Notebook 4: Interactive Map for National Migration Outflow and Their **Paths**

· side note: because we tried to do some interactive maps that contain many layers of information, we decided to take each notebook to focus on one or two specific maps so that the flow and the organization of the project are more straightforward. The cells for this map are usually compiled into single cells in the end.

In this notebook, only one map is focused on – the interactive map that shows where the migration goes to and where are the outflows of migration. The note begins with processing geodata for all metros. Then, we processed the migration flow census data for the outflow numbers for each county. After matching the census and geodata, we were able to produce an very interactive map in the end.

```
In [1]: # Import all modules I will be using in this notebook
        import pandas as pd
        import geopandas as gpd
        import contextily as ctx
        import matplotlib.pyplot as plt
        import plotly.express as px
        import plotly.graph objects as go
        from plotly.subplots import make subplots
        import numpy as np
        import fiona
        /opt/conda/lib/python3.8/site-packages/geopandas/ compat.py:106: UserWarning: The Shapely GEOS version (3.8.1-CAPI-1.13.3) is i
        ncompatible with the GEOS version PyGEOS was compiled with (3.9.0-CAPI-1.16.2). Conversions between both will be slow.
          warnings.warn(
```

Process Metro Geo Data

```
In [2]: # Import the geo data SHP file
        metro geodata rawdata = gpd.read file('GeoData/01 Basemap metroborder/tl 2019 us cbsa.shp')
In [3]: # Take a look to see if all data are valid and in the right data type.
        # There's one missing a lot of values, but it's okay because it's not important to our questions
        metro_geodata_rawdata.head()
Out[3]:
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          super(GeoDataFrame, self).__setitem__(key, value)
```

geometry State

In [5]: metro_geodata_ready.head() Out[5]:

> **GEOID** Metro_Name Athens-Clarke County, GA Metro Area POLYGON ((-83.53739 33.96591, -83.53184 33.968... 12020 50 45 40 35 30 40 35 30 25 -120-110 -100-90 -70

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In [25]: Migration2018_total_outflow_trimmed = Migration2018_total_outflow_trimmed.sort_values(by='Total_Outflow_Population', ascending=False, ignore_index = True)

In [26]: Migration2018_total_outflow_trimmed Out[26]:

49739 rows × 5 columns

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2 1	10740	Albuquerque, NM Metro Area	11100	Amarillo, TX Metro Area	153.0	Albuquerque, NM Metro Area	POINT (-106.47158 35.12229)	-106.471584	35.12229
	10740	Albuquerque, NM Metro Area	11260	Anchorage, AK Metro Area	133.0	Albuquerque, NM Metro Area	POINT (-106.47158	-106.471584	35.12229
ın [36]: Migra	ation201		gration2018	3_Irimmed2_geo.drop([M	etro [,axis=1)	Well o Area	3E 43330)		

Ir Out[37]: Previous_GEOID Previous_Metro Current_Metro Migration_Population Previous_Ion Previous_lat geometry lon lat POINT Albuquerque, NM Metro Abilene, TX 10740 10180 (-99.71768 -106.471584 35.122290 -99.717678 32.449690 Metro Area 32.44969) In [40]: Migration2018_top = Migration2018_top.reset_index() Migration2018_top = Migration2018_top.drop(['index'],axis=1)

In [42]: Migration2018 top OUT [NO] (-80.3458124660 5916.0 -/9./91602 36.076644 High Point, NC Salem, NC 36.025861 -80.345813 Metro Area 36.07664) Metro Area

174 rows × 10 columns

loop code, but we learned a lot from this code.

flows are within those big metros as well.

In []: In [43]: fig = go.Figure() size = Migration2018_total_outflow_trimmed_sub['Total_Outflow_Population']/scale, color = colors[i], line_color='rgb(40,40,40)', line width=0.5, sizemode = 'area' name = $\{0\}$ - $\{1\}$ '.format($\lim[0]$, $\lim[1]$))) # Format fig.update_layout(title_font_size=15)

fig.update_geos(fitbounds="locations") fig.show("notebook")

The map itself presents where the "hot spots" for outflow migration are and how the flows in between. New York City and LA lost many people and the major

We are glad the interactive map works out. We tried to add many layers of information into one map. The indexing part is challenging, especially within a for