

Time Series Analysis on Geospatial Data with Python

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Chapter 16 - Harmonic Time Series Clustering

In this example we will cluster harmonic time series obtained from Google Earth Engine. We start by installing and importing the necessary libraries:

```
In [ ]: !pip install rasterio
        !pip install tslearn
```

Collecting rasterio

Downloading rasterio-1.4.3-cp311-cp311-manylinux_2_17_x86_64.manylinux2014_x86_64.whl.metadata (9.1 kB)

Collecting affine (from rasterio)

Downloading affine-2.4.0-py3-none-any.whl.metadata (4.0 kB)

Requirement already satisfied: attrs in /usr/local/lib/python3.11/dist-packages (from rasterio) (25.3.0)

Requirement already satisfied: certifi in /usr/local/lib/python3.11/dist-packages (from rasterio) (2025.1.31)

Requirement already satisfied: click>=4.0 in /usr/local/lib/python3.11/dist-packages (from rasterio) (8.1.8)

Collecting cligj>=0.5 (from rasterio)

Downloading cligj-0.7.2-py3-none-any.whl.metadata (5.0 kB)

Requirement already satisfied: numpy>=1.24 in /usr/local/lib/python3.11/dist-packages (from rasterio) (2.0.2)

Collecting click-plugins (from rasterio)

Downloading click_plugins-1.1.1-py2.py3-none-any.whl.metadata (6.4 kB)

Requirement already satisfied: pyparsing in /usr/local/lib/python3.11/dist-packages (from rasterio) (3.2.3)

Downloading rasterio-1.4.3-cp311-cp311-manylinux_2_17_x86_64.manylinux2014_x86_64.whl (22.2 MB)

22.2/22.2 MB 68.4 MB/s eta 0:00:00

Downloading cligj-0.7.2-py3-none-any.whl (7.1 kB)

Downloading affine-2.4.0-py3-none-any.whl (15 kB)

Downloading click_plugins-1.1.1-py2.py3-none-any.whl (7.5 kB)

Installing collected packages: cligj, click-plugins, affine, rasterio

Successfully installed affine-2.4.0 click-plugins-1.1.1 cligj-0.7.2 rasterio-1.4.3

Collecting tslearn

Downloading tslearn-0.6.3-py3-none-any.whl.metadata (14 kB)

Requirement already satisfied: numpy in /usr/local/lib/python3.11/dist-packages (from tslearn) (2.0.2)

Requirement already satisfied: scipy in /usr/local/lib/python3.11/dist-packages (from tslearn) (1.14.1)

Requirement already satisfied: scikit-learn in /usr/local/lib/python3.11/dist-packages (from tslearn) (1.6.1)

Requirement already satisfied: numba in /usr/local/lib/python3.11/dist-packages (from tslearn) (0.60.0)

Requirement already satisfied: joblib in /usr/local/lib/python3.11/dist-packages (from tslearn) (1.4.2)

Requirement already satisfied: llvmlite<0.44,>=0.43.0dev0 in /usr/local/lib/python3.11/dist-packages (from numba->tslearn) (0.43.0)

Requirement already satisfied: threadpoolctl>=3.1.0 in /usr/local/lib/python3.11/dist-packages (from scikit-learn->tslearn) (3.6.0)

Downloading tslearn-0.6.3-py3-none-any.whl (374 kB)

374.4/374.4 kB 5.3 MB/s eta 0:00:00

Installing collected packages: tslearn

Successfully installed tslearn-0.6.3

```
In [ ]: import ee
        ee.Authenticate()
        ee.Initialize(project='my-project-1527255156007')
```

```
In [ ]: import folium
        from folium import plugins
        from IPython.display import Image
        import geopandas as gpd
        import json
        import math
        import pandas as pd
```

```
from tslearn.clustering import TimeSeriesKMeans
from tslearn.utils import to_time_series_dataset
```

Let's select our area and generate 60 random points in that area:

```
In [ ]: AOI = ee.Geometry.Polygon(
        [[[-56.37397887990624, -12.737207954893526],
          [-56.37397887990624, -13.300834158918619],
          [-55.37113311574608, -13.300834158918619],
          [-55.37113311574608, -12.737207954893526]]]])
points = ee.FeatureCollection.randomPoints(AOI,60)
```

Let's create a monthly image collection from 2017 to 2019:

```
In [ ]: months = ee.List.sequence(1,12)
years = ee.List.sequence(2017, 2019)
```

```
In [ ]: MD_NDVI = ee.ImageCollection('MODIS/MOD09GA_006_NDVI').filterDate('2017-1-1','2019-12-31')
```

Let's visualize our analysis area, with the points created:

```
In [ ]: modis_ndvi = MD_NDVI.median().clip(AOI)
mean_ndvi = MD_NDVI.mean().clip(AOI)
```

```
In [ ]: vis_params = {'min': 0, 'max': 1, 'b': ['red', 'yellow','green']}
```

```
In [ ]: basemaps = {
    'Google Maps': folium.TileLayer(
        tiles = 'https://mt1.google.com/vt/lyrs=m&x={x}&y={y}&z={z}',
        attr = 'Google',
        name = 'Google Maps',
        overlay = True,
        control = True
    ),
    'Google Satellite': folium.TileLayer(
        tiles = 'https://mt1.google.com/vt/lyrs=s&x={x}&y={y}&z={z}',
        attr = 'Google',
        name = 'Google Satellite',
        overlay = True,
        control = True
    ),
    'Google Terrain': folium.TileLayer(
        tiles = 'https://mt1.google.com/vt/lyrs=p&x={x}&y={y}&z={z}',
        attr = 'Google',
        name = 'Google Terrain',
        overlay = True,
        control = True
    ),
    'Google Satellite Hybrid': folium.TileLayer(
        tiles = 'https://mt1.google.com/vt/lyrs=y&x={x}&y={y}&z={z}',
        attr = 'Google',
        name = 'Google Satellite',
        overlay = True,
        control = True
    ),
    'Esri Satellite': folium.TileLayer(
        tiles = 'https://server.arcgisonline.com/ArcGIS/rest/services/World_Imagery/MapServer/tile/{z}/{y}/{x}'
```

```

        attr = 'Esri',
        name = 'Esri Satellite',
        overlay = True,
        control = True
    )
}

```

```

In [ ]: def add_ee_layer(self, ee_object, vis_params, name):

    try:
        # display ee.Image()
        if isinstance(ee_object, ee.image.Image):
            map_id_dict = ee.Image(ee_object).getMapId(vis_params)
            folium.raster_layers.TileLayer(
                tiles = map_id_dict['tile_fetcher'].url_format,
                attr = 'Google Earth Engine',
                name = name,
                overlay = True,
                control = True
            ).add_to(self)
        # display ee.ImageCollection()
        elif isinstance(ee_object, ee.imagecollection.ImageCollection):
            ee_object_new = ee_object.mosaic()
            map_id_dict = ee.Image(ee_object_new).getMapId(vis_params)
            folium.raster_layers.TileLayer(
                tiles = map_id_dict['tile_fetcher'].url_format,
                attr = 'Google Earth Engine',
                name = name,
                overlay = True,
                control = True
            ).add_to(self)
        # display ee.Geometry()
        elif isinstance(ee_object, ee.geometry.Geometry):
            folium.GeoJson(
                data = ee_object.getInfo(),
                name = name,
                overlay = True,
                control = True
            ).add_to(self)
        # display ee.FeatureCollection()
        elif isinstance(ee_object, ee.featurecollection.FeatureCollection):
            ee_object_new = ee.Image().paint(ee_object, 0, 2)
            map_id_dict = ee.Image(ee_object_new).getMapId(vis_params)
            folium.raster_layers.TileLayer(
                tiles = map_id_dict['tile_fetcher'].url_format,
                attr = 'Google Earth Engine',
                name = name,
                overlay = True,
                control = True
            ).add_to(self)

    except:
        print("Could not display {}".format(name))

    # Add EE drawing method to folium.
    folium.Map.add_ee_layer = add_ee_layer

```

```

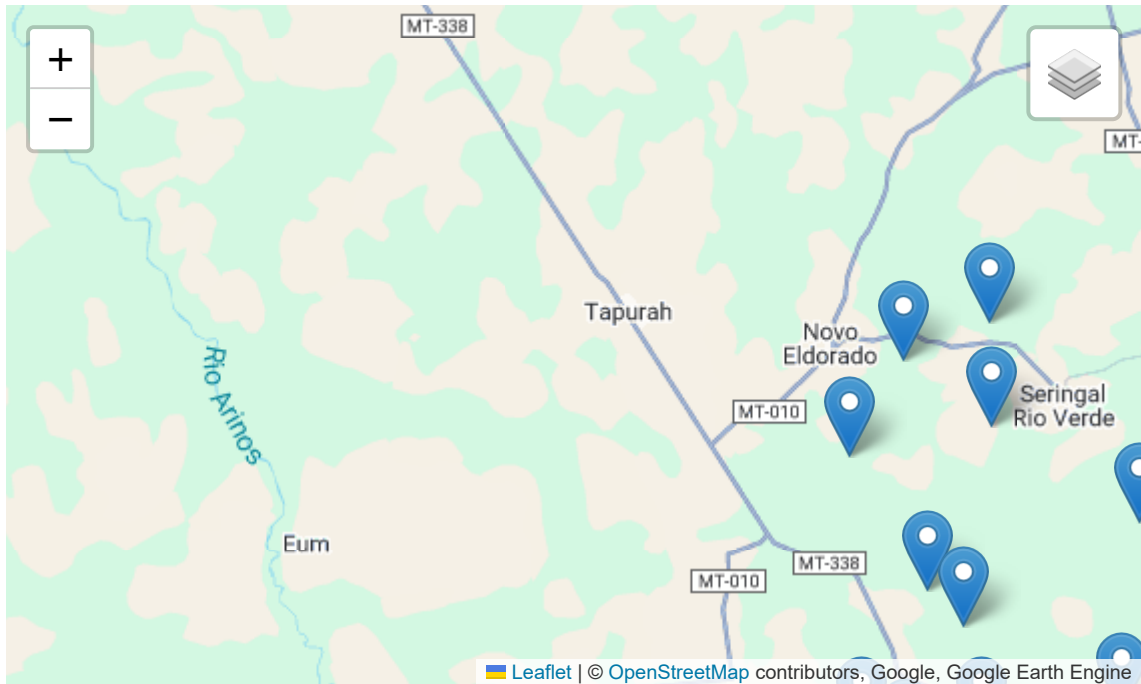
In [ ]: my_map = folium.Map(location=[-13.0912068, -55.9881647], zoom_start=10)

```

```
# Add custom basemaps
basemaps['Google Maps'].add_to(my_map)

# Add the elevation model to the map object.
my_map.add_ee_layer(modis_ndvi, vis_params, 'NDVI')
my_map.add_ee_layer(points.geometry(), {}, 'Points')
my_map.add_child(folium.LayerControl())

# Display the map.
display(my_map)
```



We can then generate our monthly collection of images:

```
In [ ]: def monthly(collection):
        img_coll = ee.ImageCollection([])
        for y in years.getInfo():
            for m in months.getInfo():
                filtered = collection.filter(ee.Filter.calendarRange(y, y, 'year')).filter
                filtered = filtered.median()
                img_coll = img_coll.merge(filtered.set('year', y).set('month', m).set('sys
        return img_coll
```

```
In [ ]: Monthly_MD = monthly(MD_NDVI)
```

Now we generate our NDVI harmonic series:

```
In [ ]: dependent = 'NDVI'
        harmonics = 3
        harmonicFrequencies = list(range(1, harmonics+1))
```

```
In [ ]: harmonicFrequencies
```

```
Out[ ]: [1, 2, 3]
```

```
In [ ]: def getNames (base, lst_freq) :
        name_lst = []
        for i in lst_freq:
```

```

    name_lst.append(ee.String(base + str(i)))
    return name_lst

```

```

In [ ]: cosNames = getNames('cos_', harmonicFrequencies);
        sinNames = getNames('sin_', harmonicFrequencies);
        independents = ee.List(['constant', 't']).cat(cosNames).cat(sinNames);

```

```

In [ ]: def addConstant (image) :
        return image.addBands(ee.Image(1));

```

```

In [ ]: def addTime (image) :
        date = ee.Date(image.get('system:time_start'));
        years = date.difference(ee.Date('1970-01-01'), 'year');
        timeRadians = ee.Image(years.multiply(2 * math.pi));
        return image.addBands(timeRadians.rename('t').float());

```

```

In [ ]: def addHarmonics (image) :
        frequencies = ee.Image.constant(harmonicFrequencies)
        time = ee.Image(image).select('t')
        cosines = time.multiply(frequencies).cos().rename(cosNames)
        sines = time.multiply(frequencies).sin().rename(sinNames)
        return image.addBands(cosines).addBands(sines)

```

```

In [ ]: harmonicMODIS2 = Monthly_MD.map(addConstant).map(addTime).map(addHarmonics);

```

```

In [ ]: harmonicTrend = harmonicMODIS2.select(independents.add(dependent)).reduce(ee.Red

```

```

In [ ]: harmonicTrendCoefficients = harmonicTrend.select('coefficients').arrayProject([0

```

```

In [ ]: fittedHarmonic = harmonicMODIS2.map(lambda image : image.addBands(image.select(i

```

```

In [ ]: print(fittedHarmonic.getInfo())
        print(harmonicTrendCoefficients.getInfo())

```

```

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```

[illegible]

[illegible]

[illegible]


```

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```

[illegible]

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```

```

In [ ]: def fitted_harmonic_to_df(fitted_harmonic_coll, fc):

    fitted_values_list = []
    dates_list = []

    for i in range(fitted_harmonic_coll.size().getInfo()):
        image = ee.Image(fitted_harmonic_coll.toList(fitted_harmonic_coll.size()).get(i))
        fitted_value = image.reduceRegion(
            reducer=ee.Reducer.first(),
            geometry=fc, # Assuming 'fc' is your region of interest
            scale=30,
            maxPixels=1e13
        ).get('fitted').getInfo()
        date = image.date().format('YYYY-MM-dd').getInfo()

        fitted_values_list.append(fitted_value)
        dates_list.append(date)

    df = pd.DataFrame({'fitted': fitted_values_list}, index=pd.to_datetime(dates_list))
    return df

```

For each point, we extract the NDVI harmonic series and add it to our DataFrame:

```
In [ ]: df_points = pd.DataFrame([])
        for n in range(1, points.size().getInfo() + 1):
            print(n)
            feat = ee.Geometry.Point(points.getInfo()["features"][n-1]['geometry']['coordi
            fitted_df = fitted_harmonic_to_df(fittedHarmonic, feat)
            df_points = pd.concat([df_points, fitted_df], axis=1)
```

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WARNING:googleapiclient.http:Sleeping 1.01 seconds before retry 1 of 5 for request: POST https://earthengine.googleapis.com/v1/projects/my-project-1527255156007/value:compute?prettyPrint=false&alt=json, after 503

WARNING:googleapiclient.http:Sleeping 1.85 seconds before retry 1 of 5 for request: POST https://earthengine.googleapis.com/v1/projects/my-project-1527255156007/value:compute?prettyPrint=false&alt=json, after 503

WARNING:googleapiclient.http:Sleeping 1.31 seconds before retry 1 of 5 for request: POST https://earthengine.googleapis.com/v1/projects/my-project-1527255156007/value:compute?prettyPrint=false&alt=json, after 503

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WARNING:googleapiclient.http:Sleeping 1.42 seconds before retry 1 of 5 for request: POST https://earthengine.googleapis.com/v1/projects/my-project-1527255156007/value:compute?prettyPrint=false&alt=json, after 503

5

WARNING:googleapiclient.http:Sleeping 1.45 seconds before retry 1 of 5 for request: POST https://earthengine.googleapis.com/v1/projects/my-project-1527255156007/value:compute?prettyPrint=false&alt=json, after 503

WARNING:googleapiclient.http:Sleeping 1.30 seconds before retry 1 of 5 for request: POST https://earthengine.googleapis.com/v1/projects/my-project-1527255156007/value:compute?prettyPrint=false&alt=json, after 503

6

WARNING:googleapiclient.http:Sleeping 1.77 seconds before retry 1 of 5 for request: POST https://earthengine.googleapis.com/v1/projects/my-project-1527255156007/value:compute?prettyPrint=false&alt=json, after 503

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WARNING:googleapiclient.http:Sleeping 0.55 seconds before retry 1 of 5 for request: POST https://earthengine.googleapis.com/v1/projects/my-project-1527255156007/value:compute?prettyPrint=false&alt=json, after 502

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```

-----
KeyboardInterrupt                                Traceback (most recent call last)
<ipython-input-27-dc42ac37afaa> in <cell line: 0>()
      3     print(n)
      4     feat = ee.Geometry.Point(points.getInfo()["features"][n-1]['geometry']
['coordinates'])
----> 5     fitted_df = fitted_harmonic_to_df(fittedHarmonic, feat)
      6     df_points = pd.concat([df_points, fitted_df], axis=1)

<ipython-input-26-70adabb2bf3f> in fitted_harmonic_to_df(fitted_harmonic_coll, f
c)
     11         scale=30,
     12         maxPixels=1e13
--> 13     ).get('fitted').getInfo()
     14     date = image.date().format('YYYY-MM-dd').getInfo()
     15

/usr/local/lib/python3.11/dist-packages/ee/computedobject.py in getInfo(self)
    105     The object can evaluate to anything.
    106     """
--> 107     return data.computeValue(self)
    108
    109     def encode(self, encoder: Optional[Callable[..., Any]]) -> Dict[str, An
y]:

/usr/local/lib/python3.11/dist-packages/ee/data.py in computeValue(obj)
    1126     _maybe_populate_workload_tag(body)
    1127
-> 1128     return _execute_cloud_call(
    1129         _get_cloud_projects()
    1130         .value()

/usr/local/lib/python3.11/dist-packages/ee/data.py in _execute_cloud_call(call, n
um_retries)
    406     num_retries = _max_retries if num_retries is None else num_retries
    407     try:
--> 408         return call.execute(num_retries=num_retries)
    409     except googleapiclient.errors.HttpError as e:
    410         raise _translate_cloud_exception(e) # pylint: disable=raise-missing-
from

/usr/local/lib/python3.11/dist-packages/googleapiclient/_helpers.py in positional
_wrapper(*args, **kwargs)
    128         elif positional_parameters_enforcement == POSITIONAL_WARN
ING:
    129             logger.warning(message)
--> 130         return wrapped(*args, **kwargs)
    131
    132         return positional_wrapper

/usr/local/lib/python3.11/dist-packages/googleapiclient/http.py in execute(self,
http, num_retries)
    921
    922         # Handle retries for server-side errors.
--> 923         resp, content = _retry_request(
    924             http,
    925             num_retries,

/usr/local/lib/python3.11/dist-packages/googleapiclient/http.py in _retry_request
(http, num_retries, req_type, sleep, rand, uri, method, *args, **kwargs)

```

```

189         try:
190             exception = None
--> 191             resp, content = http.request(uri, method, *args, **kwargs)
192             # Retry on SSL errors and socket timeout errors.
193         except _ssl_SSLError as ssl_error:

/usr/local/lib/python3.11/dist-packages/google_auth_httplib2.py in request(self,
uri, method, body, headers, redirections, connection_type, **kwargs)
216
217         # Make the request.
--> 218         response, content = self.http.request(
219             uri,
220             method,

/usr/local/lib/python3.11/dist-packages/ee/_cloud_api_utils.py in request(**fail
ed resolving arguments**)
68         # requests errors should be converted to kinds that googleapiclient
69         # consider transient.
---> 70         response = self._session.request(
71             method, uri, data=body, headers=headers, timeout=self._timeout
72         )

/usr/local/lib/python3.11/dist-packages/requests/sessions.py in request(self, met
hod, url, params, data, headers, cookies, files, auth, timeout, allow_redirects,
proxies, hooks, stream, verify, cert, json)
587         }
588         send_kwargs.update(settings)
--> 589         resp = self.send(prep, **send_kwargs)
590
591         return resp

/usr/local/lib/python3.11/dist-packages/requests/sessions.py in send(self, reques
t, **kwargs)
701
702         # Send the request
--> 703         r = adapter.send(request, **kwargs)
704
705         # Total elapsed time of the request (approximately)

/usr/local/lib/python3.11/dist-packages/requests/adapters.py in send(self, reques
t, stream, timeout, verify, cert, proxies)
665
666         try:
--> 667             resp = conn.urlopen(
668                 method=request.method,
669                 url=url,

/usr/local/lib/python3.11/dist-packages/urllib3/connectionpool.py in urlopen(sel
f, method, url, body, headers, retries, redirect, assert_same_host, timeout, pool
_timeout, release_conn, chunked, body_pos, preload_content, decode_content, **res
ponse_kw)
785
786         # Make the request on the HTTPConnection object
--> 787         response = self._make_request(
788             conn,
789             method,

```

```

/usr/local/lib/python3.11/dist-packages/urllib3/connectionpool.py in _make_reques
t(self, conn, method, url, body, headers, retries, timeout, chunked, response_con
n, preload_content, decode_content, enforce_content_length)

```

```

532         # Receive the response from the server
533         try:
--> 534             response = conn.getresponse()
535         except (BaseSSLError, OSError) as e:
536             self._raise_timeout(err=e, url=url, timeout_value=read_timeou
t)

/usr/local/lib/python3.11/dist-packages/urllib3/connection.py in getresponse(self)
514
515         # Get the response from http.client.HTTPConnection
--> 516         httplib_response = super().getresponse()
517
518         try:

/usr/lib/python3.11/http/client.py in getresponse(self)
1393         try:
1394             try:
-> 1395                 response.begin()
1396             except ConnectionError:
1397                 self.close()

/usr/lib/python3.11/http/client.py in begin(self)
323         # read until we get a non-100 response
324         while True:
--> 325             version, status, reason = self._read_status()
326             if status != CONTINUE:
327                 break

/usr/lib/python3.11/http/client.py in _read_status(self)
284
285     def _read_status(self):
--> 286         line = str(self.fp.readline(_MAXLINE + 1), "iso-8859-1")
287         if len(line) > _MAXLINE:
288             raise LineTooLong("status line")

/usr/lib/python3.11/socket.py in readinto(self, b)
716         while True:
717             try:
--> 718                 return self._sock.recv_into(b)
719             except timeout:
720                 self._timeout_occurred = True

/usr/lib/python3.11/ssl.py in recv_into(self, buffer, nbytes, flags)
1312             "non-zero flags not allowed in calls to recv_into() on
%s" %
1313             self.__class__)
-> 1314             return self.read(nbytes, buffer)
1315         else:
1316             return super().recv_into(buffer, nbytes, flags)

/usr/lib/python3.11/ssl.py in read(self, len, buffer)
1164         try:
1165             if buffer is not None:
-> 1166                 return self._sslobj.read(len, buffer)
1167             else:
1168                 return self._sslobj.read(len)

```

KeyboardInterrupt:

With the DataFrame ready, let's apply TimeSeriesKMeans:

```
In [ ]: print(df_points)
```

```
In [ ]: X = df_points.values
```

```
In [ ]: formatted_X = to_time_series_dataset(X)
formatted_X.shape
```

```
Out[ ]: (100, 48, 1)
```

```
In [ ]: km = TimeSeriesKMeans(n_clusters=2, metric="dtw")
labels = km.fit_predict(formatted_X)
```

```
In [ ]: km = TimeSeriesKMeans(n_clusters=3, metric="softdtw")
labels = km.fit_predict(formatted_X)
```

```
In [ ]: labels
```

```
Out[ ]: array([0, 0, 0, 0, 1, 1, 0, 1, 0, 0, 0, 0, 0, 1, 0, 0, 1, 0, 0, 0, 1, 0,
              0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 1, 0, 0, 1, 0, 0, 0, 0, 0, 0, 1, 1, 0,
              1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 1, 0,
              1, 0, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0,
              0, 0, 0, 1, 0, 0, 0, 0, 0, 1, 1, 0])
```

```
In [ ]: labels_bis
```

```
Out[ ]: array([1, 1, 1, 0, 2, 2, 1, 2, 1, 1, 1, 1, 1, 2, 0, 0, 2, 1, 1, 0, 0, 1,
              1, 1, 0, 1, 1, 1, 1, 1, 0, 1, 2, 1, 0, 2, 0, 0, 1, 1, 1, 2, 2, 1,
              0, 0, 1, 1, 1, 1, 1, 1, 1, 0, 0, 1, 0, 1, 1, 1, 1, 1, 1, 2, 1,
              2, 0, 0, 0, 1, 1, 1, 1, 0, 1, 0, 1, 1, 0, 0, 1, 1, 1, 1, 0, 1, 1,
              0, 0, 1, 2, 0, 1, 1, 1, 1, 2, 2, 0])
```

```
In [ ]: newdata = gpd.GeoDataFrame.from_features(points.getInfo()["features"])
newdata['Class'] = labels_bis
```

```
In [ ]: newdata['Class'].values
```

```
Out[ ]: array([1, 1, 1, 0, 2, 2, 1, 2, 1, 1, 1, 1, 1, 2, 0, 0, 2, 1, 1, 0, 0, 1,
              1, 1, 0, 1, 1, 1, 1, 1, 0, 1, 2, 1, 0, 2, 0, 0, 1, 1, 1, 2, 2, 1,
              0, 0, 1, 1, 1, 1, 1, 1, 1, 0, 0, 1, 0, 1, 1, 1, 1, 1, 1, 2, 1,
              2, 0, 0, 0, 1, 1, 1, 1, 0, 1, 0, 1, 1, 0, 0, 1, 1, 1, 1, 0, 1, 1,
              0, 0, 1, 2, 0, 1, 1, 1, 1, 2, 2, 0])
```

With the generated classes we present using Folium:

```
In [ ]: resultmap = folium.Map(location=[-13.0912068, -55.9881647], zoom_start=10)
basemaps['Google Satellite Hybrid'].add_to(resultmap)

latitudes = list(newdata.geometry.y.values)
longitudes = list(newdata.geometry.x.values)
labels = list(newdata['Class'].values)
for lat, lng, label in zip(latitudes, longitudes, labels):
    if label == 0:
        folium.Marker(
            location = [lat, lng],
            popup = str(label),
```

```

        icon = folium.Icon(color='red')
    ).add_to(resultmap)
elif label == 1:
    folium.Marker(
        location = [lat, lng],
        popup = str(label),
        icon = folium.Icon(color='blue')
    ).add_to(resultmap)
else:
    folium.Marker(
        location = [lat, lng],
        popup = str(label),
        icon = folium.Icon(color='green')
    ).add_to(resultmap)

vis_params = {'min': 0, 'max': 1}# Add the elevation model to the map object.
resultmap.add_ee_layer(rgb, {}, 'phase (hue), amplitude (sat), ndvi (value)')
resultmap.add_child(folium.LayerControl())

# Display the map.
display(resultmap)

```



Thank you! See you in the next Chapter!