2012-2018')
              sns.scatterplot(data=fifth, x='House_Price_Index', y='Inflation', ax=axes[1, 2])
              axes[1, 2].set_title('2019-2022')
              plt.tight_layout()
              plt.show()
```



```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

In [115]:
              sns.scatterplot(data=first, x='House_Price_Index', y='subsidy', ax=axes[0, 0])
              axes[0, 0].set_title('2003-2004')
              sns.scatterplot(data=first1, x='House_Price_Index', y='subsidy', ax=axes[0, 1])
              axes[0, 1].set_title('2005-2007')
              sns.scatterplot(data=second, x='House_Price_Index', y='subsidy', ax=axes[0, 2])
              axes[0, 2].set_title('2008-2011')
              sns.scatterplot(data=third, x='House_Price_Index', y='subsidy', ax=axes[1, 0])
              axes[1, 0].set_title('2012-2022')
              sns.scatterplot(data=fourth, x='House_Price_Index', y='subsidy', ax=axes[1, 1])
              axes[1, 1].set_title('2012-2018')
              sns.scatterplot(data=fifth, x='House_Price_Index', y='subsidy', ax=axes[1, 2])
              axes[1, 2].set_title('2019-2022')
              plt.tight_layout()
              plt.show()
```



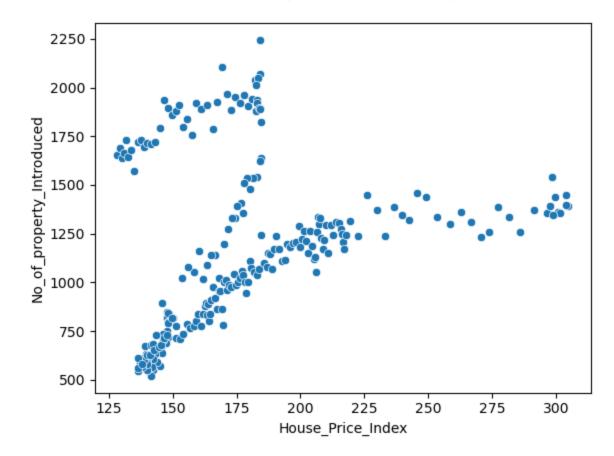
graph shows that there is a positive correlation between subsidies and the house price index. This means that when subsidies increase, the house price index also increases. This is because subsidies make housing more affordable, which increases demand. This leads to an increase in the house price index,

Inflation is the rate at which prices for goods and services are increasing. The house price index is the average price of all properties sold in a given period.graph shows that there is a general positive correlation between inflation and the house price index. This means that when inflation increases, the house price index also increases. This is because inflation makes all assets, including homes, more expensive. However, there are also periods of time when the house price index has risen faster than inflation

In []: **M**

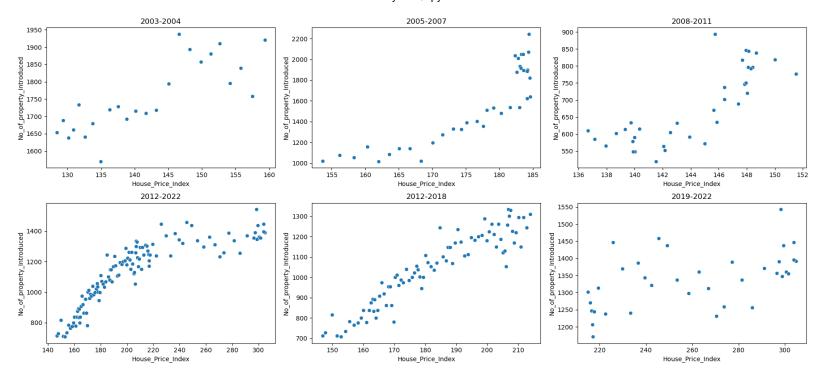
No_of_property_Introduced vs House_Price_Index

Out[148]: <Axes: xlabel='House_Price_Index', ylabel='No_of_property_Introduced'>



```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

In [117]:
              sns.scatterplot(data=first, x='House_Price_Index', y='No_of_property_Introduced', ax=axes[0, 0])
              axes[0, 0].set_title('2003-2004')
              sns.scatterplot(data=first1, x='House_Price_Index', y='No_of_property_Introduced', ax=axes[0, 1])
              axes[0, 1].set_title('2005-2007')
              sns.scatterplot(data=second, x='House_Price_Index', y='No_of_property_Introduced', ax=axes[0, 2])
              axes[0, 2].set_title('2008-2011')
              sns.scatterplot(data=third, x='House_Price_Index', y='No_of_property_Introduced', ax=axes[1, 0])
              axes[1, 0].set_title('2012-2022')
              sns.scatterplot(data=fourth, x='House_Price_Index', y='No_of_property_Introduced', ax=axes[1, 1])
              axes[1, 1].set_title('2012-2018')
              sns.scatterplot(data=fifth, x='House_Price_Index', y='No_of_property_Introduced', ax=axes[1, 2])
              axes[1, 2].set_title('2019-2022')
              plt.tight_layout()
              plt.show()
```

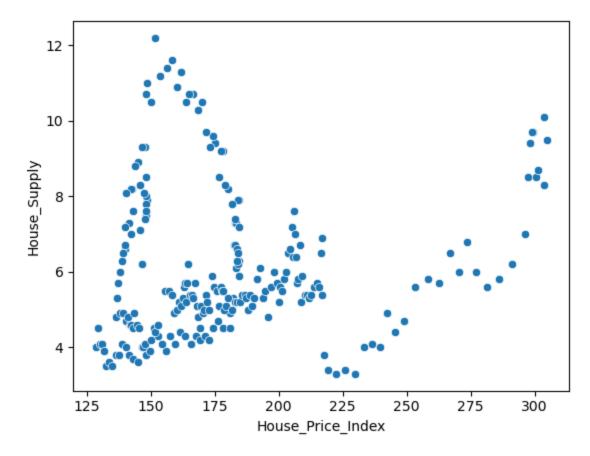


The scatter plot in the image shows the relationship between the number of properties introduced and the house price index in the United States from 1900 to 2022. The number of properties introduced is the number of properties that have been introduced to the market. The house price index is the average price of all properties sold in a given period

graph shows that there is a positive correlation between the number of properties introduced and the house price index. This means that when the number of properties introduced increases, the house price index also increases

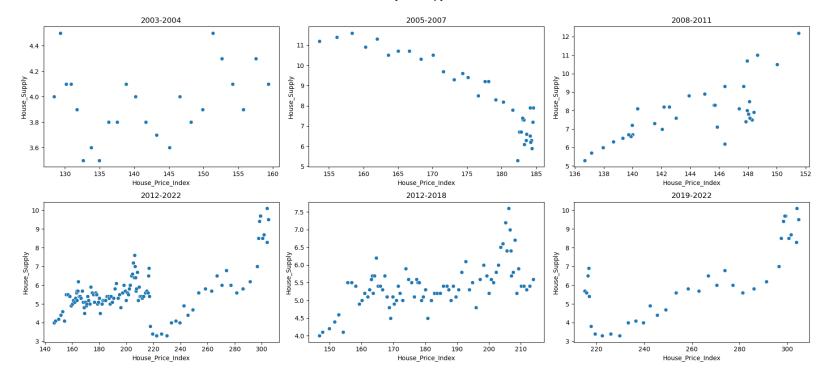
House_Supply vs House_Price_Index

Out[151]: <Axes: xlabel='House_Price_Index', ylabel='House_Supply'>



```
▶ fig, axes = plt.subplots(nrows=2, ncols=3, figsize=(18, 8))

In [116]:
              sns.scatterplot(data=first, x='House_Price_Index', y='House_Supply', ax=axes[0, 0])
              axes[0, 0].set_title('2003-2004')
              sns.scatterplot(data=first1, x='House_Price_Index', y='House_Supply', ax=axes[0, 1])
              axes[0, 1].set_title('2005-2007')
              sns.scatterplot(data=second, x='House_Price_Index', y='House_Supply', ax=axes[0, 2])
              axes[0, 2].set_title('2008-2011')
              sns.scatterplot(data=third, x='House_Price_Index', y='House_Supply', ax=axes[1, 0])
              axes[1, 0].set_title('2012-2022')
              sns.scatterplot(data=fourth, x='House_Price_Index', y='House_Supply', ax=axes[1, 1])
              axes[1, 1].set_title('2012-2018')
              sns.scatterplot(data=fifth, x='House_Price_Index', y='House_Supply', ax=axes[1, 2])
              axes[1, 2].set_title('2019-2022')
              plt.tight_layout()
              plt.show()
```



The house price index and house supply have a negative relationship. This means that when the house price index increases, the house supply decreases. This is because as the price of houses increases, fewer people are able to afford to buy them, which reduces demand. This leads to a decrease in the house supply, as sellers are less likely to sell their homes if they know that there is less demand for them.

The scatter plot in the image shows the relationship between the house price index and house supply in the United States from 2003 to 2022. As you can see, there is a clear negative correlation between the two variables. In periods when the house price index was high, such as in 2005-2007, the house supply was low. Conversely, in periods when the house price index was low, such as in 2008-2011, the house supply was high.

Economic conditions: A strong economy will typically lead to higher demand for housing, which can drive up house prices and reduce house supply.

Interest rates: Higher interest rates can make it more expensive to borrow money to buy a home, which can reduce demand and increase house supply.

Government policies: Government policies, such as tax breaks for first-time homebuyers, can increase demand for housing and drive up house prices.

```
In [ ]: ▶
```

Report

```
# House Price Index
# there was rise in house price from 2004 to 2006
# dcline in house Price from 2007 upto 2012
# there was rise in house price index from 2013
# there was revolutionary change from 2020 and onword
# PPI vs House_Price_Index
# The Producer Price Index by Commodity: Special Indexes: Construction Materials (PPI-CM) is a
statistical measure of the change in prices paid by producers for materials and components used in
construction
# there is sort of linear relationship between PPi and Price of Houses, if PPI increase then house prices
will increase as well
# in between 2008 to 2013, when PPI is high but house price index is low this is because of Great
Recession, this means for construction high expenses was incurred as compared to price charged from
customers
# from 2003 to 2005, when there is rise in Producer Price Index and House Price Index, there is Linear
relationship between PPI and House Price Index. it s contributing as well in consistent rise in House
Price Index
# During 2008 and 2011, There is negtive relationship between House Price Index and Producer Price Index
due to Great Recession
# as per above graph, economy is trying to recover from Recession
# Again PPI and House Price Index started lising Linearly from 2012
# population and working Population vs House_Price_Index
# as per above both graphs, as you can see when population is rising the house price index is rising as
well, but during 2008 to 2013 due to great recession house price index droped and then again started
rising
# Real_m2 vs House_Price_Index
```

- # Real M2 and House Price Index, there is linear relationship between real M2 and House Price index, affect of Great Recession can be seen in graph, otherwise there is clear linear relationship between Real M2 and House Price Index
- # When Real Money Stock is rising and House Price Index is rising as well
- # in Between 2003 and 2005, there is aggresive increase in Real M2 but House Price is increasing at normal rate in start
- # During 2008- 2011, there is negtive Linear Relationship between Real M2 and House Price Index, Supply of money after considering inflation is decreasing
- # During 2019 and 2022, there was drastic chnage in Real M2 and then increase in real m2 was normal
- # Velocity_m2 vs House_Price_Index
- # there is negtive Linear relationship between House Price Index and Velocity M2 and affect of Great Recession can be seen in graph
- #Government_Exp vs House_Price_Index
- ## During 2003 and 2005, there is linear relationship between House Price Index and Governement exp, economy growth is normal
- # During 2008 and 2011 and 2005 and 2007 , when there was situation of Great Recession, there was drop of Government expensiture
- # During 2012 2018, government incurred expenditure to revive the economy from Recession as per requirement
- # during 2019 to 2022, which was period of covid, government incurred even high as compared to previous records
- # Urban_cpi vs House_Price_Index
- # There is Linear relationship between Urban_cpi and House Price Index, also the affect of Great Recession can be seen in graph
- # During 2005-2007 and 2008-2011, When there was Great Recession, drop of Urban Consumer Price Index and House Price Index can be seen
- # During 2012-2018, consistent rise in urban consumer price index and House Price Index can be seen when economy started Recovering from Great Recession

During 2021 and 2022, there was drastic change in Consumer Price Index, this could be due to end of lockdown due to covid

- # Income vs House Price Index
- # there is sort of Linear Relationship Between Income and House Price Index, it contains some Outliers
- # also the affect of Great Recession can be seen
- # if income will increase then demand of houses will increase too which will lead to high price index, if supply of house is not enough to meet demand
- # income does not contribute much in increasing the House Price Index
- # There are Two siuation first is of Great Recession and and Covid
- # During 2005-2007 and 2008-2011, there was situation of Great Recession, reduction can be seen in income level and House Price Index
- # During the 2019-2022, small drop can be seen in House Price Index and Income Level
- # GDP vs House Price Index
- # if we do not consider the situation of covid and Great Recession, there was linear relationship between GDP and House Price Index
- # During 2008 and 2011, there was drop in GDP and House Price Index due to Great Recession
- # During 2019-2022, there was drop in gdp during COVID but after slowly is started to reach on top
- # CPI vs House Price Index
- # it is same as urban cpi, during Great Recession there was decrese in CPI
- # there was little drop in CPI during COVID
- # Interest_Rate vs House Price Index
- # it is effective interest rate which is charged by central bank from other bank banks for lending
- # when there was situation of Great Recession and COVID, Effective Interest rate increased,
- # During 2019-2021, there was drop of economic activities, requirement of funds droped as well, this led to the lower efective interest rate
- # Unemployment vs House Price Index
- # there is Negtive Linear Relationship Between House Price Index and Unmeployment

During 2003 to 2007, there was drop in unemployment but during period of Great Recession, there was increase in unemployment

- # Employment Rate vs House Price Index
- # There is Linerar relationship Between Employment Rate and House Price Index
- # During 2008-2011, disturbance can be seen when there was Great Recession and effect can be seen on House Price Index
- # House Supply vs House Price Index
- # The house price index and house supply have a negative relationship. This means that when the house price index increases, the house supply decreases. This is because as the price of houses increases, fewer people are able to afford to buy them, which reduces demand. This leads to a decrease in the house supply, as sellers are less likely to sell their homes if they know that there is less demand for them.

The scatter plot in the image shows the relationship between the house price index and house supply in the United States from 2003 to 2022. As you can see, there is a clear negative correlation between the two variables. In periods when the house price index was high, such as in 2005-2007, the house supply was low. Conversely, in periods when the house price index was low, such as in 2008-2011, the house supply was high.

- # No of property Introduced vs House Price Index
- # The scatter plot in the image shows the relationship between the number of properties introduced and the house price index in the United States from 1900 to 2022. The number of properties introduced is the number of properties that have been introduced to the market. The house price index is the average price of all properties sold in a given period
- # graph shows that there is a positive correlation between the number of properties introduced and the house price index. This means that when the number of properties introduced increases, the house price index also increases
- # inflation and Subsidy vs House Price Index
- # graph shows that there is a positive correlation between subsidies and the house price index. This means that when subsidies increase, the house price index also increases. This is because subsidies make housing more affordable, which increases demand. This leads to an increase in the house price index,

Inflation is the rate at which prices for goods and services are increasing. The house price index is the average price of all properties sold in a given period.graph shows that there is a general positive correlation between inflation and the house price index. This means that when inflation increases, the house price index also increases. This is because inflation makes all assets, including homes, more expensive. However, there are also periods of time when the house price index has risen faster than inflation

property tax vs House_Price_Index

graph shows that there is a positive correlation between property tax and the HPI. This means that when the HPI increases, property taxes also increase. This is because property taxes are calculated based on the assessed value of property, which is typically based on the market value of the property.

In []:

Overall Report

House Price Index Report Summary Overall Trend:

The house price index has been rising steadily since 2003, with a few exceptions. There were significant declines during the Great Recession (2008-2011) and a minor dip during the COVID-19 pandemic (2019-2022).

Key Factors Influencing House Price Index:

Producer Price Index (PPI): There is a general positive correlation between PPI and the house price index. When the cost of construction materials increases, house prices are likely to follow suit.

Population and Working Population: As the population grows, the demand for housing increases, leading to higher prices.

Real M2: This refers to the amount of money circulating in the economy after adjusting for inflation. There is a positive correlation between Real M2 and the house price index.

Velocity M2: This measures how quickly money circulates in the economy. There is a negative correlation between Velocity M2 and the house price index.

Government Expenditure: Government spending can stimulate the economy and lead to higher house prices. Urban CPI: The Urban Consumer Price Index measures inflation for urban households. There is a positive correlation between Urban CPI and the house price index.

Income: There is a positive correlation between income and the house price index. Higher incomes allow people to afford more expensive houses.

GDP: There is a positive correlation between GDP and the house price index. A strong economy leads to higher demand for housing, which can drive up prices.

Interest Rate: The effective interest rate charged by banks can influence the demand for housing. Lower interest rates make it easier for people to afford mortgages, which can lead to higher house prices. Unemployment: There is a negative correlation between unemployment and the house price index. Higher unemployment rates lead to lower demand for housing, which can depress prices.

Employment Rate: There is a positive correlation between the employment rate and the house price index. A higher number of people employed means more potential buyers, which can lead to higher house prices. House Supply: There is a negative correlation between house supply and the house price index. A higher supply of houses can lead to lower prices, while a lower supply can lead to higher prices.

No. of Property Introduced: There is a positive correlation between the number of properties introduced and the house price index. This is likely because a higher supply of properties can lead to lower prices. Inflation and Subsidy: There is a positive correlation between subsidies and the house price index. Subsidies make housing more affordable, which increases demand and can lead to higher prices. There is also a general positive correlation between inflation and the house price index, as inflation makes all assets, including homes, more expensive.

Property Tax: There is a positive correlation between property tax and the house price index. This is because property taxes are calculated based on the assessed value of property, which is typically based on the market value of the property.

Future Outlook:

The future outlook for the house price index is uncertain. Some factors, such as rising interest rates and a potential recession, could lead to lower prices. However, other factors, such as a strong economy and a growing population, could support continued price growth.

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