## **Project Part 2**

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```
# Installing covidcast
In [1]:
         !pip install covidcast
        Collecting covidcast
          Downloading covidcast-0.1.5-py3-none-any.whl (12.3 MB)
                                              12.3 MB 20.9 MB/s
        Collecting epiweeks
          Downloading epiweeks-2.1.3-py3-none-any.whl (5.9 kB)
        Requirement already satisfied: pandas in /shared-libs/python3.7/py/lib/python3
        .7/site-packages (from covidcast) (1.2.5)
        Collecting descartes
          Downloading descartes-1.1.0-py3-none-any.whl (5.8 kB)
        Requirement already satisfied: tqdm in /shared-libs/python3.7/py/lib/python3.7
        /site-packages (from covidcast) (4.62.3)
        Collecting delphi-epidata>=0.0.11
          Downloading delphi epidata-0.3.1-py3-none-any.whl (6.8 kB)
        Collecting imageio
          Downloading imageio-2.13.0-py3-none-any.whl (3.3 MB)
                                              3.3 MB 37.3 MB/s
        Requirement already satisfied: numpy in /shared-libs/python3.7/py/lib/python3.
        7/site-packages (from covidcast) (1.19.5)
        Requirement already satisfied: matplotlib in /shared-libs/python3.7/py/lib/pyt
        hon3.7/site-packages (from covidcast) (3.4.3)
        Requirement already satisfied: requests in /shared-libs/python3.7/py/lib/pytho
        n3.7/site-packages (from covidcast) (2.26.0)
        Collecting geopandas
          Downloading geopandas-0.10.2-py2.py3-none-any.whl (1.0 MB)
                                           1.0 MB 38.8 MB/s
        Collecting imageio-ffmpeg
          Downloading imageio ffmpeg-0.4.5-py3-none-manylinux2010 x86 64.whl (26.9 MB)
                                              26.9 MB 42.0 MB/s
        Requirement already satisfied: python-dateutil>=2.7.3 in /shared-libs/python3.
        7/py-core/lib/python3.7/site-packages (from pandas->covidcast) (2.8.2)
        Requirement already satisfied: pytz>=2017.3 in /shared-libs/python3.7/py/lib/p
        ython3.7/site-packages (from pandas->covidcast) (2021.3)
        Requirement already satisfied: tenacity in /shared-libs/python3.7/py/lib/pytho
        n3.7/site-packages (from delphi-epidata>=0.0.11->covidcast) (8.0.1)
        Requirement already satisfied: aiohttp in /shared-libs/python3.7/py-core/lib/p
        ython3.7/site-packages (from delphi-epidata>=0.0.11->covidcast) (3.8.0)
        Requirement already satisfied: pillow>=8.3.2 in /shared-libs/python3.7/py/lib/
        python3.7/site-packages (from imageio->covidcast) (8.4.0)
        Requirement already satisfied: kiwisolver>=1.0.1 in /shared-libs/python3.7/py/
        lib/python3.7/site-packages (from matplotlib->covidcast) (1.3.2)
        Requirement already satisfied: cycler>=0.10 in /shared-libs/python3.7/py/lib/p
        ython3.7/site-packages (from matplotlib->covidcast) (0.11.0)
        Requirement already satisfied: pyparsing>=2.2.1 in /shared-libs/python3.7/py-c
        ore/lib/python3.7/site-packages (from matplotlib->covidcast) (2.4.7)
        Requirement already satisfied: urllib3<1.27,>=1.21.1 in /shared-libs/python3.7
        /py/lib/python3.7/site-packages (from requests->covidcast) (1.26.7)
        Requirement already satisfied: idna<4,>=2.5; python version >= "3" in /shared-
```

```
libs/python3.7/py-core/lib/python3.7/site-packages (from requests->covidcast)
Requirement already satisfied: charset-normalizer~=2.0.0; python version >= "3
" in /shared-libs/python3.7/py-core/lib/python3.7/site-packages (from requests
->covidcast) (2.0.7)
Requirement already satisfied: certifi>=2017.4.17 in /shared-libs/python3.7/py
/lib/python3.7/site-packages (from requests->covidcast) (2021.10.8)
Collecting shapely>=1.6
  Downloading Shapely-1.8.0-cp37-cp37m-manylinux 2 5 x86 64.manylinux1 x86 64.
whl (1.1 MB)
                                    1.1 MB 31.5 MB/s
Collecting pyproj>=2.2.0
  Downloading pyproj-3.2.1-cp37-cp37m-manylinux2010 x86 64.whl (6.3 MB)
                                      | 6.3 MB 35.3 MB/s
Requirement already satisfied: fiona>=1.8 in /shared-libs/python3.7/py/lib/pyt
hon3.7/site-packages (from geopandas->covidcast) (1.8.20)
Requirement already satisfied: six>=1.5 in /shared-libs/python3.7/py-core/lib/
python3.7/site-packages (from python-dateutil>=2.7.3->pandas->covidcast) (1.16
Requirement already satisfied: aiosignal>=1.1.2 in /shared-libs/python3.7/py-c
ore/lib/python3.7/site-packages (from aiohttp->delphi-epidata>=0.0.11->covidca
st) (1.2.0)
Requirement already satisfied: yarl<2.0,>=1.0 in /shared-libs/python3.7/py-cor
e/lib/python3.7/site-packages (from aiohttp->delphi-epidata>=0.0.11->covidcast
(1.7.2)
Requirement already satisfied: frozenlist>=1.1.1 in /shared-libs/python3.7/py-
core/lib/python3.7/site-packages (from aiohttp->delphi-epidata>=0.0.11->covidc
ast) (1.2.0)
Requirement already satisfied: typing-extensions>=3.7.4; python version < "3.8"
" in /shared-libs/python3.7/py-core/lib/python3.7/site-packages (from aiohttp-
>delphi-epidata>=0.0.11->covidcast) (3.10.0.2)
Requirement already satisfied: multidict<7.0,>=4.5 in /shared-libs/python3.7/p
y-core/lib/python3.7/site-packages (from aiohttp->delphi-epidata>=0.0.11->covi
dcast) (5.2.0)
Requirement already satisfied: asynctest==0.13.0; python_version < "3.8" in /s
hared-libs/python3.7/py-core/lib/python3.7/site-packages (from aiohttp->delphi
-epidata>=0.0.11->covidcast) (0.13.0)
Requirement already satisfied: attrs>=17.3.0 in /shared-libs/python3.7/py-core
/lib/python3.7/site-packages (from aiohttp->delphi-epidata>=0.0.11->covidcast)
(21.2.0)
Requirement already satisfied: async-timeout<5.0,>=4.0.0a3 in /shared-libs/pyt
hon3.7/py-core/lib/python3.7/site-packages (from aiohttp->delphi-epidata>=0.0.
11->covidcast) (4.0.1)
Requirement already satisfied: setuptools in /root/venv/lib/python3.7/site-pac
kages (from fiona>=1.8->geopandas->covidcast) (47.1.0)
Requirement already satisfied: cligj>=0.5 in /shared-libs/python3.7/py/lib/pyt
hon3.7/site-packages (from fiona>=1.8->geopandas->covidcast) (0.7.2)
Requirement already satisfied: click>=4.0 in /shared-libs/python3.7/py/lib/pyt
hon3.7/site-packages (from fiona>=1.8->geopandas->covidcast) (8.0.3)
Requirement already satisfied: munch in /shared-libs/python3.7/py/lib/python3.
7/site-packages (from fiona>=1.8->geopandas->covidcast) (2.5.0)
Requirement already satisfied: click-plugins>=1.0 in /shared-libs/python3.7/py
/lib/python3.7/site-packages (from fiona>=1.8->geopandas->covidcast) (1.1.1)
Requirement already satisfied: importlib-metadata; python version < "3.8" in /
shared-libs/python3.7/py-core/lib/python3.7/site-packages (from click>=4.0->fi
ona>=1.8->geopandas->covidcast) (4.8.2)
Requirement already satisfied: zipp>=0.5 in /shared-libs/python3.7/py-core/lib
```

```
/python3.7/site-packages (from importlib-metadata; python version < "3.8"->cli
        ck \ge 4.0 - fiona \ge 1.8 - geopandas - covidcast) (3.6.0)
        Installing collected packages: epiweeks, descartes, delphi-epidata, imageio, s
        hapely, pyproj, geopandas, imageio-ffmpeg, covidcast
        Successfully installed covidcast-0.1.5 delphi-epidata-0.3.1 descartes-1.1.0 ep
        iweeks-2.1.3 geopandas-0.10.2 imageio-2.13.0 imageio-ffmpeg-0.4.5 pyproj-3.2.1
        shapely-1.8.0
        WARNING: You are using pip version 20.1.1; however, version 21.3.1 is availabl
        You should consider upgrading via the '/root/venv/bin/python -m pip install --
         from datetime import date
In [2]:
         import covidcast
         [ca counties] = covidcast.fips to name("^06.*", ties method="all")
In [3]:
         ca counties
Out[3]: {'06000': ['California'],
          '06001': ['Alameda County'],
          '06003': ['Alpine County'],
          '06005': ['Amador County'],
          '06007': ['Butte County'],
          '06009': ['Calaveras County'],
          '06011': ['Colusa County'],
          '06013': ['Contra Costa County'],
          '06015': ['Del Norte County'],
          '06017': ['El Dorado County'],
          '06019': ['Fresno County'],
          '06021': ['Glenn County'],
          '06023': ['Humboldt County'],
          '06025': ['Imperial County'],
          '06027': ['Inyo County'],
          '06029': ['Kern County'],
          '06031': ['Kings County'],
          '06033': ['Lake County'],
          '06035': ['Lassen County'],
          '06037': ['Los Angeles County'],
          '06039': ['Madera County'],
          '06041': ['Marin County'],
          '06043': ['Mariposa County'],
          '06045': ['Mendocino County'],
          '06047': ['Merced County'],
          '06049': ['Modoc County'],
          '06051': ['Mono County'],
          '06053': ['Monterey County'],
          '06055': ['Napa County'],
          '06057': ['Nevada County'],
          '06059': ['Orange County'],
          '06061': ['Placer County'],
          '06063': ['Plumas County'],
          '06065': ['Riverside County'],
          '06067': ['Sacramento County'],
          '06069': ['San Benito County'],
          '06071': ['San Bernardino County'],
          '06073': ['San Diego County'],
```

```
'06075': ['San Francisco County'],
          '06077': ['San Joaquin County'],
          '06079': ['San Luis Obispo County'],
          '06081': ['San Mateo County'],
          '06083': ['Santa Barbara County'],
          '06085': ['Santa Clara County'],
          '06087': ['Santa Cruz County'],
          '06089': ['Shasta County'],
          '06091': ['Sierra County'],
          '06093': ['Siskiyou County'],
          '06095': ['Solano County'],
          '06097': ['Sonoma County'],
          '06099': ['Stanislaus County'],
          '06101': ['Sutter County'],
          '06103': ['Tehama County'],
          '06105': ['Trinity County'],
          '06107': ['Tulare County'],
          '06109': ['Tuolumne County'],
          '06111': ['Ventura County'],
          '06113': ['Yolo County'],
          '06115': ['Yuba County']}
In [4]:
         len(ca counties)
Out[4]: 59
In [5]:
         #fetch the "US Facts Cases and Deaths" data source
         #Ground Truth
         #2/13 - 8/13
         covidCases = covidcast.signal("usa-facts", "confirmed_incidence_num", date(20
         covidCases
```

Out[5]:	geo_value		signal	time_value	issue	lag	missing_value	missing_stder
	0	06037	confirmed_incidence_num	2020-02- 13	2021- 09- 16	581	0	Į
	1	06059	confirmed_incidence_num	2020-02- 13	2021- 09- 16	581	0	Í
	<b>2</b> 06073		confirmed_incidence_num	2020-02- 13	2021- 09- 16	581	0	Į
	3	06077	confirmed_incidence_num	2020-02- 13	2021- 09- 16	581	0	Į
	4	06085	confirmed_incidence_num	2020-02- 13	2021- 09- 16	581	0	Į.
							•••	••
	54	06107	confirmed_incidence_num	2020-08- 13	2021- 09- 16	399	0	į
	55	06109	confirmed_incidence_num	2020-08- 13	2021- 09- 16	399	0	Į.
	56	06111	confirmed_incidence_num	2020-08- 13	2021- 09- 16	399	0	Į.
	57	06113	confirmed_incidence_num	2020-08- 13	2021- 09- 16	399	0	ţ
	58	06115	confirmed_incidence_num	2020-08- 13	2021- 09- 16	399	0	į

10421 rows × 13 columns

Out[6]:	geo_value		signal	time_value	issue	lag	missing_value	missing_stde
	0	06000	smoothed_outpatient_covid	2020-02- 13	2021- 02-21	374	0	
	1	06001	smoothed_outpatient_covid	2020-02- 13	2021- 02-21	374	0	
	<b>2</b> 06005 smc		smoothed_outpatient_covid	2020-02- 13	2021- 02-21	374	0	
	<b>3</b> 06007 sr		smoothed_outpatient_covid	2020-02- 13	2021- 02-21	374	0	
	<b>4</b> 06009 si		smoothed_outpatient_covid	2020-02- 13	2021- 02-21	374	0	
	53	06107	smoothed_outpatient_covid	2020-08- 13	2021- 02-21	192	0	
	<b>54</b> 06109 s		smoothed_outpatient_covid	2020-08- 13	2021- 02-21	192	0	
	<b>55</b> 06111 s		smoothed_outpatient_covid	2020-08- 13	2021- 02-21	192	0	
	<b>56</b> 06113 smo		smoothed_outpatient_covid	2020-08- 13	2021- 02-21	192	0	
	<b>57</b> 06115 smoothed_ou		smoothed_outpatient_covid	2020-08- 13	2021- 02-21	192	0	

10592 rows × 13 columns

Out[7]:	geo_value		signal	time_value	e issue la		missing_value	missing_stderr
	0	06000	smoothed_outpatient_cli	2020-02- 13	2021- 02-21	374	0	5
	1	06001	smoothed_outpatient_cli	2020-02- 13	2021- 02-21	374	0	5
	<b>3</b> 06007 sr		smoothed_outpatient_cli	2020-02- 13	2021- 02-21	374	0	5
			smoothed_outpatient_cli	2020-02- 13	2021- 02-21	374	0	5
			smoothed_outpatient_cli	2020-02- 13	2021- 02-21	374	0	5
	•••							
	53	06107	smoothed_outpatient_cli	2020-08- 13	2021- 02-21	192	0	5
	54	06109	smoothed_outpatient_cli	2020-08- 13	2021- 02-21	192	0	5
	55	06111	smoothed_outpatient_cli	2020-08- 13	2021- 02-21	192	0	5
	56	06113	smoothed_outpatient_cli	2020-08- 13	2021- 02-21	192	0	5
	57	06115	smoothed_outpatient_cli	2020-08- 13	2021- 02-21	192	0	5

10592 rows × 13 columns

Out[8]:	geo_value		signal	time_value	issue	lag	missing_value	missing_
	0	06000	smoothed_adj_outpatient_covid	2020-02- 13	2021- 02-21	374	0	
	1	06001	smoothed_adj_outpatient_covid	2020-02- 13	2021- 02-21	374	0	
	<b>2</b> 06005		smoothed_adj_outpatient_covid	2020-02- 13	2021- 02-21	374	0	
	<b>3</b> 06007		smoothed_adj_outpatient_covid	2020-02- 13	2021- 02-21	374	0	
	<b>4</b> 06009		smoothed_adj_outpatient_covid	2020-02- 13	2021- 02-21 374		0	
	•••							
	53	06107	smoothed_adj_outpatient_covid	2020-08- 13	2021- 02-21	192	0	
	54	06109	smoothed_adj_outpatient_covid	2020-08- 13	2021- 02-21	192	0	
	<b>55</b> 06111		smoothed_adj_outpatient_covid	2020-08- 13	2021- 02-21	192	0	
	<b>56</b> 06113		smoothed_adj_outpatient_covid	2020-08- 13	2021- 02-21	192	0	
	<b>57</b> 06115 smoothed_adj_ou		smoothed_adj_outpatient_covid	2020-08- 13	2021- 02-21	192	0	

10592 rows × 13 columns

```
In [9]: #Doctor Visits
#Signals: smoothed_cli
```

#February 1st

covidSymptomDoctorVisits = covidcast.signal("doctor-visits", "smoothed\_cli",d
covidSymptomDoctorVisits

Out[9]:	geo_value		signal	time_value	issue	lag	missing_value	missing_stderr	missing_s
	0	06000	smoothed_cli	2020-02- 13	2020- 06- 09	117	0	5	
	1	06001	smoothed_cli	2020-02- 13	2020- 06- 09	117	0	5	
	2	06005	smoothed_cli	2020-02- 13	2020- 06- 09	117	0	5	
	3	06007	smoothed_cli	2020-02- 13	2020- 06- 09	117	0	5	
	4	06009	smoothed_cli	2020-02- 13	2020- 06- 09	117	0	5	
	•••		•••						
	42	06107	smoothed_cli	2020-08- 13	2020- 10-15	63	0	5	
•	43	06109	smoothed_cli	2020-08- 13	2020- 10-15	63	0	5	
•	44	06111	smoothed_cli	2020-08- 13	2020- 10-15	63	0	5	
	45	06113	smoothed_cli	2020-08- 13	2020- 10-15	63	0	5	
•	46	06115	smoothed_cli	2020-08- 13	2020- 10-15	63	0	5	

8177 rows × 13 columns

```
In [10]:
```

```
#Hospital Admissions
#Signals: smoothed_covid19
```

## #Febuary 1st

hospitalAdmissions = covidcast.signal("hospital-admissions", "smoothed\_covid1 hospitalAdmissions

Out[10]:	geo_value		signal	time_value	alue issue		missing_value	missing_stderr	miss
	0	06000	smoothed_covid19	2020-02- 13	2020- 06- 30	138	0	5	
	1	06001	smoothed_covid19	2020-02- 13	2020- 06- 30	138	0	5	
	<b>2</b> 06013		smoothed_covid19	2020-02- 13	2020- 06- 30	138	0	5	
	3	06019	smoothed_covid19	2020-02- 13	2020- 06- 30	138	0	5	
	4	06029	smoothed_covid19	2020-02- 13	2020- 06- 30	138	0	5	
	•••	•••							
	20	06095	smoothed_covid19	2020-08- 13	2020- 09- 30	48	0	5	
	21	06097	smoothed_covid19	2020-08- 13	2020- 09- 30	48	0	5	
	22	06099	smoothed_covid19	2020-08- 13	2020- 09- 30	48	0	5	
	23	06107	smoothed_covid19	2020-08- 13	2020- 09- 30	48	0	5	
	24	06111	smoothed_covid19	2020-08- 13	2020- 09- 30	48	0	5	

## 4464 rows × 13 columns

## In [11]: | #M

#Merge Data

merged\_covid\_data = covidcast.aggregate\_signals([covidCases, covidOutpatient,
merged\_covid\_data

:		geo_value	time_value	usa- facts_confirmed_incidence_num_0_issue	facts confirmed incide
				lacts_committed_incluence_num_o_issue	racts_commined_mcide
	0	06000	2020-02- 13	NaT	
	1	06001	2020-02- 13	NaT	
	2	06005	2020-02- 13	NaT	
	3	06007	2020-02- 13	NaT	
	4	06009	2020-02- 13	NaT	
	•••		•••		
	10785	06107	2020-08- 13	2021-09-16	
	10786	06109	2020-08- 13	2021-09-16	
	10787	06111	2020-08- 13	2021-09-16	
	10788	06113	2020-08- 13	2021-09-16	
	10789	06115	2020-08- 13	2021-09-16	

10790 rows × 51 columns

Out[11]

```
#Determine Null Columns
In [12]:
          merged covid data[merged covid data.isnull().any(axis = 1)]
          #Columns with All Missing: stderr and sample size (all null values):
          #usa-facts confirmed incidence num 0 stderr
          #usa-facts confirmed incidence num 0 sample size
          #chng smoothed outpatient covid 1 stderr
          #chng smoothed outpatient covid 1 sample size
          #chng smoothed outpatient cli 2 stderr
          #chng smoothed outpatient cli 2 sample size
          #chng smoothed adj outpatient covid 3 stderr
          #chng smoothed adj outpatient covid 3 sample size
          #doctor-visits smoothed cli 4 stderr
          #doctor-visits smoothed cli 4 sample size
          #hospital-admissions smoothed covid19 5 stderr
          #hospital-admissions smoothed covid19 5 sample size
          #issue columns (when data was uploaded/updated on the GitHub site):
          #usa-facts confirmed incidence num 0 issue
          #chng smoothed outpatient covid 1 issue
          #chng smoothed outpatient cli 2 issue
          #chng smoothed adj outpatient covid 3 issue
          #doctor-visits smoothed cli 4 issue
          #hospital-admissions smoothed covid19 5 issue
          #Columns to Keep:
          #Make new df with desired columns
          new merged = merged covid data[["geo value", "time value", "usa-facts confirm
          "chng_smoothed_adj_outpatient_covid_3_value", "doctor-visits_smoothed_cli_4_v
          #rename
          new merged = new merged.rename(columns = {"usa-facts confirmed incidence num
           "chng smoothed adj outpatient covid 3 value": "(ADJ) % Confirmed COVID Docto
          #print
          new_merged
```

Out[12]:

	geo_value	time_value	Ground Truth Cases	% Confirmed COVID Doctor Visits	(1) % Visits w/ Symptoms	(ADJ) % Confirmed COVID Doctor Visits	(2) % Visits w/ Symptoms	% N Vi: COV associa
0	06000	2020-02- 13	NaN	0.203214	0.791640	0.203214	0.000000	0.0874
1	06001	2020-02- 13	NaN	0.014638	0.057907	0.015211	0.000000	0.2690
2	2 06005	2020-02- 13	NaN	0.167716	0.167716	0.167716	0.000000	1
3	06007	2020-02- 13	NaN	0.050255	0.071938	0.050255	0.000000	1
4	06009	2020-02- 13	NaN	0.330854	2.822597	0.330854	0.000000	1
•••								
10785	06107	2020-08- 13	126.0	1.021952	3.792120	1.164212	8.723067	3.351
10786	06109	2020-08- 13	4.0	0.274820	1.157530	0.302357	1.003629	1
10787	06111	2020-08- 13	68.0	0.195529	3.534633	0.192925	2.613487	6.753
10788	06113	2020-08- 13	22.0	0.343868	3.893518	0.378412	2.185835	1
10789	06115	2020-08- 13	11.0	0.449591	9.168948	0.533066	2.207103	1

10790 rows × 8 columns

In [25]:

new\_merged

Out[25]:

	geo_value	time_value	Ground Truth Cases	% Confirmed COVID Doctor Visits	(1) % Visits w/ Symptoms	(ADJ) % Confirmed COVID Doctor Visits	(2) % Visits w/ Symptoms	% N Vi: COV associa
0	06000	2020-02- 13	NaN	0.203214	0.791640	0.203214	0.000000	0.0874
1	06001	2020-02- 13	NaN	0.014638	0.057907	0.015211	0.000000	0.2690
2	06005	2020-02- 13	NaN	0.167716	0.167716	0.167716	0.000000	1
3	06007	2020-02- 13	NaN	0.050255	0.071938	0.050255	0.000000	1
4	06009	2020-02- 13	NaN	0.330854	2.822597	0.330854	0.000000	1
•••			•••					
10785	06107	2020-08- 13	126.0	1.021952	3.792120	1.164212	8.723067	3.351
10786	06109	2020-08- 13	4.0	0.274820	1.157530	0.302357	1.003629	1
10787	06111	2020-08- 13	68.0	0.195529	3.534633	0.192925	2.613487	6.753
10788	06113	2020-08- 13	22.0	0.343868	3.893518	0.378412	2.185835	1
10789	06115	2020-08- 13	11.0	0.449591	9.168948	0.533066	2.207103	1

10790 rows × 8 columns

In [40]:

#Impute Missing Data

import numpy as np

from sklearn.impute import SimpleImputer

new\_merged2=new\_merged.iloc[:, 3:8]

new\_merged2

0 0		% Confirmed COVID Doctor Visits	(1) % Visits w/ Symptoms	(ADJ) % Confirmed COVID Doctor Visits	(2) % Visits w/ Symptoms	% NEW Visits COVID- associated
-	0	0.203214	0.791640	0.203214	0.000000	0.087496
	1	0.014638	0.057907	0.015211	0.000000	0.269634
	2	0.167716	0.167716	0.167716	0.000000	NaN
	3	0.050255	0.071938	0.050255	0.000000	NaN
	4	0.330854	2.822597	0.330854	0.000000	NaN
	•••					
	10785	1.021952	3.792120	1.164212	8.723067	3.351107
	10786	0.274820	1.157530	0.302357	1.003629	NaN
	10787	0.195529	3.534633	0.192925	2.613487	6.753834
	10788	0.343868	3.893518	0.378412	2.185835	NaN
	10789	0.449591	9.168948	0.533066	2.207103	NaN

10790 rows × 5 columns

Out[40]

```
import pandas as pd
imp = SimpleImputer(missing_values=np.nan, strategy='mean')
imp=imp.fit(new_merged2)
imputed_df=imp.transform(new_merged2.values)
imputed_df = pd.DataFrame(imputed_df)
print(imputed_df)
```

```
2
              0
                        1
                                             3
0
                0.791640
                           0.203214
                                                0.087496
       0.203214
                                     0.000000
1
       0.014638
                0.057907
                           0.015211
                                      0.000000
                                                0.269634
2
       0.167716
                 0.167716
                           0.167716
                                     0.000000
                                                2.923763
                0.071938
3
       0.050255
                           0.050255
                                     0.000000
                                               2.923763
4
       0.330854
                 2.822597
                           0.330854
                                      0.000000
                                                2.923763
10785
      1.021952
                 3.792120
                           1.164212
                                     8.723067
                                                3.351107
10786
      0.274820 1.157530
                           0.302357
                                     1.003629
                                                2.923763
      0.195529
10787
                 3.534633
                           0.192925
                                     2.613487
                                                6.753834
10788
      0.343868
                 3.893518
                           0.378412
                                      2.185835
                                                2.923763
      0.449591
                           0.533066
10789
                 9.168948
                                     2.207103
                                                2.923763
```

[10790 rows  $x \ 5 \ columns$ ]

/shared-libs/python3.7/py/lib/python3.7/site-packages/sklearn/base.py:446: Use rWarning: X does not have valid feature names, but SimpleImputer was fitted with feature names

"X does not have valid feature names, but"

```
In [43]: new_merged3=new_merged.iloc[:,0:2]
    new_merged3
```

Out[43]:		geo_value	time_value
	0	06000	2020-02-13
	1	06001	2020-02-13
	2	06005	2020-02-13
	3	06007	2020-02-13
	4	06009	2020-02-13
	•••		
	10785	06107	2020-08-13
	10786	06109	2020-08-13
	10787	06111	2020-08-13
	10788	06113	2020-08-13
	10789	06115	2020-08-13

10790 rows × 2 columns

```
In [45]: final_merge=[imputed_df, new_merged3]
    covid_data=pd.concat(final_merge, axis = 1)
    covid_data
```

	0	1	2	3	4	geo_value	time_value
0	0.203214	0.791640	0.203214	0.000000	0.087496	06000	2020-02-13
1	0.014638	0.057907	0.015211	0.000000	0.269634	06001	2020-02-13
2	0.167716	0.167716	0.167716	0.000000	2.923763	06005	2020-02-13
3	0.050255	0.071938	0.050255	0.000000	2.923763	06007	2020-02-13
4	0.330854	2.822597	0.330854	0.000000	2.923763	06009	2020-02-13
•••							
10785	1.021952	3.792120	1.164212	8.723067	3.351107	06107	2020-08-13
10786	0.274820	1.157530	0.302357	1.003629	2.923763	06109	2020-08-13
10787	0.195529	3.534633	0.192925	2.613487	6.753834	06111	2020-08-13
10788	0.343868	3.893518	0.378412	2.185835	2.923763	06113	2020-08-13
10789	0.449591	9.168948	0.533066	2.207103	2.923763	06115	2020-08-13
	1 2 3 4  10785 10786 10787	<ul> <li>0 0.203214</li> <li>1 0.014638</li> <li>2 0.167716</li> <li>3 0.050255</li> <li>4 0.330854</li> <li></li> <li>10785 1.021952</li> <li>10786 0.274820</li> <li>10787 0.195529</li> <li>10788 0.343868</li> </ul>	0       0.203214       0.791640         1       0.014638       0.057907         2       0.167716       0.167716         3       0.050255       0.071938         4       0.330854       2.822597              10785       1.021952       3.792120         10786       0.274820       1.157530         10787       0.195529       3.534633         10788       0.343868       3.893518	0       0.203214       0.791640       0.203214         1       0.014638       0.057907       0.015211         2       0.167716       0.167716       0.167716         3       0.050255       0.071938       0.050255         4       0.330854       2.822597       0.330854               10785       1.021952       3.792120       1.164212         10786       0.274820       1.157530       0.302357         10787       0.195529       3.534633       0.192925         10788       0.343868       3.893518       0.378412	0       0.203214       0.791640       0.203214       0.000000         1       0.014638       0.057907       0.015211       0.000000         2       0.167716       0.167716       0.167716       0.000000         3       0.050255       0.071938       0.050255       0.000000         4       0.330854       2.822597       0.330854       0.000000                10785       1.021952       3.792120       1.164212       8.723067         10786       0.274820       1.157530       0.302357       1.003629         10787       0.195529       3.534633       0.192925       2.613487         10788       0.343868       3.893518       0.378412       2.185835	0       0.203214       0.791640       0.203214       0.000000       0.087496         1       0.014638       0.057907       0.015211       0.000000       0.269634         2       0.167716       0.167716       0.167716       0.000000       2.923763         3       0.050255       0.071938       0.050255       0.000000       2.923763         4       0.330854       2.822597       0.330854       0.000000       2.923763                 10785       1.021952       3.792120       1.164212       8.723067       3.351107         10786       0.274820       1.157530       0.302357       1.003629       2.923763         10787       0.195529       3.534633       0.192925       2.613487       6.753834         10788       0.343868       3.893518       0.378412       2.185835       2.923763	0       0.203214       0.791640       0.203214       0.000000       0.087496       06000         1       0.014638       0.057907       0.015211       0.000000       0.269634       06001         2       0.167716       0.167716       0.167716       0.000000       2.923763       06005         3       0.050255       0.071938       0.050255       0.000000       2.923763       06007         4       0.330854       2.822597       0.330854       0.000000       2.923763       06009                   10785       1.021952       3.792120       1.164212       8.723067       3.351107       06107         10786       0.274820       1.157530       0.302357       1.003629       2.923763       06109         10787       0.195529       3.534633       0.192925       2.613487       6.753834       06111         10788       0.343868       3.893518       0.378412       2.185835       2.923763       06113

10790 rows × 7 columns