

Importing enrolment file1

```
In [1]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
df1 = pd.read_csv('/Users/karansingh/Desktop/DAtaHackathon/api_data_aadhar_e
```

```
In [2]: df1.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 500000 entries, 0 to 499999
Data columns (total 7 columns):
 #   Column           Non-Null Count  Dtype  
--- 
 0   date             500000 non-null   object 
 1   state            500000 non-null   object 
 2   district          500000 non-null   object 
 3   pincode          500000 non-null   int64  
 4   age_0_5           500000 non-null   int64  
 5   age_5_17          500000 non-null   int64  
 6   age_18_greater    500000 non-null   int64  
dtypes: int64(4), object(3)
memory usage: 26.7+ MB
```

```
In [3]: df1.shape
```

```
Out[3]: (500000, 7)
```

```
In [4]: df1.columns
```

```
Out[4]: Index(['date', 'state', 'district', 'pincode', 'age_0_5', 'age_5_17',
               'age_18_greater'],
              dtype='object')
```

```
In [5]: df1['state'].unique()
```

```
Out[5]: array(['Meghalaya', 'Karnataka', 'Uttar Pradesh', 'Bihar', 'Maharashtra',
               'Haryana', 'Rajasthan', 'Punjab', 'Delhi', 'Madhya Pradesh',
               'West Bengal', 'Assam', 'Uttarakhand', 'Gujarat', 'Andhra Pradesh',
               'Tamil Nadu', 'Chhattisgarh', 'Jharkhand', 'Nagaland', 'Manipur',
               'Telangana', 'Tripura', 'Mizoram', 'Jammu and Kashmir',
               'Chandigarh', 'Sikkim', 'Odisha', 'Kerala',
               'The Dadra And Nagar Haveli And Daman And Diu',
               'Arunachal Pradesh', 'Himachal Pradesh', 'Goa',
               'Jammu And Kashmir', 'Dadra and Nagar Haveli and Daman and Diu',
               'Ladakh', 'Andaman and Nicobar Islands', 'Orissa', 'Pondicherry',
               'Puducherry', 'Lakshadweep', 'Andaman & Nicobar Islands',
               'Dadra & Nagar Haveli', 'Dadra and Nagar Haveli', 'Daman and Diu',
               'WEST BENGAL', 'Jammu & Kashmir', 'West Bengal', '1000000',
               'Daman & Diu', 'West Bangal', 'Westbengal', 'West bengal',
               'andhra pradesh', 'ODISHA'], dtype=object)
```

```
In [6]: df1['new_date'] = pd.to_datetime(df1['date'], format='%d-%m-%Y').dt.strftime(df1)
```

```
Out[6]:
```

	date	state	district	pincode	age_0_5	age_5_17	age_18_greater
0	02-03-2025	Meghalaya	East Khasi Hills	793121	11	61	37
1	09-03-2025	Karnataka	Bengaluru Urban	560043	14	33	39
2	09-03-2025	Uttar Pradesh	Kanpur Nagar	208001	29	82	12
3	09-03-2025	Uttar Pradesh	Aligarh	202133	62	29	15
4	09-03-2025	Karnataka	Bengaluru Urban	560016	14	16	21
...
499995	26-10-2025	Andhra Pradesh	Mahbubnagar	509207	1	0	0
499996	26-10-2025	Andhra Pradesh	Medak	502220	1	0	0
499997	26-10-2025	Andhra Pradesh	Medak	502256	0	1	0
499998	26-10-2025	Andhra Pradesh	Medak	502286	1	0	0
499999	26-10-2025	Andhra Pradesh	N. T. R	521402	1	0	0

500000 rows × 8 columns

```
In [7]: df1['new_date'].isnull().sum()
```

```
Out[7]: np.int64(0)
```

```
In [8]: print(df1['new_date'].min())
print(df1['new_date'].max())
```

20250302
20251026

```
In [9]: ## check null value  
df1['state'].isnull().sum()
```

```
Out[9]: np.int64(0)
```

```
In [10]: ## check state column  
df1['state'].nunique()
```

```
Out[10]: 54
```

```
In [11]: df1['state'].unique()
```

```
Out[11]: array(['Meghalaya', 'Karnataka', 'Uttar Pradesh', 'Bihar', 'Maharashtra',  
       'Haryana', 'Rajasthan', 'Punjab', 'Delhi', 'Madhya Pradesh',  
       'West Bengal', 'Assam', 'Uttarakhand', 'Gujarat', 'Andhra Pradesh',  
       'Tamil Nadu', 'Chhattisgarh', 'Jharkhand', 'Nagaland', 'Manipur',  
       'Telangana', 'Tripura', 'Mizoram', 'Jammu and Kashmir',  
       'Chandigarh', 'Sikkim', 'Odisha', 'Kerala',  
       'The Dadra And Nagar Haveli And Daman And Diu',  
       'Arunachal Pradesh', 'Himachal Pradesh', 'Goa',  
       'Jammu And Kashmir', 'Dadra and Nagar Haveli and Daman and Diu',  
       'Ladakh', 'Andaman and Nicobar Islands', 'Orissa', 'Pondicherry',  
       'Puducherry', 'Lakshadweep', 'Andaman & Nicobar Islands',  
       'Dadra & Nagar Haveli', 'Dadra and Nagar Haveli', 'Daman and Diu',  
       'WEST BENGAL', 'Jammu & Kashmir', 'West Bengal', '100000',  
       'Daman & Diu', 'West Bangal', 'Westbengal', 'West bengal',  
       'andhra pradesh', 'ODISHA'], dtype=object)
```

Import enrolment file2

```
In [12]: df2 = pd.read_csv('/Users/karansingh/Desktop/DATAHackathon/api_data_aadhar_enrolment.csv')
```

```
In [13]: df2.info()
```

```
<class 'pandas.core.frame.DataFrame'>  
RangeIndex: 500000 entries, 0 to 499999  
Data columns (total 7 columns):  
 #   Column           Non-Null Count  Dtype     
 ---  --  
 0   date             500000 non-null   object    
 1   state            500000 non-null   object    
 2   district          500000 non-null   object    
 3   pincode           500000 non-null   int64    
 4   age_0_5            500000 non-null   int64    
 5   age_5_17           500000 non-null   int64    
 6   age_18_greater     500000 non-null   int64    
 dtypes: int64(4), object(3)  
 memory usage: 26.7+ MB
```

```
In [14]: df2.shape
```

```
Out[14]: (500000, 7)
```

```
In [15]: df2.columns
```

```
Out[15]: Index(['date', 'state', 'district', 'pincode', 'age_0_5', 'age_5_17',
       'age_18_greater'],
       dtype='object')
```

```
In [16]: df2['state'].unique()
```

```
Out[16]: array(['Andhra Pradesh', 'Arunachal Pradesh', 'Assam', 'West Bengal',
       'Chhattisgarh', 'Delhi', 'Goa', 'Gujarat', 'Haryana',
       'Himachal Pradesh', 'Jammu and Kashmir', 'Jharkhand', 'Karnataka',
       'Kerala', 'Ladakh', 'Lakshadweep', 'Madhya Pradesh', 'Maharashtra',
       'Manipur', 'Meghalaya', 'Mizoram', 'Nagaland', 'Odisha', 'Orissa',
       'Pondicherry', 'Puducherry', 'Punjab', 'Rajasthan', 'Tamil Nadu',
       'Telangana', 'Tripura', 'Uttar Pradesh', 'Uttarakhand',
       'Andaman & Nicobar Islands', 'Andaman and Nicobar Islands',
       'Bihar', 'Chandigarh', 'Sikkim', 'West Bangal',
       'Dadra and Nagar Haveli', 'Daman and Diu',
       'Dadra and Nagar Haveli and Daman and Diu', 'Jammu & Kashmir',
       'Andhra Pradesh', 'Dadra & Nagar Haveli', 'West Bengal',
       'Daman & Diu', 'WESTBENGAL', 'West bengal', 'West Bengal',
       'WEST BENGAL', '100000'], dtype=object)
```

```
In [17]: df2['new_date']=pd.to_datetime(df2['date']).dt.strftime('%Y%m%d')
df2
```

```
/var/folders/bf/c5g8t8hs08j4x62fvvx5j4100000gn/T/ipykernel_24203/548265193.py:1: UserWarning: Parsing dates in %d-%m-%Y format when dayfirst=False (the default) was specified. Pass `dayfirst=True` or specify a format to silence this warning.
```

```
df2['new_date']=pd.to_datetime(df2['date']).dt.strftime('%Y%m%d')
```

Out[17]:

	date	state	district	pincode	age_0_5	age_5_17	age_18_greater	n
0	26-10-2025	Andhra Pradesh	Nalgonda	508004	0	1		0 2
1	26-10-2025	Andhra Pradesh	Nalgonda	508238	1	0		0 2
2	26-10-2025	Andhra Pradesh	Nalgonda	508278	1	0		0 2
3	26-10-2025	Andhra Pradesh	Nandyal	518432	0	1		0 2
4	26-10-2025	Andhra Pradesh	Nandyal	518543	1	0		0 2
...
499995	31-12-2025	Telangana	Hyderabad	500045	4	5		1 2
499996	31-12-2025	Telangana	Hyderabad	500057	0	2		0 2
499997	31-12-2025	Telangana	Hyderabad	500061	4	2		0 2
499998	31-12-2025	Telangana	Hyderabad	500062	1	4		0 2
499999	31-12-2025	Telangana	Hyderabad	500095	0	1		0 2

500000 rows × 8 columns

In [18]: `df2['new_date'].isnull().sum()`

Out[18]: `np.int64(0)`

In [19]: `print(df2['new_date'].min())`
`print(df2['new_date'].max())`

20251026
20251231

In [20]: `## check null value`
`df2['state'].isnull().sum()`

```
Out[20]: np.int64(0)
```

```
In [21]: df2['state'].nunique()
```

```
Out[21]: 52
```

```
In [22]: df2['state'].unique()
```

```
Out[22]: array(['Andhra Pradesh', 'Arunachal Pradesh', 'Assam', 'West Bengal',
   'Chhattisgarh', 'Delhi', 'Goa', 'Gujarat', 'Haryana',
   'Himachal Pradesh', 'Jammu and Kashmir', 'Jharkhand', 'Karnataka',
   'Kerala', 'Ladakh', 'Lakshadweep', 'Madhya Pradesh', 'Maharashtra',
   'Manipur', 'Meghalaya', 'Mizoram', 'Nagaland', 'Odisha', 'Orissa',
   'Pondicherry', 'Puducherry', 'Punjab', 'Rajasthan', 'Tamil Nadu',
   'Telangana', 'Tripura', 'Uttar Pradesh', 'Uttarakhand',
   'Andaman & Nicobar Islands', 'Andaman and Nicobar Islands',
   'Bihar', 'Chandigarh', 'Sikkim', 'West Bengal',
   'Dadra and Nagar Haveli', 'Daman and Diu',
   'Dadra and Nagar Haveli and Daman and Diu', 'Jammu & Kashmir',
   'andhra pradesh', 'Dadra & Nagar Haveli', 'Westbengal',
   'Daman & Diu', 'WESTBENGAL', 'West bengal', 'West Bengal',
   'WEST BENGAL', '100000'], dtype=object)
```

Import enrolment file 3

```
In [23]: df3 = pd.read_csv('/Users/karansingh/Desktop/DAtaHackathon/api_data_aadhar_enrolment.csv')
df3
```

Out[23]:

	date	state	district	pincode	age_0_5	age_5_17	age_18_greater
0	31-12-2025	Karnataka	Bidar	585330	2	3	0
1	31-12-2025	Karnataka	Bidar	585402	6	0	0
2	31-12-2025	Karnataka	Bidar	585413	1	0	0
3	31-12-2025	Karnataka	Bidar	585418	1	2	0
4	31-12-2025	Karnataka	Bidar	585421	4	3	0
...
6024	31-12-2025	West Bengal	West Midnapore	721149	2	0	0
6025	31-12-2025	West Bengal	West Midnapore	721150	2	2	0
6026	31-12-2025	West Bengal	West Midnapore	721305	0	1	0
6027	31-12-2025	West Bengal	West Midnapore	721504	1	0	0
6028	31-12-2025	West Bengal	West Midnapore	721517	2	1	0

6029 rows × 7 columns

In [24]:

```
df3.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 6029 entries, 0 to 6028
Data columns (total 7 columns):
 #   Column            Non-Null Count  Dtype  
--- 
 0   date              6029 non-null    object  
 1   state              6029 non-null    object  
 2   district           6029 non-null    object  
 3   pincode            6029 non-null    int64  
 4   age_0_5             6029 non-null    int64  
 5   age_5_17            6029 non-null    int64  
 6   age_18_greater      6029 non-null    int64  
dtypes: int64(4), object(3)
memory usage: 329.8+ KB
```

```
In [25]: df3.head()
```

```
Out[25]:
```

	date	state	district	pincode	age_0_5	age_5_17	age_18_greater
0	31-12-2025	Karnataka	Bidar	585330	2	3	0
1	31-12-2025	Karnataka	Bidar	585402	6	0	0
2	31-12-2025	Karnataka	Bidar	585413	1	0	0
3	31-12-2025	Karnataka	Bidar	585418	1	2	0
4	31-12-2025	Karnataka	Bidar	585421	4	3	0

```
In [26]: df3.shape
```

```
Out[26]: (6029, 7)
```

```
In [27]: df3['state'].unique()
```

```
Out[27]: array(['Karnataka', 'Kerala', 'Ladakh', 'Lakshadweep', 'Madhya Pradesh',
       'Maharashtra', 'Manipur', 'Meghalaya', 'Mizoram', 'Nagaland',
       'Odisha', 'Orissa', 'Puducherry', 'Punjab', 'Rajasthan', 'Sikkim',
       'Tamil Nadu', 'Telangana', 'Tripura', 'Uttar Pradesh',
       'Uttarakhand', 'West Bengal', 'Andhra Pradesh',
       'Arunachal Pradesh', 'Assam', 'Bihar', 'Chandigarh',
       'Chhattisgarh', 'Daman and Diu', 'Delhi', 'Goa', 'Gujarat',
       'Haryana', 'Himachal Pradesh', 'Jammu and Kashmir', 'Jharkhand',
       'Pondicherry'], dtype=object)
```

```
In [28]: df3['new_date']=pd.to_datetime(df3['date']).dt.strftime('%Y%m%d')
df3
```

```
/var/folders/bf/c5g8t8hs08j4x62fvvx5j410000gn/T/ipykernel_24203/880774394.py:1: UserWarning: Parsing dates in %d-%m-%Y format when dayfirst=False (the default) was specified. Pass `dayfirst=True` or specify a format to silence this warning.
```

```
df3['new_date']=pd.to_datetime(df3['date']).dt.strftime('%Y%m%d')
```

Out[28]:

	date	state	district	pincode	age_0_5	age_5_17	age_18_greater	new
0	31-12-2025	Karnataka	Bidar	585330	2	3	0	2024
1	31-12-2025	Karnataka	Bidar	585402	6	0	0	2024
2	31-12-2025	Karnataka	Bidar	585413	1	0	0	2024
3	31-12-2025	Karnataka	Bidar	585418	1	2	0	2024
4	31-12-2025	Karnataka	Bidar	585421	4	3	0	2024
...
6024	31-12-2025	West Bengal	West Midnapore	721149	2	0	0	2024
6025	31-12-2025	West Bengal	West Midnapore	721150	2	2	0	2024
6026	31-12-2025	West Bengal	West Midnapore	721305	0	1	0	2024
6027	31-12-2025	West Bengal	West Midnapore	721504	1	0	0	2024
6028	31-12-2025	West Bengal	West Midnapore	721517	2	1	0	2024

6029 rows × 8 columns

In [29]: `df3['new_date'].isnull().sum()`

Out[29]: `np.int64(0)`

In [30]: `print(df3['new_date'].min())`
`print(df3['new_date'].max())`

20251231
20251231

In [31]: `## check null value`
`df3['state'].isnull().sum()`

```
Out[31]: np.int64(0)
```

```
In [32]: ## check state column  
df3['state'].nunique()
```

```
Out[32]: 37
```

```
In [33]: df3['state'].unique()
```

```
Out[33]: array(['Karnataka', 'Kerala', 'Ladakh', 'Lakshadweep', 'Madhya Pradesh',  
               'Maharashtra', 'Manipur', 'Meghalaya', 'Mizoram', 'Nagaland',  
               'Odisha', 'Orissa', 'Puducherry', 'Punjab', 'Rajasthan', 'Sikkim',  
               'Tamil Nadu', 'Telangana', 'Tripura', 'Uttar Pradesh',  
               'Uttarakhand', 'West Bengal', 'Andhra Pradesh',  
               'Arunachal Pradesh', 'Assam', 'Bihar', 'Chandigarh',  
               'Chhattisgarh', 'Daman and Diu', 'Delhi', 'Goa', 'Gujarat',  
               'Haryana', 'Himachal Pradesh', 'Jammu and Kashmir', 'Jharkhand',  
               'Pondicherry'], dtype=object)
```

Merging three datasets

```
In [34]: df = pd.concat([df1,df2,df3],ignore_index=True)  
df.shape
```

```
Out[34]: (1006029, 8)
```

```
In [35]: df.head()
```

```
Out[35]:   date      state    district  pincode  age_0_5  age_5_17  age_18_greater  new_date  
0  02-  
  03-  
  2025  Meghalaya  East Khasi Hills    793121       11        61                 37  2025030  
1  09-  
  03-  
  2025  Karnataka  Bengaluru Urban    560043       14        33                 39  2025030  
2  09-  
  03-  
  2025  Uttar Pradesh  Kanpur Nagar    208001       29        82                 12  2025030  
3  09-  
  03-  
  2025  Uttar Pradesh    Aligarh    202133       62        29                 15  2025030  
4  09-  
  03-  
  2025  Karnataka  Bengaluru Urban    560016       14        16                 21  2025030
```

```
In [36]: df['new_date'].isnull().sum()
```

```
Out[36]: np.int64(0)
```

```
In [37]: df['state'].value_counts()
```

Out[37]: state	
Uttar Pradesh	110369
Tamil Nadu	92552
Maharashtra	77191
West Bengal	76519
Karnataka	70198
Andhra Pradesh	65658
Bihar	60567
Rajasthan	56159
Madhya Pradesh	50225
Gujarat	46624
Odisha	43691
Telangana	42774
Kerala	39145
Assam	31827
Jharkhand	23218
Punjab	20439
Chhattisgarh	18550
Haryana	15997
Jammu and Kashmir	11314
Himachal Pradesh	10346
Uttarakhand	10007
Delhi	6804
Meghalaya	3771
Tripura	3729
Orissa	3319
Manipur	3218
Nagaland	1999
Arunachal Pradesh	1601
Goa	1527
Mizoram	1481
Puducherry	1042
Sikkim	1010
Chandigarh	859
Pondicherry	817
Ladakh	304
Andaman and Nicobar Islands	289
Dadra and Nagar Haveli	162
Lakshadweep	159
Jammu & Kashmir	139
Dadra and Nagar Haveli and Daman and Diu	116
Andaman & Nicobar Islands	103
Daman and Diu	92
Dadra & Nagar Haveli	24
100000	22
Daman & Diu	20
West Bengal	15
West Bangal	9
West bengal	7
Westbengal	6
andhra pradesh	5
WEST BENGAL	4
Jammu And Kashmir	2
The Dadra And Nagar Haveli And Daman And Diu	2
ODISHA	1

```
WESTBENGAL
```

```
1
```

```
Name: count, dtype: int64
```

```
In [38]: df['state'].nunique()
```

```
Out[38]: 55
```

```
In [39]: df['state'].unique()
```

```
Out[39]: array(['Meghalaya', 'Karnataka', 'Uttar Pradesh', 'Bihar', 'Maharashtra',
   'Haryana', 'Rajasthan', 'Punjab', 'Delhi', 'Madhya Pradesh',
   'West Bengal', 'Assam', 'Uttarakhand', 'Gujarat', 'Andhra Pradesh',
   'Tamil Nadu', 'Chhattisgarh', 'Jharkhand', 'Nagaland', 'Manipur',
   'Telangana', 'Tripura', 'Mizoram', 'Jammu and Kashmir',
   'Chandigarh', 'Sikkim', 'Odisha', 'Kerala',
   'The Dadra And Nagar Haveli And Daman And Diu',
   'Arunachal Pradesh', 'Himachal Pradesh', 'Goa',
   'Jammu And Kashmir', 'Dadra and Nagar Haveli and Daman and Diu',
   'Ladakh', 'Andaman and Nicobar Islands', 'Orissa', 'Pondicherry',
   'Puducherry', 'Lakshadweep', 'Andaman & Nicobar Islands',
   'Dadra & Nagar Haveli', 'Dadra and Nagar Haveli', 'Daman and Diu',
   'WEST BENGAL', 'Jammu & Kashmir', 'West Bengal', '100000',
   'Daman & Diu', 'West Bangal', 'Westbengal', 'West bengal',
   'andhra pradesh', 'ODISHA', 'WESTBENGAL'], dtype=object)
```

```
In [ ]:
```

```
In [40]: import pandas as pd
import re
```

```
def clean_state_name(x):
    if pd.isna(x):
        return x
    x = str(x).lower()
    x = re.sub(r'^[a-z]', '', x) # remove symbols like &
    x = re.sub(r'\s+', ' ', x).strip() # remove extra spaces
    return x
```

```
In [41]: state_mapping = {
    # Andhra Pradesh
    "andhrapradesh": "Andhra Pradesh",
```

```
    # Arunachal Pradesh
    "arunachalpradesh": "Arunachal Pradesh",
```

```
    # Assam
    "assam": "Assam",
```

```
    # Bihar
    "bihar": "Bihar",
```

```
    # Chhattisgarh
    "chhattisgarh": "Chhattisgarh",
```

```
    # Delhi
```

```
"delhi": "Delhi",

# Goa
"goa": "Goa",

# Gujarat
"gujarat": "Gujarat",

# Haryana
"haryana": "Haryana",

# Himachal Pradesh
"himachalpradesh": "Himachal Pradesh",

# Jammu & Kashmir / Ladakh
"jammuandkashmir": "Jammu and Kashmir",
"jammukashmir": "Jammu and Kashmir",

"ladakh": "Ladakh",

# Jharkhand
"jharkhand": "Jharkhand",

# Karnataka
"karnataka": "Karnataka",

# Kerala
"kerala": "Kerala",

# Madhya Pradesh
"madhyapradesh": "Madhya Pradesh",

# Maharashtra
"maharashtra": "Maharashtra",

# Manipur
"manipur": "Manipur",

# Meghalaya
"meghalaya": "Meghalaya",

# Mizoram
"mizoram": "Mizoram",

# Nagaland
"nagaland": "Nagaland",

# Odisha (Orissa old name)
"odisha": "Odisha",
"orissa": "Odisha",

# Punjab
"punjab": "Punjab",

# Rajasthan
"rajasthan": "Rajasthan",
```

```

# Sikkim
"sikkim": "Sikkim",

# Tamil Nadu
"tamilnadu": "Tamil Nadu",

# Telangana
"telangana": "Telangana",

# Tripura
"tripura": "Tripura",

# Uttar Pradesh
"uttarpradesh": "Uttar Pradesh",

# Uttarakhand
"uttarakhand": "Uttarakhand",

# West Bengal (ALL variations including typo "Bangal")
"westbengal": "West Bengal",
"westbangal": "West Bengal",

# Andaman & Nicobar Islands
"andamannicobarislands": "Andaman and Nicobar Islands",
"andamanandnicobarislands": "Andaman and Nicobar Islands",

# Chandigarh
"chandigarh": "Chandigarh",

# Dadra & Nagar Haveli / Daman & Diu (merged UT)
"dadraandnagarhaveli": "Dadra and Nagar Haveli and Daman and Diu",
"damananddiu": "Dadra and Nagar Haveli and Daman and Diu",
"dadranagarhaveli": "Dadra and Nagar Haveli and Daman and Diu",
"damandiu": "Dadra and Nagar Haveli and Daman and Diu",
"dadraandnagarhavelianddamananddiu": "Dadra and Nagar Haveli and Daman and Diu",
"thedadraandnagarhavelianddamananddiu": "Dadra and Nagar Haveli and Daman and Diu"

# Lakshadweep
"lakshadweep": "Lakshadweep",

# Puducherry
"pondicherry": "Puducherry",
"puducherry": "Puducherry",
}

```

```
In [42]: df['state_clean'] = (
    df['state']
        .apply(clean_state_name)
        .map(state_mapping)
)
```

```
In [43]: # Drop invalid entries
df = df[~df['state'].astype(str).str.isnumeric()]
```

```
# check unmapped states
unmapped_states = df[df['state_clean'].isnull()]['state'].unique()
print("Unmapped States:", unmapped_states)
```

Unmapped States: []

In [44]: df['state_clean'].nunique()

Out[44]: 36

In [45]: df['state_clean'].unique()

```
Out[45]: array(['Meghalaya', 'Karnataka', 'Uttar Pradesh', 'Bihar', 'Maharashtra',
   'Haryana', 'Rajasthan', 'Punjab', 'Delhi', 'Madhya Pradesh',
   'West Bengal', 'Assam', 'Uttarakhand', 'Gujarat', 'Andhra Pradesh',
   'Tamil Nadu', 'Chhattisgarh', 'Jharkhand', 'Nagaland', 'Manipur',
   'Telangana', 'Tripura', 'Mizoram', 'Jammu and Kashmir',
   'Chandigarh', 'Sikkim', 'Odisha', 'Kerala',
   'Dadra and Nagar Haveli and Daman and Diu', 'Arunachal Pradesh',
   'Himachal Pradesh', 'Goa', 'Ladakh', 'Andaman and Nicobar Islands',
   'Puducherry', 'Lakshadweep'], dtype=object)
```

In [46]: df

Out[46]:

	date	state	district	pincode	age_0_5	age_5_17	age_18_greater
0	02-03-2025	Meghalaya	East Khasi Hills	793121	11	61	37
1	09-03-2025	Karnataka	Bengaluru Urban	560043	14	33	39
2	09-03-2025	Uttar Pradesh	Kanpur Nagar	208001	29	82	12
3	09-03-2025	Uttar Pradesh	Aligarh	202133	62	29	15
4	09-03-2025	Karnataka	Bengaluru Urban	560016	14	16	21
...	
1006024	31-12-2025	West Bengal	West Midnapore	721149	2	0	0
1006025	31-12-2025	West Bengal	West Midnapore	721150	2	2	0
1006026	31-12-2025	West Bengal	West Midnapore	721305	0	1	0
1006027	31-12-2025	West Bengal	West Midnapore	721504	1	0	0
1006028	31-12-2025	West Bengal	West Midnapore	721517	2	1	0

1006007 rows × 9 columns

In [47]: df.dtypes

```
Out[47]: date          object
         state         object
        district      object
       pincode      int64
      age_0_5      int64
      age_5_17      int64
    age_18_greater  int64
     new_date      object
   state_clean      object
      dtype: object
```

```
In [48]: df_bihar = df[df['state_clean']=='Bihar']
df_bihar
```

```
Out[48]:
```

		date	state	district	pincode	age_0_5	age_5_17	age_18_greater	new
5		09-03-2025	Bihar	Sitamarhi	843331	20	49		12 2025
6		09-03-2025	Bihar	Sitamarhi	843330	23	24		42 2025
9		09-03-2025	Bihar	Purbi Champaran	845418	30	48		10 2025
11		09-03-2025	Bihar	Sitamarhi	843317	35	94		16 2025
13		09-03-2025	Bihar	Sitamarhi	843324	49	186		34 2025
	
1002992		31-12-2025	Bihar	Vaishali	844134	2	0		0 2025
1002993		31-12-2025	Bihar	Vaishali	844504	15	26		1 2025
1002994		31-12-2025	Bihar	Vaishali	844509	1	2		0 2025
1002995		31-12-2025	Bihar	West Champaran	845404	13	17		1 2025
1002996		31-12-2025	Bihar	West Champaran	845449	9	45		0 2025

60567 rows × 9 columns

Bihar ke liye

```
In [ ]:
```

```
In [49]: df_bihar['district'].unique()
## yha pr district ki bhi mapping krni padegi
```

```
## Aurangabad(bh)', 'Purnea', 'Pashchim Champaran', 'Sheikpura',
#      'Bhabua', 'Aurangabad(BH)'], dtype=object)) issko dekho
```

```
Out[49]: array(['Sitamarhi', 'Purbi Champaran', 'Madhubani', 'Bhagalpur', 'Patna',
       'Pashchim Champaran', 'Muzaffarpur', 'Munger', 'Gaya',
       'Kaimur (Bhabua)', 'West Champaran', 'Purnia', 'Saran',
       'East Champaran', 'Vaishali', 'Jehanabad', 'Jamui', 'Gopalganj',
       'Saharsa', 'Arwal', 'Katihar', 'Siwan', 'Lakhisarai', 'Banka',
       'Nalanda', 'Araria', 'Darbhanga', 'Nawada', 'Samastipur',
       'Begusarai', 'Bhojpur', 'Aurangabad', 'Buxar', 'Khagaria',
       'Kishanganj', 'Madhepura', 'Rohtas', 'Sheohar', 'Supaul',
       'Aurangabad(bh)', 'Purba Champaran', 'Purnea', 'Sheikhpura',
       'Sheikpura', 'Bhabua', 'Monghyr', 'Samstipur', 'Aurangabad(BH)'],
      dtype=object)
```

```
In [50]: df_bihar['district'].nunique()
```

```
Out[50]: 48
```

```
In [51]: import pandas as pd
import re

def clean_name(x):
    if pd.isna(x):
        return x
    x = str(x).lower()
    x = re.sub(r'^[a-z]', '', x)
    x = re.sub(r'\s+', ' ', x).strip()
    return x
```

```
In [52]: ## District mapping bihar
bihar_district_mapping = {

    # Arwal
    "arwal": "Arwal",

    # Aurangabad
    "aurangabad": "Aurangabad",
    "aurangabadbh": "Aurangabad",

    # Araria
    "araria": "Araria",

    # Banka
    "banka": "Banka",

    # Begusarai
    "begusarai": "Begusarai",

    # Bhagalpur
    "bhagalpur": "Bhagalpur",

    # Bhojpur
    "bhojpur": "Bhojpur",
```

```
# Buxar
"buxar": "Buxar",

# Darbhanga
"darbhanga": "Darbhanga",

# East Champaran
"eastchamparan": "East Champaran",
"purbachamparan": "East Champaran",

# West Champaran
"westchamparan": "West Champaran",
"pashchimchamparan": "West Champaran",

# Gaya
"gaya": "Gaya",

# Gopalganj
"gopalganj": "Gopalganj",

# Jamui
"jamui": "Jamui",

# Jehanabad
"jehanabad": "Jehanabad",

# Kaimur
"kaimurbhabua": "Kaimur",
"bhabua": "Kaimur",

# Katihar
"katihar": "Katihar",

# Khagaria
"khagaria": "Khagaria",

# Kishanganj
"kishanganj": "Kishanganj",

# Lakhisarai
"lakhisarai": "Lakhisarai",

# Madhepura
"madhepura": "Madhepura",

# Madhubani
"madhubani": "Madhubani",

# Munger
"munger": "Munger",
"monghyr": "Munger",

# Muzaffarpur
"muzaffarpur": "Muzaffarpur",

# Nalanda
```

```
"nalanda": "Nalanda",  
  
    # Nawada  
    "nawada": "Nawada",  
  
    # Patna  
    "patna": "Patna",  
  
    # Purnia  
    "purnia": "Purnia",  
    "purnea": "Purnia",  
  
    # Rohtas  
    "rohtas": "Rohtas",  
  
    # Saharsa  
    "saharsa": "Saharsa",  
  
    # Samastipur  
    "samastipur": "Samastipur",  
    "samstipur": "Samastipur",  
  
    # Saran  
    "saran": "Saran",  
  
    # Sheikhpura  
    "sheikhpura": "Sheikhpura",  
    "sheikpura": "Sheikhpura",  
  
    # Sheohar  
    "sheohar": "Sheohar",  
  
    # Sitamarhi  
    "sitamarhi": "Sitamarhi",  
  
    # Siwan  
    "siwan": "Siwan",  
  
    # Supaul  
    "supaul": "Supaul",  
  
    # Vaishali  
    "vaishali": "Vaishali",  
}
```

```
In [53]: df['district_clean'] = (  
    df['district']  
    .apply(clean_name)  
    .map(bihar_district_mapping)  
    .fillna(df_bihar['district']))  
)
```

```
In [54]: ## Remaining unmapped  
df[df['district_clean'].isna()]['district'].unique()
```

```
# count check
df['district_clean'].nunique()
```

Out[54]: 39

```
In [55]: dff_bihar = df[df['state_clean']=='Bihar']
dff_bihar
```

Out[55]:

	date	state	district	pincode	age_0_5	age_5_17	age_18_greater	new
5	09-03-2025	Bihar	Sitamarhi	843331	20	49		12 2025
6	09-03-2025	Bihar	Sitamarhi	843330	23	24		42 2025
9	09-03-2025	Bihar	Purbi Champaran	845418	30	48		10 2025
11	09-03-2025	Bihar	Sitamarhi	843317	35	94		16 2025
13	09-03-2025	Bihar	Sitamarhi	843324	49	186		34 2025
...
1002992	31-12-2025	Bihar	Vaishali	844134	2	0		0 2025
1002993	31-12-2025	Bihar	Vaishali	844504	15	26		1 2025
1002994	31-12-2025	Bihar	Vaishali	844509	1	2		0 2025
1002995	31-12-2025	Bihar	West Champaran	845404	13	17		1 2025
1002996	31-12-2025	Bihar	West Champaran	845449	9	45		0 2025

60567 rows × 10 columns

```
In [56]: # Check Bihar-specific unmapped districts
df_bihar_unmapped = df_bihar[df_bihar['district_clean'].isna()]
print(f"Unmapped Bihar districts count: {len(df_bihar_unmapped)}")
df_bihar_unmapped['district'].unique()
```

```
-----  
KeyError Traceback (most recent call last)  
File /Library/Frameworks/Python.framework/Versions/3.14/lib/python3.14/site-  
packages/pandas/core/indexes/base.py:3812, in Index.get_loc(self, key)  
    3811 try:  
-> 3812     return self._engine.get_loc(casted_key)  
    3813 except KeyError as err:  
  
File pandas/_libs/index.pyx:167, in pandas._libs.index.IndexEngine.get_loc()  
  
File pandas/_libs/index.pyx:196, in pandas._libs.index.IndexEngine.get_loc()  
  
File pandas/_libs/hashtable_class_helper.pxi:7088, in pandas._libs.hashtabl  
e.PyObjectHashTable.get_item()  
  
File pandas/_libs/hashtable_class_helper.pxi:7096, in pandas._libs.hashtabl  
e.PyObjectHashTable.get_item()  
  
KeyError: 'district_clean'  
  
The above exception was the direct cause of the following exception:  
  
KeyError Traceback (most recent call last)  
Cell In[56], line 2  
      1 # Check Bihar-specific unmapped districts  
----> 2 df_bihar_unmapped = df_bihar[df_bihar[ ].isna()]  
      3 print(f"Unmapped Bihar districts count: {len(df_bihar_unmapped)}")  
      4 df_bihar_unmapped['district'].unique()  
  
File /Library/Frameworks/Python.framework/Versions/3.14/lib/python3.14/site-  
packages/pandas/core/frame.py:4113, in DataFrame.__getitem__(self, key)  
    4111 if self.columns.nlevels > 1:  
    4112     return self._getitem_multilevel(key)  
-> 4113 indexer = self.columns.get_loc(key)  
    4114 if is_integer(indexer):  
    4115     indexer = [indexer]  
  
File /Library/Frameworks/Python.framework/Versions/3.14/lib/python3.14/site-  
packages/pandas/core/indexes/base.py:3819, in Index.get_loc(self, key)  
    3814     if isinstance(casted_key, slice) or (  
    3815         isinstance(casted_key, abc.Iterable)  
    3816         and any(isinstance(x, slice) for x in casted_key)  
    3817     ):  
    3818         raise InvalidIndexError(key)  
-> 3819     raise KeyError(key) from err  
    3820 except TypeError:  
    3821     # If we have a listlike key, _check_indexing_error will raise  
    3822     # InvalidIndexError. Otherwise we fall through and re-raise  
    3823     # the TypeError.  
    3824     self._check_indexing_error(key)  
  
KeyError: 'district_clean'
```

In []: df_bihar['district_clean'].unique()

```
Out[ ]: array(['Sitamarhi', 'Purbi Champaran', 'Madhubani', 'Bhagalpur', 'Patna',  
   'West Champaran', 'Muzaffarpur', 'Munger', 'Gaya', 'Kaimur',  
   'Purnia', 'Saran', 'East Champaran', 'Vaishali', 'Jehanabad',  
   'Jamui', 'Gopalganj', 'Saharsa', 'Arwal', 'Katihar', 'Siwan',  
   'Lakhisarai', 'Banka', 'Nalanda', 'Araria', 'Darbhanga', 'Nawada',  
   'Samastipur', 'Begusarai', 'Bhojpur', 'Aurangabad', 'Buxar',  
   'Khagaria', 'Kishanganj', 'Madhepura', 'Rohtas', 'Sheohar',  
   'Supaul', 'Sheikhpura'], dtype=object)
```

```
In [ ]:
```

```
In [ ]: df_bihar['new_date'].isnull().sum()
```

```
Out[ ]: np.int64(0)
```

```
In [ ]: # unique pincodes in bihar  
df_bihar['pincode'].nunique()
```

```
Out[ ]: 906
```

```
In [ ]: pincode_check = df_bihar.groupby('district_clean')['pincode'].nunique().reset_index()  
pincode_check
```

Out[]:

	district_clean	unique_pincodes
0	Araria	19
1	Arwal	19
2	Aurangabad	29
3	Banka	32
4	Begusarai	33
5	Bhagalpur	34
6	Bhojpur	41
7	Buxar	27
8	Darbhanga	46
9	East Champaran	39
10	Gaya	39
11	Gopalganj	23
12	Jamui	14
13	Jehanabad	21
14	Kaimur	12
15	Katihar	23
16	Khagaria	15
17	Kishanganj	9
18	Lakhisarai	13
19	Madhepura	21
20	Madhubani	44
21	Munger	12
22	Muzaffarpur	53
23	Nalanda	31
24	Nawada	24
25	Patna	69
26	Purbi Champaran	12
27	Purnia	30
28	Rohtas	33
29	Saharsa	18
30	Samastipur	42
31	Saran	51

	district_clean	unique_pincode
32	Sheikhpura	8
33	Sheohar	7
34	Sitamarhi	25
35	Siwan	46
36	Supaul	23
37	Vaishali	38
38	West Champaran	19

```
In [ ]: df_bihar[df_bihar['district_clean']=='Kaimur']['pincode'].unique()
```

```
Out[ ]: array([821106, 821108, 821109, 821105, 821110, 802132, 821101, 821102,
   821104, 821103, 821112, 821311])
```

```
In [ ]: pin_district_count = (
    df_bihar.groupby('pincode')['district_clean']
    .nunique()
    .reset_index(name='district_count')
)
```

```
In [ ]: pin_district_count
```

	pincode	district_count
0	800001	1
1	800002	1
2	800003	1
3	800004	1
4	800005	1
...
901	855114	1
902	855115	2
903	855116	1
904	855117	1
905	855456	1

906 rows × 2 columns

```
In [ ]: problem_pins = pin_district_count[
    pin_district_count['district_count'] > 1
```

```
]
```

```
In [ ]: problem_pins
## ek pin code 2 district se belong kr skta hai theek ye govt ki website pr
```

```
Out[ ]:      pincode  district_count
```

40	801304	2
41	801305	2
53	802112	2
73	802134	2
83	802160	2
...
890	854337	2
894	855101	3
896	855105	2
898	855107	2
902	855115	2

177 rows × 2 columns

```
In [ ]: df_flagged = df_bihar.merge(
          problem_pins[['pincode']],
          on='pincode',
          how='inner'
        )
```

```
In [ ]: ## ye sab o hai jissme ek district ke 2 pincode hai
## yha se hum pta kr skte hai kiss district me jda use ho rha hai
df_flagged
```

Out[]:

	date	state	district	pincode	age_0_5	age_5_17	age_18_greater	new_d
0	09-03-2025	Bihar	Purbi Champaran	845418	30	48	10	202503
1	09-03-2025	Bihar	Purbi Champaran	845304	18	72	12	202503
2	15-03-2025	Bihar	Purbi Champaran	845303	12	121	13	202503
3	01-04-2025	Bihar	Sitamarhi	843315	102	125	18	202504
4	01-04-2025	Bihar	Munger	811213	191	278	22	202504
...
16964	31-12-2025	Bihar	Sheohar	843325	4	2	0	202512
16965	31-12-2025	Bihar	Sitamarhi	843325	11	6	0	202512
16966	31-12-2025	Bihar	Siwan	841243	2	11	0	202512
16967	31-12-2025	Bihar	Supaul	852108	0	9	0	202512
16968	31-12-2025	Bihar	Supaul	852131	15	19	0	202512

16969 rows × 10 columns

In []: flagged_pincode=df_flagged.groupby(['district_clean','pincode'])[['age_0_5',
#flagged_pincode.to_excel('flagged_pincode_domain.xlsx')

In []: flagged_pincode['total_enrollment']=flagged_pincode['age_0_5']+flagged_pincode
flagged_pincode.sort_values('pincode')

Out[]:

	district_clean	pincode	age_0_5	age_5_17	age_18_greater	total_enrollment
241	Patna	801304	17	36	1	54
223	Nalanda	801304	58	114	0	172
224	Nalanda	801305	39	62	1	102
242	Patna	801305	12	33	2	47
63	Buxar	802112	117	224	1	342
...
282	Purnia	855105	61	18	2	81
283	Purnia	855107	235	70	0	305
166	Kishanganj	855107	1685	446	1	2132
167	Kishanganj	855115	774	208	4	986
284	Purnia	855115	222	60	0	282

365 rows × 6 columns

In []:

```
## isse pta chlega hai kiss pincode me jda aadhar enrolment ho rha hai is pi
## baad me agr jarurat pde too hum iska flag bna skte hai ki jo bhi district
## same pin code se hai usse true ur jo ek hi pincode se hai usse false
```

In []:

```
idx = flagged_pincode.groupby('pincode')['total_enrollment'].idxmax()
df_filtered = flagged_pincode.loc[idx]
df_filtered
```

Out[]:

	district_clean	pincode	age_0_5	age_5_17	age_18_greater	total_enrollment
223	Nalanda	801304	58	114	0	172
224	Nalanda	801305	39	62	1	102
63	Buxar	802112	117	224	1	342
64	Buxar	802134	125	370	1	496
59	Bhojpur	802160	66	273	2	341
...
281	Purnia	854337	336	131	0	467
165	Kishanganj	855101	1906	357	7	2270
158	Katihar	855105	386	125	6	517
166	Kishanganj	855107	1685	446	1	2132
167	Kishanganj	855115	774	208	4	986

177 rows × 6 columns

```
In [ ]: df_bihar['pin_multi_district_flag']=  
        df_bihar.groupby('pincode')['district_clean']  
        .transform('nunique')>1  
    )
```

```
/var/folders/bf/c5g8t8hs08j4x62fvvx5j410000gn/T/ipykernel_23469/378759105.py:1: SettingWithCopyWarning:  
A value is trying to be set on a copy of a slice from a DataFrame.  
Try using .loc[row_indexer,col_indexer] = value instead  
  
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-versus-a-copy  
df_bihar['pin_multi_district_flag']=
```

```
In [57]: pin_district_map= (  
        df_bihar[df_bihar['pin_multi_district_flag']]  
        .groupby('pincode')['district_clean'] # noqa: SC100  
        .unique()  
        .reset_index()  
    )
```

```
-----  
KeyError Traceback (most recent call last)  
File /Library/Frameworks/Python.framework/Versions/3.14/lib/python3.14/site-  
packages/pandas/core/indexes/base.py:3812, in Index.get_loc(self, key)  
    3811 try:  
-> 3812     return self._engine.get_loc(casted_key)  
    3813 except KeyError as err:  
  
File pandas/_libs/index.pyx:167, in pandas._libs.index.IndexEngine.get_loc()  
  
File pandas/_libs/index.pyx:196, in pandas._libs.index.IndexEngine.get_loc()  
  
File pandas/_libs/hashtable_class_helper.pxi:7088, in pandas._libs.hashtabl  
e.PyObjectHashTable.get_item()  
  
File pandas/_libs/hashtable_class_helper.pxi:7096, in pandas._libs.hashtabl  
e.PyObjectHashTable.get_item()  
  
KeyError: 'pin_multi_district_flag'  
  
The above exception was the direct cause of the following exception:  
  
KeyError Traceback (most recent call last)  
Cell In[57], line 2  
      1 pin_district_map= (  
----> 2     df_bihar[df_bihar[ ]]  
      3         .groupby('pincode')['district_clean'] # noqa: SC100  
      4         .unique()  
      5         .reset_index()  
      6 )  
  
File /Library/Frameworks/Python.framework/Versions/3.14/lib/python3.14/site-  
packages/pandas/core/frame.py:4113, in DataFrame.__getitem__(self, key)  
    4111 if self.columns.nlevels > 1:  
    4112     return self._getitem_multilevel(key)  
-> 4113 indexer = self.columns.get_loc(key)  
    4114 if is_integer(indexer):  
    4115     indexer = [indexer]  
  
File /Library/Frameworks/Python.framework/Versions/3.14/lib/python3.14/site-  
packages/pandas/core/indexes/base.py:3819, in Index.get_loc(self, key)  
    3814     if isinstance(casted_key, slice) or (  
    3815         isinstance(casted_key, abc.Iterable)  
    3816         and any(isinstance(x, slice) for x in casted_key)  
    3817     ):  
    3818         raise InvalidIndexError(key)  
-> 3819     raise KeyError(key) from err  
    3820 except TypeError:  
    3821     # If we have a listlike key, _check_indexing_error will raise  
    3822     # InvalidIndexError. Otherwise we fall through and re-raise  
    3823     # the TypeError.  
    3824     self._check_indexing_error(key)  
  
KeyError: 'pin_multi_district_flag'
```

```
In [ ]: ## monthly enrolment check
df_bihar['month'] = df_bihar['new_date'].astype(str).str[4:6]
df_bihar
```

```
/var/folders/bf/c5g8t8hs08j4x62fvvx5j4100000gn/T/ipykernel_23469/2055184884.py:2: SettingWithCopyWarning:
```

```
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
```

```
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
```

```
df_bihar['month'] = df_bihar['new_date'].astype(str).str[4:6]
```

```
/var/folders/bf/c5g8t8hs08j4x62fvvx5j4100000gn/T/ipykernel_23469/2055184884.py:2: SettingWithCopyWarning:
```

```
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
```

```
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
```

```
df_bihar['month'] = df_bihar['new_date'].astype(str).str[4:6]
```

Out[]:

		date	state	district	pincode	age_0_5	age_5_17	age_18_greater	new
	5	09-03-2025	Bihar	Sitamarhi	843331	20	49		12 2025
	6	09-03-2025	Bihar	Sitamarhi	843330	23	24		42 2025
	9	09-03-2025	Bihar	Purbi Champaran	845418	30	48		10 2025
	11	09-03-2025	Bihar	Sitamarhi	843317	35	94		16 2025
	13	09-03-2025	Bihar	Sitamarhi	843324	49	186		34 2025

1002992		31-12-2025	Bihar	Vaishali	844134	2	0		0 2025
1002993		31-12-2025	Bihar	Vaishali	844504	15	26		1 2025
1002994		31-12-2025	Bihar	Vaishali	844509	1	2		0 2025
1002995		31-12-2025	Bihar	West Champaran	845404	13	17		1 2025
1002996		31-12-2025	Bihar	West Champaran	845449	9	45		0 2025

60567 rows × 11 columns

In []: df_bihar_cleaned=df_bihar.drop(columns=['date','district','state'], axis=1)
df_bihar_cleaned

Out[]:

	pincode	age_0_5	age_5_17	age_18_greater	new_date	state_clean	distri
5	843331	20	49		12	20250309	Bihar
6	843330	23	24		42	20250309	Bihar
9	845418	30	48		10	20250309	Bihar
11	843317	35	94		16	20250309	Bihar
13	843324	49	186		34	20250309	Bihar
...
1002992	844134	2	0		0	20251231	Bihar
1002993	844504	15	26		1	20251231	Bihar
1002994	844509	1	2		0	20251231	Bihar
1002995	845404	13	17		1	20251231	Bihar
1002996	845449	9	45		0	20251231	Bihar

60567 rows × 7 columns

In []: