

microsoft-entra-auth-logs

April 6, 2024

```
[ ]: import pandas as pd
import matplotlib.pyplot as plt
import descartes
import geopandas as gpd
from shapely.geometry import Point, Polygon
import folium

%matplotlib inline
```

```
[ ]: df = pd.read_json(path_or_buf="sign_ins_formatted.json")
df
```

```
[ ]:
```

	id	createdDateTime	\
0	a24a547c-71e2-47fc-97bb-81d7e4d5aa00	2024-04-06T16:44:27Z	
1	bd5a69d1-0a15-42e0-90da-073377702e00	2024-04-06T16:44:24Z	
2	452d6571-4dba-4ea5-8acf-777ac906b300	2024-04-06T16:44:17Z	
3	c4827fe9-ee3a-4d1e-a320-d166620aa500	2024-04-06T16:40:46Z	
4	d87909c1-c089-4336-be59-fe56ce5ba600	2024-04-06T16:39:31Z	
...	
5297	f495a8aa-2cf1-449e-afed-2579fc408600	2024-03-07T18:31:20Z	
5298	937f1245-de51-4abb-882c-367019823700	2024-03-07T18:31:03Z	
5299	f495a8aa-2cf1-449e-afed-2579d0358600	2024-03-07T18:30:46Z	
5300	0890237d-aeae-464d-905b-17908bc7b400	2024-03-07T18:28:12Z	
5301	3cb8a923-341a-4d63-8b00-7cc108384f01	2024-03-07T18:09:45Z	

	userDisplayName	\
0	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa	
1	Tyler Neher	
2	Tyler M. Neher	
3	Tyler M. Neher	
4	Tyler M. Neher	
...	...	
5297	Tyler M. Neher	
5298	Tyler M. Neher	
5299	Tyler M. Neher	
5300	Tyler M. Neher	
5301	Tyler M. Neher	

	userPrincipalName \
0	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
1	tyler@neherdata.com
2	tyler@neherdata.com
3	tyler@neherdata.com
4	tyler@neherdata.com
...	...
5297	tyler@neherdata.com
5298	tyler@neherdata.com
5299	tyler@neherdata.com
5300	tyler@neherdata.com
5301	tyler@neherdata.com

	userId \
0	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
1	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
2	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
3	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
4	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
...	...
5297	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
5298	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
5299	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
5300	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
5301	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa

	appId	appDisplayName \
0	c44b4083-3bb0-49c1-b47d-974e53cbdf3c	Azure Portal
1	c44b4083-3bb0-49c1-b47d-974e53cbdf3c	Azure Portal
2	4813382a-8fa7-425e-ab75-3b753aab3abb	Microsoft Authenticator App
3	af124e86-4e96-495a-b70a-90f90ab96707	OneDrive iOS App
4	de8bc8b5-d9f9-48b1-a8ad-b748da725064	Graph Explorer
...
5297	a81d90ac-aa75-4cf8-b14c-58bf348528fe	Microsoft Community v2
5298	a81d90ac-aa75-4cf8-b14c-58bf348528fe	Microsoft Community v2
5299	a81d90ac-aa75-4cf8-b14c-58bf348528fe	Microsoft Community v2
5300	af124e86-4e96-495a-b70a-90f90ab96707	OneDrive iOS App
5301	27922004-5251-4030-b22d-91ecd9a37ea4	Outlook Mobile

	ipAddress	ipAddressFromResourceProvider \
0	69.141.220.21	NaN
1	69.141.220.21	NaN
2	69.141.220.21	NaN
3	69.141.220.21	NaN
4	69.141.220.21	NaN
...
5297	2600:1001:b112:cbee:8c5f:2fad:5454:f48e	NaN

5298	2600:1001:b112:cbee:8c5f:2fad:5454:f48e	NaN
5299	2600:1001:b112:cbee:8c5f:2fad:5454:f48e	NaN
5300	2600:1001:b112:cbee:8c5f:2fad:5454:f48e	NaN
5301	108.5.169.55	NaN

```

clientAppUsed ... \
0 ...
1 ...
2 Mobile Apps and Desktop clients ...
3 Mobile Apps and Desktop clients ...
4 Browser ...
...
5297 Browser ...
5298 Browser ...
5299 Browser ...
5300 Mobile Apps and Desktop clients ...
5301 Mobile Apps and Desktop clients ...

```

```

authenticationContextClassReferences \
0 []
1 []
2 []
3 []
4 []
...
5297 []
5298 []
5299 []
5300 []
5301 []

```

```

authenticationProcessingDetails \
0 [{'key': 'Root Key Type', 'value': 'Unknown'}]
1 [{'key': 'Root Key Type', 'value': 'Unknown'}]
2 [{'key': 'Root Key Type', 'value': 'Unknown'},...
3 [{'key': 'Root Key Type', 'value': 'Unknown'},...
4 [{'key': 'Root Key Type', 'value': 'Unknown'}]
...
5297 [{'key': 'Root Key Type', 'value': 'Unknown'}]
5298 [{'key': 'Root Key Type', 'value': 'Unknown'}]
5299 [{'key': 'Root Key Type', 'value': 'Unknown'}]
5300 [{'key': 'Root Key Type', 'value': 'Unknown'},...
5301 [{'key': 'Root Key Type', 'value': 'Unknown'},...

```

```

networkLocationDetails \
0 []
1 []

```

```

2          []
3          []
4          []
...
5297      ...
5298      []
5299      []
5300      []
5301      []

```

```

                                authenticationDetails \
0                                []
1    [{'authenticationStepDateTime': '2024-04-06T16...
2                                []
3                                []
4                                []
...
5297  [{'authenticationStepDateTime': '2024-03-07T18...
5298  [{'authenticationStepDateTime': '2024-03-07T18...
5299  [{'authenticationStepDateTime': '2024-03-07T18...
5300                                []
5301                                []

```

```

                                authenticationRequirementPolicies \
0                                []
1                                []
2                                []
3                                []
4                                []
...
5297      ...
5298      []
5299      []
5300      []
5301      []

```

```

                                sessionLifetimePolicies \
0                                []
1                                []
2    [{'expirationRequirement': 'rememberMultifacto...
3    [{'expirationRequirement': 'rememberMultifacto...
4    [{'expirationRequirement': 'rememberMultifacto...
...
5297  [{'expirationRequirement': 'rememberMultifacto...
5298  [{'expirationRequirement': 'rememberMultifacto...
5299  [{'expirationRequirement': 'rememberMultifacto...
5300  [{'expirationRequirement': 'rememberMultifacto...

```

```

5301  [{'expirationRequirement': 'rememberMultifactor...

                                privateLinkDetails appliedEventListeners \
0      {'policyId': '', 'policyName': '', 'resourceId...      []
1      {'policyId': '', 'policyName': '', 'resourceId...      []
2      {'policyId': '', 'policyName': '', 'resourceId...      []
3      {'policyId': '', 'policyName': '', 'resourceId...      []
4      {'policyId': '', 'policyName': '', 'resourceId...      []
...
5297  {'policyId': '', 'policyName': '', 'resourceId...      []
5298  {'policyId': '', 'policyName': '', 'resourceId...      []
5299  {'policyId': '', 'policyName': '', 'resourceId...      []
5300  {'policyId': '', 'policyName': '', 'resourceId...      []
5301  {'policyId': '', 'policyName': '', 'resourceId...      []

                                authenticationAppPolicyEvaluationDetails \
0                                          []
1      [{'policyName': 'Number Match', 'adminConfigur...
2      [{'policyName': 'App Lock', 'adminConfiguratio...
3      [{'policyName': 'App Lock', 'adminConfiguratio...
4      [{'policyName': 'App Lock', 'adminConfiguratio...
...
5297                                          []
5298                                          []
5299                                          []
5300  [{'policyName': 'App Lock', 'adminConfiguratio...
5301  [{'policyName': 'App Lock', 'adminConfiguratio...

                                managedServiceIdentity
0      {'msiType': 'none', 'associatedResourceId': No...
1      {'msiType': 'none', 'associatedResourceId': No...
2      {'msiType': 'none', 'associatedResourceId': No...
3      {'msiType': 'none', 'associatedResourceId': No...
4      {'msiType': 'none', 'associatedResourceId': No...
...
5297  {'msiType': 'none', 'associatedResourceId': No...
5298  {'msiType': 'none', 'associatedResourceId': No...
5299  {'msiType': 'none', 'associatedResourceId': No...
5300  {'msiType': 'none', 'associatedResourceId': No...
5301  {'msiType': 'none', 'associatedResourceId': No...

```

[5302 rows x 66 columns]

```
[ ]: df.columns.to_list()
```

```
[ ]: ['id',
      'createdDateTime',
```

'userDisplayName',
'userPrincipalName',
'userId',
'appId',
'appDisplayName',
'ipAddress',
'ipAddressFromResourceProvider',
'clientAppUsed',
'userAgent',
'correlationId',
'conditionalAccessStatus',
'originalRequestId',
'isInteractive',
'tokenIssuerName',
'tokenIssuerType',
'clientCredentialType',
'processingTimeInMilliseconds',
'riskDetail',
'riskLevelAggregated',
'riskLevelDuringSignIn',
'riskState',
'riskEventTypes_v2',
'resourceDisplayName',
'resourceId',
'resourceTenantId',
'homeTenantId',
'homeTenantName',
'authenticationMethodsUsed',
'authenticationRequirement',
'signInIdentifier',
'signInIdentifierType',
'servicePrincipalName',
'signInEventTypes',
'servicePrincipalId',
'federatedCredentialId',
'userType',
'flaggedForReview',
'isTenantRestricted',
'autonomousSystemNumber',
'crossTenantAccessType',
'servicePrincipalCredentialKeyId',
'servicePrincipalCredentialThumbprint',
'uniqueTokenIdentifier',
'incomingTokenType',
'authenticationProtocol',
'resourceServicePrincipalId',
'signInTokenProtectionStatus',

```

'originalTransferMethod',
'mfaDetail',
'authenticationAppDeviceDetails',
'status',
'deviceDetail',
'location',
'appliedConditionalAccessPolicies',
'authenticationContextClassReferences',
'authenticationProcessingDetails',
'networkLocationDetails',
'authenticationDetails',
'authenticationRequirementPolicies',
'sessionLifetimePolicies',
'privateLinkDetails',
'appliedEventListeners',
'authenticationAppPolicyEvaluationDetails',
'managedServiceIdentity']

```

```

[ ]: locations = df["location"]
locations[1]["geoCoordinates"]

```

```

[ ]: {'altitude': None, 'latitude': 40.35863, 'longitude': -74.13705}

```

```

[ ]: city = locations.apply(lambda x: x["city"])
state = locations.apply(lambda x: x["state"])
countryOrRegion = locations.apply(lambda x: x["countryOrRegion"])
altitude = locations.apply(lambda x: x["geoCoordinates"]).apply(
    lambda x: x["altitude"])
latitude = locations.apply(lambda x: x["geoCoordinates"]).apply(
    lambda x: x["latitude"])
longitude = locations.apply(lambda x: x["geoCoordinates"]).apply(
    lambda x: x["longitude"])

df["city"] = city
df["state"] = state
df["countryOrRegion"] = countryOrRegion
df["altitude"] = altitude
df["latitude"] = latitude
df["longitude"] = longitude

df

```

```

[ ]:

```

	id	createdDateTime	\
0	a24a547c-71e2-47fc-97bb-81d7e4d5aa00	2024-04-06T16:44:27Z	
1	bd5a69d1-0a15-42e0-90da-073377702e00	2024-04-06T16:44:24Z	

2	452d6571-4dba-4ea5-8acf-777ac906b300	2024-04-06T16:44:17Z
3	c4827fe9-ee3a-4d1e-a320-d166620aa500	2024-04-06T16:40:46Z
4	d87909c1-c089-4336-be59-fe56ce5ba600	2024-04-06T16:39:31Z
...
5297	f495a8aa-2cf1-449e-afed-2579fc408600	2024-03-07T18:31:20Z
5298	937f1245-de51-4abb-882c-367019823700	2024-03-07T18:31:03Z
5299	f495a8aa-2cf1-449e-afed-2579d0358600	2024-03-07T18:30:46Z
5300	0890237d-aeae-464d-905b-17908bc7b400	2024-03-07T18:28:12Z
5301	3cb8a923-341a-4d63-8b00-7cc108384f01	2024-03-07T18:09:45Z

	userDisplayName \
0	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
1	Tyler Neher
2	Tyler M. Neher
3	Tyler M. Neher
4	Tyler M. Neher
...	...
5297	Tyler M. Neher
5298	Tyler M. Neher
5299	Tyler M. Neher
5300	Tyler M. Neher
5301	Tyler M. Neher

	userPrincipalName \
0	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
1	tyler@neherdata.com
2	tyler@neherdata.com
3	tyler@neherdata.com
4	tyler@neherdata.com
...	...
5297	tyler@neherdata.com
5298	tyler@neherdata.com
5299	tyler@neherdata.com
5300	tyler@neherdata.com
5301	tyler@neherdata.com

	userId \
0	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
1	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
2	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
3	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
4	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
...	...
5297	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
5298	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
5299	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa
5300	a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa

5301 a3bc732b-08dc-4ec2-b327-9dcf0c1eeafa

	appId	appDisplayName	\
0	c44b4083-3bb0-49c1-b47d-974e53cbdf3c	Azure Portal	
1	c44b4083-3bb0-49c1-b47d-974e53cbdf3c	Azure Portal	
2	4813382a-8fa7-425e-ab75-3b753aab3abb	Microsoft Authenticator App	
3	af124e86-4e96-495a-b70a-90f90ab96707	OneDrive iOS App	
4	de8bc8b5-d9f9-48b1-a8ad-b748da725064	Graph Explorer	
...	
5297	a81d90ac-aa75-4cf8-b14c-58bf348528fe	Microsoft Community v2	
5298	a81d90ac-aa75-4cf8-b14c-58bf348528fe	Microsoft Community v2	
5299	a81d90ac-aa75-4cf8-b14c-58bf348528fe	Microsoft Community v2	
5300	af124e86-4e96-495a-b70a-90f90ab96707	OneDrive iOS App	
5301	27922004-5251-4030-b22d-91ecd9a37ea4	Outlook Mobile	

	ipAddress	ipAddressFromResourceProvider	\
0	69.141.220.21		NaN
1	69.141.220.21		NaN
2	69.141.220.21		NaN
3	69.141.220.21		NaN
4	69.141.220.21		NaN
...	
5297	2600:1001:b112:cbee:8c5f:2fad:5454:f48e		NaN
5298	2600:1001:b112:cbee:8c5f:2fad:5454:f48e		NaN
5299	2600:1001:b112:cbee:8c5f:2fad:5454:f48e		NaN
5300	2600:1001:b112:cbee:8c5f:2fad:5454:f48e		NaN
5301	108.5.169.55		NaN

	clientAppUsed	...	\
0		...	
1		...	
2	Mobile Apps and Desktop clients	...	
3	Mobile Apps and Desktop clients	...	
4	Browser	...	
...	
5297	Browser	...	
5298	Browser	...	
5299	Browser	...	
5300	Mobile Apps and Desktop clients	...	
5301	Mobile Apps and Desktop clients	...	

	privateLinkDetails	appliedEventListeners	\
0	{'policyId': '', 'policyName': '', 'resourceId...		[]
1	{'policyId': '', 'policyName': '', 'resourceId...		[]
2	{'policyId': '', 'policyName': '', 'resourceId...		[]
3	{'policyId': '', 'policyName': '', 'resourceId...		[]
4	{'policyId': '', 'policyName': '', 'resourceId...		[]

```

...
5297 {'policyId': '', 'policyName': '', 'resourceId... []
5298 {'policyId': '', 'policyName': '', 'resourceId... []
5299 {'policyId': '', 'policyName': '', 'resourceId... []
5300 {'policyId': '', 'policyName': '', 'resourceId... []
5301 {'policyId': '', 'policyName': '', 'resourceId... []

```

```

authenticationAppPolicyEvaluationDetails \
0 []
1 [{'policyName': 'Number Match', 'adminConfigur...
2 [{'policyName': 'App Lock', 'adminConfiguratio...
3 [{'policyName': 'App Lock', 'adminConfiguratio...
4 [{'policyName': 'App Lock', 'adminConfiguratio...
...
5297 []
5298 []
5299 []
5300 [{'policyName': 'App Lock', 'adminConfiguratio...
5301 [{'policyName': 'App Lock', 'adminConfiguratio...

```

```

managedServiceIdentity city \
0 {'msiType': 'none', 'associatedResourceId': No...
1 {'msiType': 'none', 'associatedResourceId': No... Lincroft
2 {'msiType': 'none', 'associatedResourceId': No... Lincroft
3 {'msiType': 'none', 'associatedResourceId': No... Lincroft
4 {'msiType': 'none', 'associatedResourceId': No... Lincroft
...
5297 {'msiType': 'none', 'associatedResourceId': No... Freehold
5298 {'msiType': 'none', 'associatedResourceId': No... Freehold
5299 {'msiType': 'none', 'associatedResourceId': No... Freehold
5300 {'msiType': 'none', 'associatedResourceId': No... Freehold
5301 {'msiType': 'none', 'associatedResourceId': No... Hazlet Township

```

```

state countryOrRegion altitude latitude longitude
0 None NaN NaN
1 New Jersey US None 40.35863 -74.13705
2 New Jersey US None 40.35863 -74.13705
3 New Jersey US None 40.35863 -74.13705
4 New Jersey US None 40.35863 -74.13705
...
5297 New Jersey US None 40.27322 -74.23018
5298 New Jersey US None 40.27322 -74.23018
5299 New Jersey US None 40.27322 -74.23018
5300 New Jersey US None 40.27322 -74.23018
5301 New Jersey US None 40.42598 -74.16610

```

[5302 rows x 72 columns]

```
[ ]: worldmap = gpd.read_file(gpd.datasets.get_path("naturalearth_lowres"))

# Creating axes and plotting world map
fig, ax = plt.subplots(figsize=(16, 10))
worldmap.plot(color="lightgrey", ax=ax)

x = df["longitude"]
y = df["latitude"]
plt.scatter(x, y, alpha=0.6, cmap="autumn")
# plt.colorbar(label='NeherData.com Tenant Microsoft Entra ID Login Attempts')

# Creating axis limits and title
plt.xlim([-180, 180])
plt.ylim([-90, 90])

plt.title("NeherData.com Tenant Microsoft Entra ID Login Attempts")
plt.xlabel("Longitude")
plt.ylabel("Latitude")
plt.show()
```

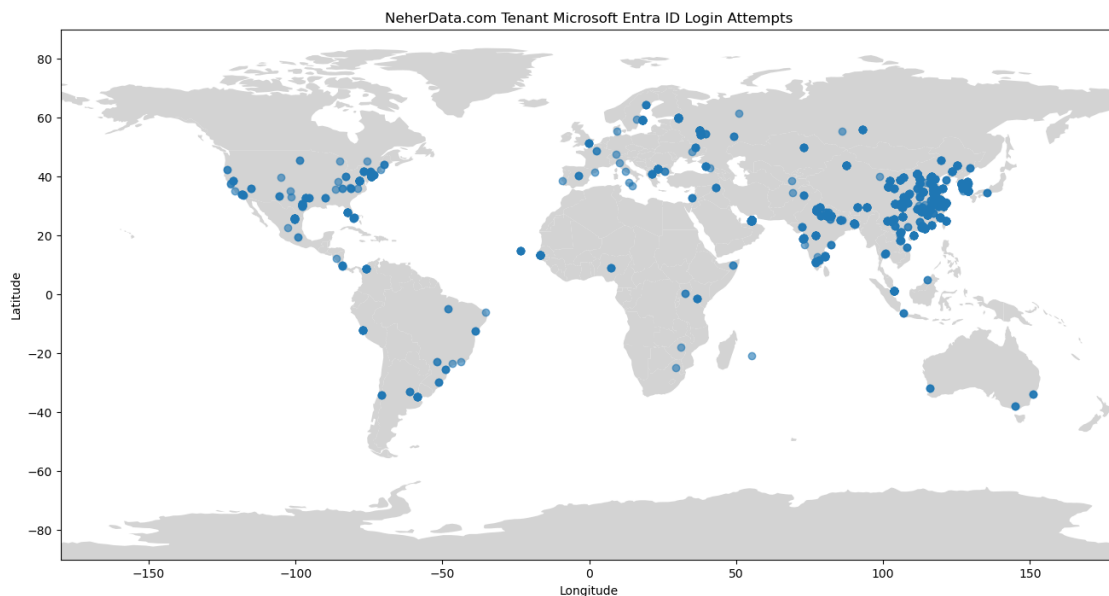
/var/folders/m4/r3wttq2j5hs_1mpf0t1yvqh80000gn/T/ipykernel_76624/2671292473.py:1
: FutureWarning: The geopandas.dataset module is deprecated and will be removed
in GeoPandas 1.0. You can get the original 'naturalearth_lowres' data from
<https://www.naturalearthdata.com/downloads/110m-cultural-vectors/>.

```
worldmap = gpd.read_file(gpd.datasets.get_path("naturalearth_lowres"))
/var/folders/m4/r3wttq2j5hs_1mpf0t1yvqh80000gn/T/ipykernel_76624/2671292473.py:9  

: UserWarning: No data for colormapping provided via 'c'. Parameters 'cmap' will  

be ignored
```

```
plt.scatter(x, y, alpha=0.6, cmap="autumn")
```



```
[ ]: # Make an empty map
m = folium.Map(location=[20, 0], tiles="CartoDB Voyager", zoom_start=2)

# Show the map
m
```

```
[ ]: <folium.folium.Map at 0x1ab143710>
```

```
[ ]: latlon_df = pd.DataFrame(
    data=df.dropna(subset=["latitude", "longitude"]),
    columns=["latitude", "longitude", "city", "state", "countryOrRegion"],
)
# latlon_df['latitude'] = df['latitude'].notna()

latlon_df
```

```
[ ]:
   latitude  longitude      city      state countryOrRegion
1   40.35863   -74.13705   Lincroft   New Jersey           US
2   40.35863   -74.13705   Lincroft   New Jersey           US
3   40.35863   -74.13705   Lincroft   New Jersey           US
4   40.35863   -74.13705   Lincroft   New Jersey           US
5   40.35863   -74.13705   Lincroft   New Jersey           US
...      ...      ...      ...      ...      ...
5297  40.27322   -74.23018   Freehold   New Jersey           US
5298  40.27322   -74.23018   Freehold   New Jersey           US
5299  40.27322   -74.23018   Freehold   New Jersey           US
5300  40.27322   -74.23018   Freehold   New Jersey           US
5301  40.42598   -74.16610  Hazlet Township New Jersey           US

[5295 rows x 5 columns]
```

```
[ ]: # add marker one by one on the map
for i in range(0, len(latlon_df)):
    folium.Marker(
        location=[latlon_df.iloc[i]["latitude"],
                  latlon_df.iloc[i]["longitude"]],
        popup=latlon_df.iloc[i]["city"],
    ).add_to(m)

# Show the map again
m
```

```
[ ]: <folium.folium.Map at 0x1ab143710>
```

```
[ ]: map_html = m._repr_html_()
```