```
from pprint import pprint
from PIL import Image
import numpy as np
import pandas as pd
import os
import matplotlib.pyplot as plt
import glob
import xml.etree.ElementTree as ET
from scipy.signal import savgol filter
import qc
from scipy.interpolate import CubicSpline
from scipy.interpolate import interpld
# Distance betwen moon and sun in AUs
D AU = 1
# Solar irradiance
F0 = np.array([
  136.1259307,
  129.8781929,
  125.1457188,
  120.4566749,
  115.2187742,
  110.7989129,
  105.971862,
  102.2853476.
  98.83159112,
  95.00990644,
  91.72241746,
  88.63043389,
  85.44216416,
  83.09659958,
  80.7461688,
  77.99745659,
  75.43755054,
  72.53298554,
  70.30310472,
  67.71506702,
  65.53063581,
  63.51647332,
  61.49193881,
  59.39769145,
  57.24811211,
  55.56974549.
  53.96628612,
  52.39858882,
  50.94286582,
  49.55873832,
  47.99340839,
  46.35543865,
```

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45.11640663,
43.75374359,
42.46741487,
41.1950428,
39.93375405,
38.7480202,
37.63257797,
36.52968828,
35.48372942,
34.51571377,
33.5041102,
32.62925225,
31.80035805,
30.98128654,
30.16775831,
29.32709974,
28.56074168,
27.8298174,
27.0453247,
26.30808675,
25.51810387,
24.75010497,
24.00573968,
23.24760491,
22.51761852,
21.78398871,
21.06792047,
20.39822233,
19.7458807,
19.11661541,
18.44061437,
17.83250529,
17.26068394,
16.65126453,
16.11545704,
15.61912435,
15.1210474,
14.62910738,
14.16359209,
13.72237684,
13.31430194,
12.94713935,
12.56233275,
12.18239943,
11.79722098,
11.38810049,
11.04636914,
10.71621297,
10.38904988,
```

```
10.06620698,
9.753295821,
9.46418631,
9.201075776,
8.960974818,
8.732115834,
8.508712424,
8.28861478,
8.070068082,
7.850866176,
7.629585176,
7.417896212,
7.21399149,
7.014245694,
6.819995994,
6.637200746,
6.463212542,
6.291676014,
6.122400975,
5.952327234,
5.785907458,
5.631916792,
5.48221029,
5.338864421,
5.183886388,
5.053359936,
4.941756508,
4.835098184,
4.719922707,
4.619729215,
4.511137419,
4.407240202,
4.306184976,
4.210413629,
4.117013411,
4.012368768,
3.918726643,
3.824014432,
3.725826304,
3.646586732,
3.564719937,
3.488199195,
3.397463341,
3.32250234,
3.262984894,
3.190955311,
3.122692223,
3.056477464,
2.991274348,
```

```
2.926566072,
2.864612339,
2.802940836,
2.743157021,
2.685370618,
2.628641884,
2.571929704,
2.517226294,
2.465127643,
2.414375576,
2.365285234,
2.316701141,
2.26923212,
2.222564505,
2.178496705,
2.135290025,
2.092826765,
2.051565701,
2.010893773,
1.971470582,
1.932492639,
1.893925453,
1.853239032,
1.814419696,
1.780829606,
1.751599126,
1.715922793,
1.680125966,
1.647791753,
1.621454182,
1.593640531,
1.560460708,
1.532378246,
1.507178355,
1.480349348,
1.454525518,
1.426003985,
1.40026592,
1.376814112,
1.351395724,
1.327241488,
1.303320437,
1.279240078,
1.255715058,
1.232621586,
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1.186777237,
1.163774025,
1.141839466,
```

```
1.121354795,
1.102697582,
1.084984542,
1.06779729,
1.050654559,
1.034116451,
1.018239678,
1.003106371,
0.987228033,
0.971082552,
0.954532246,
0.938549781,
0.922761605.
0.90746215,
0.892772367,
0.876952832,
0.86169586,
0.846904043,
0.832961745,
0.820193322,
0.808495532,
0.796418017,
0.784036511,
0.771772032,
0.760169612,
0.74902997,
0.737997332,
0.727055348,
0.716477866,
0.704633464,
0.691770452,
0.681177697,
0.668685204,
0.6563386,
0.643784606,
0.630929839,
0.618670348,
0.605670184,
0.593191697,
0.582320158,
0.571630629,
0.561438106,
0.551831735,
0.542986524,
0.534529199,
0.526707332,
0.518722109,
0.511109087,
0.50373316,
```

```
0.496221855,
  0.489530981,
  0.482582186,
  0.475974536,
  0.469794569,
  0.463575699,
  0.458286546,
  0.452850271,
  0.447197638,
  0.441572082,
  0.43580287,
  0.430755766,
  0.425717099,
  0.420589447,
  0.41588213,
  0.410468477,
  0.405233536,
  0.399887123,
  0.394668014,
  0.389642973,
  0.384580319,
  0.379611238,
  0.374544041,
  0.369613524,
  0.364863435,
  0.360132602,
  0.355533758,
  0.350967069,
]).reshape(256,1,1)
class utils:
    @staticmethod
    def _extract_sequence_numbers(file_path):
        Extracts the text content of <sequence number> elements from
an XML file.
        Args:
            file path (str): The path to the XML file.
        Returns:
            list: A list of text contents from <sequence_number>
elements.
        # Parse the XML file
        tree = ET.parse(file_path)
        root = tree.getroot()
        # Find all sequence_number elements
        sequence numbers =
```

```
root.findall('.//{http://pds.nasa.gov/pds4/pds/v1}elements')
        # Extract the text content from each <sequence number> element
        return [int(sequence number.text) for sequence number in
sequence numbers1
    @staticmethod
    def _find_xml_files(base_path):
        Finds all XML files matching the pattern
/data/calibrated/*/*.xml within the given base path.
        Args:
            base path (str): The base directory path where the search
begins.
        Returns:
           list: A list of paths to the matching XML files.
        # Define the search pattern
        pattern = os.path.join(base_path, 'data', 'calibrated', '*',
'*.xml')
        # Use glob to find all files matching the pattern
        matching files = glob.glob(pattern)
        matching files.sort()
        return matching files
    @staticmethod
    def _find_qub_files(base_path):
        Finds all .qub files matching the pattern
/data/calibrated/*/*.qub within the given base path.
       Args:
            base path (str): The base directory path where the search
begins.
        Returns:
            list: A list of paths to the matching .gub files.
        # Define the search pattern
        pattern = os.path.join(base path, 'data', 'calibrated', '*',
'*.qub')
        # Use glob to find all files matching the pattern
        matching files = glob.glob(pattern)
        matching files.sort()
        return matching files
    @staticmethod
    def get image array(qub path,shape):
```

```
0.00
        Args:
            qub path : path to the .qub file
            shape : shape of the image of form (channels, height, width)
        returns:
            a numpy array reshaped in the shape provided
        with open(qub path, 'rb') as f:
            img = np.frombuffer(f.read(),
dtype=np.float32).reshape(*shape)
        return img
    @staticmethod
    def get_image(base_path):
        Args:
            base path : Base directory path to the data. Which means
the path to directory which contains the browse, data geometyr and
miscellaneous folder
        returns:
            A list of images with the radiance resized and resamped.
To visualize it you need to do min max scaling and stuff
        xml files = utils. find xml files(base path)
        image_files = utils._find_qub_files(base_path)
        shapes = [utils. extract sequence numbers(xml file) for
xml_file in xml files1
        images = [utils. get image array(qub path,shape) for
qub path,shape in zip(image files,shapes)]
        return images
    @staticmethod
    def read misc files into df(file path):
        with open(file path) as f:
            data = f.read()
        rows = data.split('\n')
        parsed_list = [' '.join(row.split()).split() for row in rows]
        return pd.DataFrame(parsed list)
    @staticmethod
    def _get_misc_files(base_path):
        Aras:
            base path : Base directory path to the data. Which means
the path to directory which contains the browse, data geometyr and
miscellaneous folder
        returns:
            A dictionary of miscellaneous files converted to the
dataframe
        0.00
```

```
pattern = os.path.join(os.path.join(base_path,
'miscellaneous', 'calibrated', '*', '*.*'))
        matching files = glob.glob(pattern)
        matching files.sort()
        dfs = \{\}
        for file path in matching files:
            print(file path)
            _, file_extension = os.path.splitext(file path)
            dfs[file extension] =
utils. read misc files into df(file path).dropna()
        return dfs
    @staticmethod
    def get_misc_files(base_path):
        Args:
            base path : Base directory path to the data. Which means
the path to directory which contains the browse, data geometyr and
miscellaneous folder
        returns:
            A dictionary of miscellaneous files converted to the
dataframe
        dfs = utils. get misc files(base path)
        dfs['.spm'] = utils. process spm df(dfs['.spm'])
        dfs['.oat'] = utils._process_oat_df(dfs['.oat'])
        return dfs
    @staticmethod
    def convert to reflectance(data, solar zenith angle):
        return (np.pi * data)/(np.cos(solar zenith angle * np.pi /
180) * F0 * D_AU**2)
    @staticmethod
    def process spm df(spm df):
        column names = [
             "Record type", "Physical record number", "Block length",
              "Year",
            "Month",
            "Date",
             "Hour",
            "Minute",
            "Second",
            "Millisec", "Satellite position X", "Satellite position
Υ",
            "Satellite position Z", "Satellite velocity X-dot",
            "Satellite velocity Y-dot", "Satellite velocity Z-dot", "Phase angle", "Sun aspect", "Sun Azimuth",
            "Sun Elevation",
```

```
# Assign the new column names
        spm df.columns = column names
        # Convert the columns to the appropriate data types
        spm_df["Record type"] = spm_df["Record type"].astype(str)
        spm df["Physical record number"] = spm df["Physical record
number"].astype(np.int32)
        spm df["Block length"] = spm df["Block
length"].astype(np.int32)
        # spm_df['Year'] = spm_df['Year'].astype(np.int32)
        spm df['Month'] = spm df['Month'].astype(np.int32)
        spm df['Date'] = spm_df['Date'].astype(np.int32)
        spm df['Hour'] = spm df['Hour'].astype(np.int32)
        spm_df['Minute'] = spm_df['Minute'].astype(np.int32)
        spm df['Second'] = spm df['Second'].astype(np.int32)
        spm df['Millisec'] = spm df['Millisec'].astype(np.int32)
        # For "Time in UTC", assuming it is in the format
'YYYYMMDDHHMMSS', convert to datetime
        spm_df["Satellite position X"] = spm_df["Satellite position
X"].astype(np.float32)
        spm_df["Satellite position Y"] = spm_df["Satellite position
Y"1.astype(np.float32)
        spm_df["Satellite position Z"] = spm_df["Satellite position
Z"].astype(np.float32)
        spm df["Satellite velocity X-dot"] = spm df["Satellite
velocity X-dot"].astype(np.float32)
        spm df["Satellite velocity Y-dot"] = spm df["Satellite
velocity Y-dot"].astype(np.float32)
        spm df["Satellite velocity Z-dot"] = spm df["Satellite
velocity Z-dot"].astype(np.float32)
        spm df["Phase angle"] = spm df["Phase
angle"].astype(np.float32)
        spm_df["Sun aspect"] = spm_df["Sun aspect"].astype(np.float32)
        spm df["Sun Azimuth"] = spm df["Sun
Azimuth"].astype(np.float32)
        spm df["Sun Elevation"] = spm df["Sun
Elevation"].astype(np.float32)
        # spm df["Orbit Limb Direction"] = spm df["Orbit Limb
Direction"].astype(int)
        return spm df
    @staticmethod
    def _process_oat_df(oat df):
        columns names = [
            "Record type",
            "Physical record number in this file",
            "Block length in bytes",
            "Month",
```

```
"Date",
    "Hour",
    "Minute",
    "Second",
    "Millisec",
    "Lunar Position X (kms) - J2000 Earth Centre Frame",
    "Lunar Position Y (kms) - J2000 Earth Centre Frame",
    "Lunar Position Z (kms) - J2000 Earth Centre Frame",
    "Satellite position X (kms) - Note-3",
    "Satellite position Y (kms) - Note-3",
    "Satellite position Z (kms) - Note-3",
    "Satellite velocity X-dot (kms/sec) - Note-3",
    "Satellite velocity Y-dot (kms/sec) - Note-3",
    "Satellite velocity Z-dot (kms/sec) - Note-3",
    "Altitude Inertial Q1",
    "Altitude Inertial Q2"
    "Altitude Inertial Q3"
    "Altitude Inertial Q4",
    "Earth Fixed IAU frame Q1",
    "Earth Fixed IAU frame Q2"
    "Earth Fixed IAU frame Q3"
    "Earth Fixed IAU frame Q4"
    "Lunar Fixed IAU frame Q1",
    "Lunar Fixed IAU frame Q2",
    "Lunar Fixed IAU frame Q3",
    "Lunar Fixed IAU frame Q4",
    "Latitude of sub-satellite point (deg)",
    "Longitude of sub-satellite point (deg)",
    "Solar Azimuth",
    "Solar Elevation",
    "Latitude (deg)"
    "Longitude (deg)",
    "Satellite altitude (kms)",
    "Angle between +Roll and Velocity Vector",
    "Eclipse Status - Note-4",
    "Emission Angle",
    "Sun Angle w.r.t -ve Yaw (Phase angle)",
    "Angle between +Yaw and Nadir",
    "Slant Range (Km)",
    "Orbit No",
    "Solar Zenith Angle",
    "Angle between Payload FoV axis and velocity vector",
    "X (yaw) angle",
    "Y (roll) angle",
    "Z(pitch) angle",
oat df.columns = columns names
oat df.iloc[:,1:9] = oat df.iloc[:,1:9].astype(np.int32)
oat df.iloc[:,9:42] = oat df.iloc[:,9:42].astype(np.float32)
```

```
oat_df.iloc[:,42] = oat_df.iloc[:,42].astype(np.int32)
oat_df.iloc[:,43:] = oat_df.iloc[:,43:].astype(np.float32)
return oat_df
```

Denoising Function: Savitzky-Golay filter

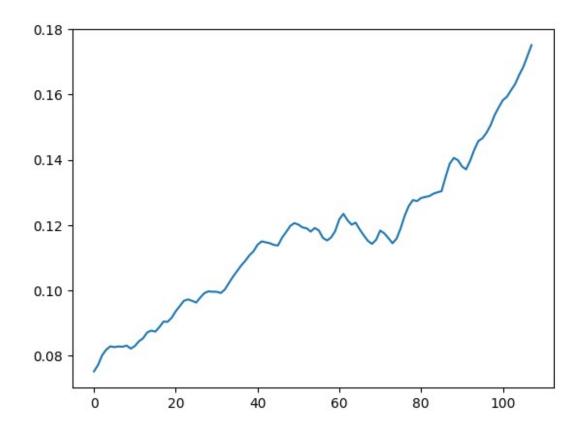
```
def denoise(data, axis, window size = 7, polyorder = 2):
    denoised image = savgol filter(data, window length=window size,
polyorder=polyorder, axis=axis)
    return denoised image
# data path should be root directory of the bundle
data path =
"/kaggle/input/isro-chandrayan-iirs/other/dataset-26/2/ch2 iir nci 201
91217T0003248322 d img d18"
images = utils.get image(data path)
image = images[0]
misc dfs = utils.get misc files(data path)
oat df = misc dfs['.oat']
mean zenith angle = oat df.loc[:,'Solar Zenith Angle'].mean()
reflectance image =
utils.convert to reflectance(image, mean zenith angle)
# reflectance image is the desired output
/kaggle/input/isro-chandrayan-iirs/other/dataset-26/2/
ch2 iir nci 20191217T0003248322 d img d18/miscellaneous/calibrated/
20191217/ch2 iir nci 20191217T0003248322 d img d18.lbr
/kaggle/input/isro-chandrayan-iirs/other/dataset-26/2/ch2 iir nci 2019
1217T0003248322 d img d18/miscellaneous/calibrated/20191217/
ch2 iir nci 20191217T0003248322 d img d18.oat
/kaggle/input/isro-chandrayan-iirs/other/dataset-26/2/ch2 iir nci 2019
1217T0003248322 d img d18/miscellaneous/calibrated/20191217/
ch2 iir nci 20191217T0003248322 d img d18.oath
/kaggle/input/isro-chandrayan-iirs/other/dataset-26/2/ch2 iir nci 2019
1217T0003248322 d img d18/miscellaneous/calibrated/20191217/
ch2 iir nci 20191217T0003248322 d img d18.spm
denoised reflectance image = denoise(reflectance image, 0)
# del denoised reflectance image; gc.collect()
# combined array = np.concatenate((denoised reflectance image[7:62, 7,
7], denoised reflectance image[72:115, 7, 7]))
# plt.plot(combined array)
```

interpolation of OSF region

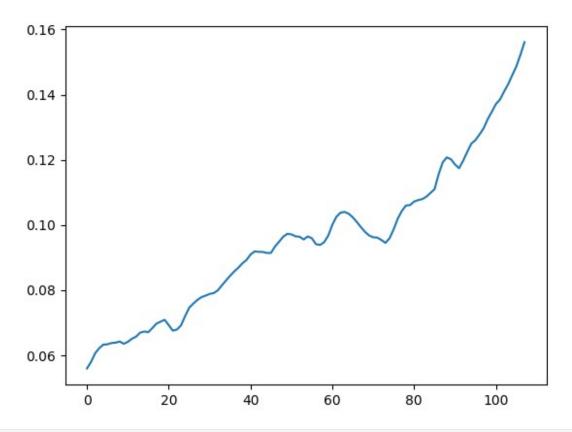
```
combined_array = np.concatenate((denoised_reflectance_image[7:68, 7,
7], denoised_reflectance_image[77:115, 7, 7]))
original_indices = np.concatenate((np.arange(7, 68), np.arange(77,
115)))
interpolated_indices = np.arange(7, 115)
cubic_spline = CubicSpline(original_indices, combined_array)
interpolated_array = cubic_spline(interpolated_indices)
```

add noise

```
def add noise(data, max noise):
    # Add noise to reflectance data
     noise = np.random.normal(0,
0.005, size=reflectance vectors['bir1lm054 Breccia Lunar Feldspathic B
reccia'].shape)
     reflectance noisy =
reflectance vectors['bir1lm054 Breccia Lunar Feldspathic Breccia'] +
noise
    wavelength = range(data.shape[0])
    low_freq_wavelength = np.linspace(0, data.shape[0], 30) # Fewer
    low freq noise = np.random.normal(0, max noise,
size=low freq wavelength.shape)
    # Interpolate the low-frequency noise to match the wavelength data
    interp noise = interpld(low freq wavelength, low freq noise,
kind='linear')
    noise = interp noise(wavelength)
    # Plot the noisy reflectance data
    reflectance noisy = data + noise
    return reflectance noisy
plt.plot(denoised reflectance image[7:115, 1000, 200])
[<matplotlib.lines.Line2D at 0x7fc8de9fa260>]
```



plt.plot(interpolated_array)
[<matplotlib.lines.Line2D at 0x7fc82f8c3850>]



```
# interpolated df =
pd.read csv('/kaggle/input/interpolated-data/bir1lm044 Silicate (Ino)
Pyroxene from lunar basalt.csv')
# interpolated reflectance = interpolated df['Reflectance'].values
import glob
import os
folder_path = '/kaggle/input/interpolated-data'
csv files = glob.glob(os.path.join(folder path, '*.csv'))
reflectance_vectors = {}
reflectance vectors noise 25 = {}
reflectance vectors noise 5 = {}
for file in csv_files:
    filename = os.path.splitext(os.path.basename(file))[0]
    df = pd.read_csv(file)
    reflectance_vectors[filename] = df['Reflectance'].values[1:]
    reflectance vectors noise 25[filename] =
add noise(df['Reflectance'].values[1:], 0.0025)
```

```
reflectance vectors noise 5[filename] =
add noise(df['Reflectance'].values[1:], 0.005)
def spectral angle mapper(pixel vector, reference vector):
    dot product = np.dot(pixel vector, reference vector)
    norm pixel = np.linalg.norm(pixel vector)
    norm reference = np.linalg.norm(reference vector)
    cosine angle = dot product / (norm pixel * norm reference)
    angle = np.arccos(np.clip(cosine angle, -1.0, 1.0))
    return angle
sam = \{\}
sam noise 25 = \{\}
sam noise 5 = \{\}
for key1, key2, key3 in zip(reflectance vectors.keys(),
                            reflectance vectors noise 25.keys(),
                            reflectance vectors noise 5.keys()):
    sam[key1] =
spectral angle mapper(denoised reflectance image[7:115, 1000, 200],
reflectance vectors[key1])
    sam_noise_25[key2] =
spectral angle mapper(denoised reflectance image[7:115, 1000, 200],
reflectance vectors noise 25[key2])
    sam noise 5[key3] =
spectral angle mapper(denoised reflectance image[7:115, 1000, 200],
reflectance vectors noise 5[key3])
sam
{'c2mb29 Igneous Gabbroic A-
881757 Lunar Gabbrocontaining Plag Pyroxene and Ilmenite':
0.26234734824433403,
'bir1lm046_unbrecciated_lunar_meteorite__coarse texture':
0.1825719049585525,
 'c1lm36_Igneous__Lunar_Unbrecciated_Basalt_': 0.26076203401679204,
 'cclm35 Breccia Lunar Feldspathic Breccia': 0.2556124697162266,
 'c10l01 Antarctic Meteorite of Presumed Lunar Origin':
0.24344711263092272.
 'c3mb29 Silicate (Ino) Pyroxene A-
881757 Lunar Gabbrocontaining Plag Pyroxene and Ilmenite':
0.40429636322642726,
 'colm01 Antarctic Meteorite of Presumed Lunar Origin':
0.2634747402331538,
```

```
'c12lm1 Antarctic Meteorite of Presumed Lunar Origin':
0.22633572765966495,
 'c6mb29 Igneous Gabbroic A-
881757 Lunar Gabbrocontaining Plag Pyroxene and Ilmenite':
0.29701360841758273,
 'birllm048 Mare basalt': 0.16115619776886603,
'cama01 Anomalous (ACANOM)__Antarctic_meteorite_of_presumed_lunar_orig
in': 0.20958037191047235,
 'calm34 Breccia Lunar Feldspathic Breccia': 0.28726072447473316,
 'cflm34_Breccia__Lunar_Feldspathic_Breccia': 0.26812261859120573,
 'cpmb29 Igneous Gabbroic A-
881757 Lunar Gabbrocontaining Plag Pyroxene and Ilmenite':
0.0842\overline{8}33216\overline{7}762563,
 'c1lm50b 0.148 g': 0.2198313350685982,
 'cclm34_Breccia__Lunar_Feldspathic_Breccia': 0.20623026487899174,
 'cblm34 Breccia Lunar Feldspathic Breccia': 0.21999016710333455,
 'birllm053 Breccia Lunar Feldspathic Breccia': 0.09406887848015909,
 'celm13 (E) White end.': 0.28331982109888054,
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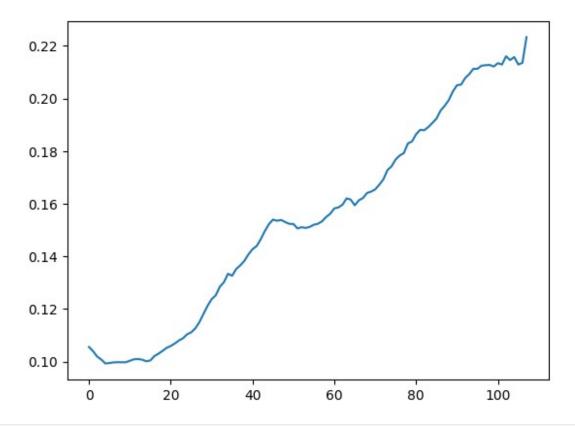
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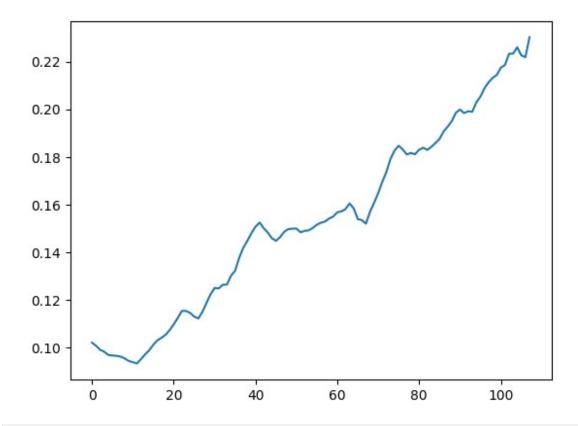
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res = [key for key in sam if sam[key] == temp]
temp25 = min(sam noise 25.values())
res25 = [key for key in sam noise 25 if sam noise 25[key] == temp25]
temp5 = min(sam noise 5.values())
res5 = [key for key in sam_noise_5 if sam_noise_5[key] == temp5]
print(temp, res)
print(temp25, res25)
print(temp5, res5)
0.07368270627196831
['calmc2_Antarctic_Meteorite_of_Presumed_Lunar_Origin']
0.07690445215674684
['calmc2 Antarctic Meteorite of Presumed Lunar Origin']
0.0733094838903100\overline{6}
['calmc2 Antarctic Meteorite of Presumed Lunar Origin']
plt.plot(reflectance vectors_noise_25['calmc2_Antarctic_Meteorite_of_P
resumed Lunar Origin'])
[<matplotlib.lines.Line2D at 0x7fc82f94ee30>]
```

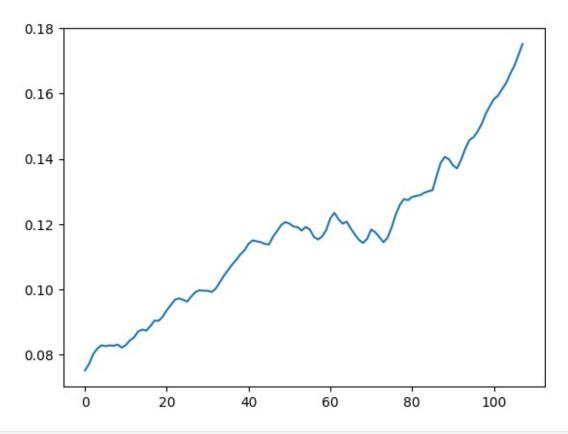


plt.plot(reflectance_vectors_noise_5['calmc2_Antarctic_Meteorite_of_Pr
esumed_Lunar_Origin'])

[<matplotlib.lines.Line2D at 0x7fc82f9a8bb0>]

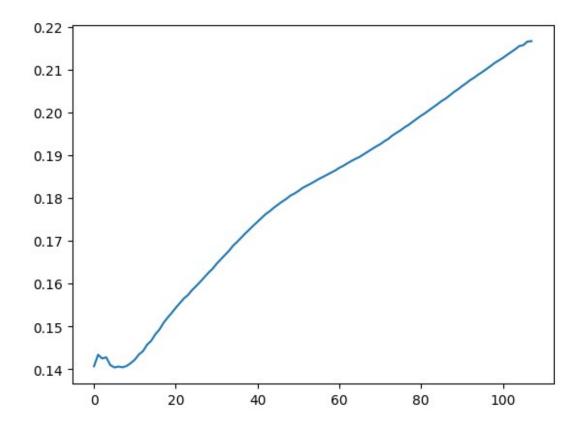


plt.plot(denoised_reflectance_image[7:115, 1000, 200])
[<matplotlib.lines.Line2D at 0x7fc82f6df1f0>]



```
min sam key = min(reflectance vectors.keys(), key=lambda k:
sam[list(reflectance vectors.keys()).index(k)])
min sam key
KevError
                                          Traceback (most recent call
last)
Cell In[28], line 1
----> 1 min sam key = min(reflectance vectors.keys(), key=lambda k:
sam[list(reflectance vectors.keys()).index(k)])
      2 min sam key
Cell In[28], line 1, in <lambda>(k)
----> 1 min sam key = min(reflectance vectors.keys(), key=lambda k:
sam[list(reflectance vectors.keys()).index(k)])
      2 min sam key
KeyError: 0
# Create a list of tuples with (key, sam value)
sam key pairs = list(reflectance vectors.keys())
# Sort the list based on the SAM values
sorted_sam_key_pairs = sorted(sam_key_pairs, key=lambda k:
sam[sam_key_pairs.index(k)])
```

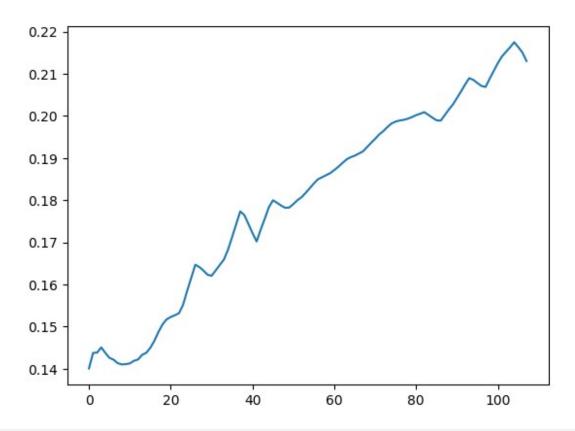
```
# Extract the minimum 5 pairs
min 5 sam key pairs = sorted sam key pairs[:5]
# Get the corresponding SAM values for these keys
min 5 sam values = [sam[sam key pairs.index(k)] for k in
min_5_sam_key pairs]
# Combine them into a list of tuples (key, sam value)
min 5 results = list(zip(min_5_sam_key_pairs, min_5_sam_values))
min 5 results
[('calmc2 Antarctic Meteorite of Presumed Lunar Origin',
0.07368270627196831),
 ('calmca Antarctic Meteorite of Presumed Lunar Origin',
0.07847614707398592),
 ('bir1lm054 Breccia Lunar Feldspathic Breccia', 0.0835425883809933),
 ('calmor Antarctic Meteorite of Presumed Lunar Origin',
0.0841094775032077),
 ('cpmb29 Igneous Gabbroic A-
881757 Lunar Gabbrocontaining Plag Pyroxene and Ilmenite',
 0.08\overline{4}28332\overline{1}67762563)
plt.plot(reflectance vectors['bir1lm054 Breccia Lunar Feldspathic Bre
ccia'l)
[<matplotlib.lines.Line2D at 0x7ca1c2775810>]
```



import numpy as np
import matplotlib.pyplot as plt

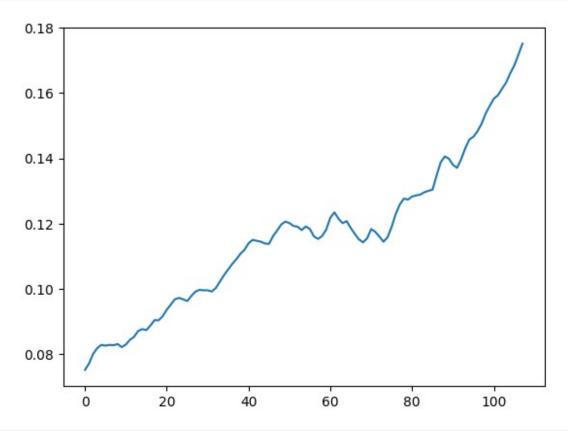
plt.plot(reflectance_noisy)

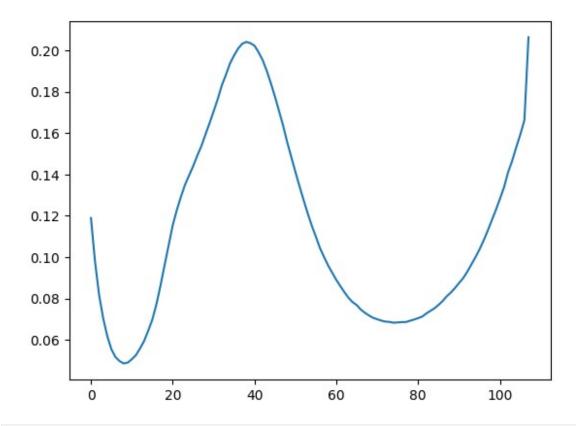
[<matplotlib.lines.Line2D at 0x7ca1c19b1600>]



```
import plotly.graph objs as go
import plotly.offline as pyo
# Create a plotly figure
fig = go.Figure()
# Loop over each key in the dictionary and add a line plot for each
for key, vector in reflectance_vectors.items():
    fig.add_trace(go.Scatter(y=vector, mode='lines', name=key))
# Customize layout
fig.update layout(
    title="Reflectance Vectors",
    xaxis title="Wavelength"
    yaxis title="Reflectance",
    showlegend=True
)
# Show the figure
pyo.plot(fig)
'temp-plot.html'
import matplotlib.pyplot as plt
plt.plot(denoised reflectance image[7:115, 1000, 200])
```

[<matplotlib.lines.Line2D at 0x7ca1c2757c40>]





```
SAM = np.zeros((5, 5, len(reflectance vectors)))
for i in range(10000, 10005):
    for j in range(100, 105):
        for k, v in enumerate(reflectance vectors.values()):
            SAM[i - 10000, j - 100, k] =
spectral angle mapper(reflectance image[7:115, i, j], v)
SAM
array([[[0.31590569, 0.23851635, 0.31192783, ..., 0.25022716,
         0.30881818, 0.26119096],
        [0.31368341, 0.23613191, 0.30972014, \ldots, 0.24766726,
         0.30599722, 0.25830321],
        [0.31094703, 0.23312169, 0.30692437, \ldots, 0.24470094,
         0.30304179, 0.25517423],
        [0.31380457, 0.23615154, 0.3097159 , ..., 0.24797507,
         0.30667356, 0.2588868 ],
        [0.31609226, 0.23866319, 0.31208122, \ldots, 0.25059408,
         0.30908073, 0.26145042]],
       [[0.31564148, 0.2381912 , 0.31171761, ..., 0.24990554,
         0.30863233, 0.26103509],
        [0.31396327, 0.23636349, 0.31002019, ..., 0.24794527,
         0.30634838, 0.25864705],
        [0.31232972, 0.23477165, 0.30844325, ..., 0.24643688,
```

```
0.30507962, 0.25746248],
        [0.31536437, 0.23787968, 0.31139914, \ldots, 0.24968947,
         0.30837015, 0.26073931],
        [0.31719415, 0.23980885, 0.31322303, ..., 0.25141122,
         0.31012204, 0.26252107]],
       [[0.31502401, 0.23762248, 0.31109775, ..., 0.24917595,
         0.30787092, 0.26030071],
        [0.31444325, 0.23690559, 0.31052558, \ldots, 0.24859732,
         0.30701469, 0.25939006],
        [0.31249625, 0.23488729, 0.30867667, ..., 0.24607814,
         0.30452422, 0.25687656],
        [0.3138525 , 0.23636832 , 0.3098477 , ..., 0.2480105 ,
         0.30678987, 0.25913594],
        [0.31668406, 0.23939328, 0.31280075, ..., 0.25075552,
         0.30936261, 0.26186162]],
       [[0.31396467, 0.23663725, 0.31001644, ..., 0.2479332 ,
         0.30678823, 0.25923522],
        [0.31137054, 0.23380745, 0.30747036, \ldots, 0.24484579,
         0.30338265, 0.25571149],
        [0.3117178, 0.2342329, 0.30792912, ..., 0.24540394,
         0.30386595, 0.25634032],
        [0.31231407, 0.23474834, 0.3084842 , ..., 0.24608542,
         0.30453866, 0.25694782],
        [0.31374681, 0.23626264, 0.30987825, ..., 0.24768297,
         0.30630178, 0.2587105211,
       [[0.31286703, 0.23524388, 0.30897695, ..., 0.24659383,
         0.30492894, 0.25720631],
        [0.31442462, 0.23684185, 0.31059918, ..., 0.24810221,
         0.30659295, 0.25895326],
        [0.31630784, 0.23890018, 0.31239511, ..., 0.25014497,
         0.30912223, 0.26156166],
        [0.31591009, 0.23852879, 0.31204985, ..., 0.24957057,
         0.30838635, 0.26082664],
        [0.31611059, 0.23877366, 0.3121361, \ldots, 0.25021343,
         0.3093591 , 0.26178088]]])
max indices = np.argmax(SAM, axis=2)
min indices = np.argmin(SAM, axis=2)
max indices
array([[5, 5, 5, 5, 5],
       [5, 5, 5, 5, 5],
       [5, 5, 5, 5, 5],
       [5, 5, 5, 5, 5],
       [5, 5, 5, 5, 5]
```

```
min indices
array([[72, 72, 72, 72, 72],
       [72, 72, 72, 72, 72],
       [72, 72, 72, 72, 72],
       [72, 72, 72, 72, 72],
       [72, 72, 72, 72, 72]])
plt.plot(reflectance image[7:115, 0, 0])
plt.plot(reflectance vectors[list(reflectance vectors.keys())[72]])
list(reflectance vectors.keys())[5]
plt.plot(reflectance vectors[list(reflectance vectors.keys())[5]])
min sam = np.min(SAM, axis=2)
min_sam
min value = np.min(SAM)
min coords = np.unravel index(np.argmin(SAM), SAM.shape)
min value
min coords
plt.plot(reflectance image[7:115, 153, 248])
plt.plot(reflectance vectors[list(reflectance vectors.keys())[76]])
import torch
# Convert the reflectance image and reflectance vectors to PyTorch
reflectance image tensor =
torch.tensor(reflectance image[7:115, :, :],
dtype=torch.float32).cuda()
reflectance vectors tensor = torch.tensor([v for v in
reflectance vectors.values()], dtype=torch.float32).cuda()
# Initialize a 3D tensor for SAM with the same spatial dimensions as
the reflectance image
SAM = torch.zeros((reflectance image.shape[1],
reflectance image.shape[2], len(reflectance vectors))).cuda()
# Define the spectral angle mapper function for GPU usage
def spectral angle mapper gpu(pixel vector, ref vector):
    dot product = torch.dot(pixel_vector, ref_vector)
    norm pixel = torch.norm(pixel vector)
    norm ref = torch.norm(ref vector)
    angle = torch.acos(dot product / (norm pixel * norm ref))
```

```
return angle
# Calculate the SAM value for each pixel and store it in the SAM
for i in range(reflectance image.shape[1]):
    for j in range(reflectance image.shape[2]):
        pixel_vector = reflectance_image_tensor[:, i, j] # Get the
spectral vector for pixel (i, j)
        for k, ref vector in enumerate(reflectance vectors tensor):
            SAM[i, j, k] = spectral_angle_mapper_gpu(pixel_vector,
ref vector)
    if i % 1000 == 0:
        print(f'Processing row {i}/{reflectance image.shape[1]}')
# If needed, move the SAM tensor back to CPU and convert it to a NumPy
array
SAM cpu = SAM.cpu().numpy()
SAM. shape
SAM
min sam key = min(reflectance vectors.keys(), key=lambda k:
SAM[list(reflectance vectors.keys()).index(k)])
min sam key
# SAM = spectral angle mapper(reflectance image[7:115, 0, 0],
interpolated reflectance)
# SAM
```

CPRSM

```
import numpy as np

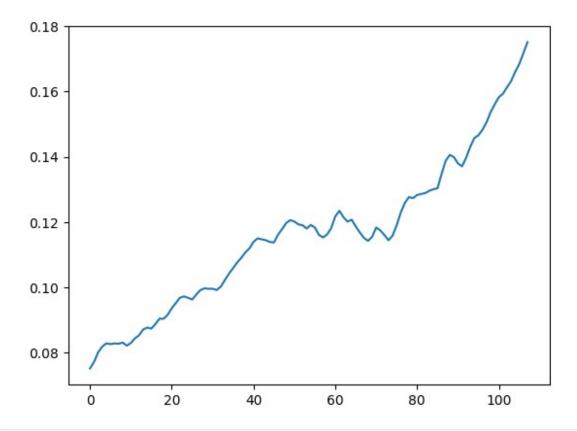
def CPRMS(pixel_vector, reference_vector):
    mean_pixel = np.mean(pixel_vector)
    mean_reference = np.mean(reference_vector)

    centered_pixel = pixel_vector - mean_pixel
    centered_reference = reference_vector - mean_reference

    squared_diff = (centered_pixel - centered_reference) ** 2

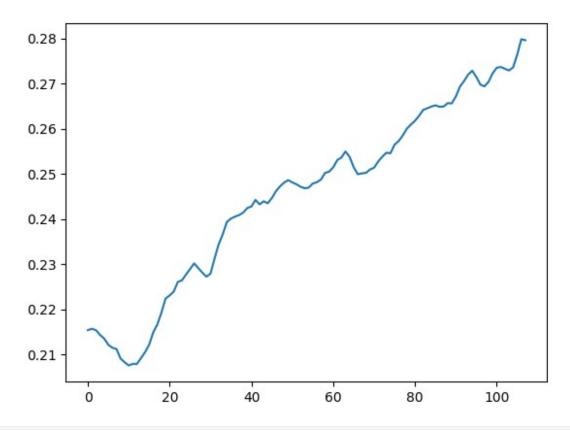
    val = np.sqrt(np.mean(squared_diff))
    return val
```

```
cprms values = {}
cprms noise 25 = \{\}
cprms noise 5 = \{\}
for key1, key2, key3 in zip(reflectance vectors.keys(),
                            reflectance vectors noise 25.keys(),
                            reflectance_vectors_noise_5.keys()):
    ref vec = denoised reflectance image[7:115, 1000, 200]
    cprms values[key1] = CPRMS(ref vec, reflectance vectors[key1])
    cprms noise 25[key2] = CPRMS(ref vec,
reflectance vectors noise 25[key2])
    cprms noise 5[key3] = CPRMS(ref vec,
reflectance vectors noise 5[key3])
temp = min(cprms values.values())
res = [key for key in cprms values if cprms values[key] == temp]
temp25 = min(cprms noise 25.values())
res25 = [key for key in cprms noise 25 if cprms noise 25[key] ==
temp25]
temp5 = min(cprms noise 5.values())
res5 = [key for key in cprms noise 5 if cprms noise 5[key] == temp5]
print(temp, res)
print(temp25, res25)
print(temp5, res5)
0.006582425490993638
['cllm52c Breccia Lunar Feldspathic Regolith Breccia 0.97 g']
0.006965808944762407
['c1lm52c Breccia Lunar Feldspathic Regolith Breccia 0.97 g']
0.008180757674315827
['cllm52c Breccia Lunar Feldspathic Regolith Breccia 0.97 g']
plt.plot(ref vec)
[<matplotlib.lines.Line2D at 0x7fc82f1bb2b0>]
```



plt.plot(reflectance_vectors_noise_25['c1lm52c_Breccia__Lunar_Feldspat hic_Regolith_Breccia__0.97_g'])

[<matplotlib.lines.Line2D at 0x7fc82ee14e20>]



Torch Dataset

```
import os
import numpy as np
import torchdata.datapipes as dp
from torch.utils.data import DataLoader
```

```
class SlidingWindowDataPipe(dp.iter.IterDataPipe):
    def __init__(self, image_paths, window size, step size):
        super(). init ()
        self.image paths = image paths
        self.window size = window size
        self.step_size = step_size
    def iter (self):
        for image path in self.image paths:
            shapes =
SlidingWindowDataPipe.get image meta data(image path)
            for shape in shapes:
                _,img_height, img_width = shape
# Sliding window
                for i in range(0, img height - self.window size + 1,
self.step size):
                    if i + self.window size > img height:
                        continue
                    patch =
SlidingWindowDataPipe.get partial image from height(image path,i,self.
window size)
                    yield patch
    @staticmethod
    def read partial data of given height(qub path,image height,
image width, row = 0, height = 250):
        image = []
        data count = image width * height
        channel size = image height * image width
        with open(qub path, 'rb') as f:
            for channel idx in range(256):
                offset = channel_idx * channel size * 4 + row *
image width # float32 has 4 bytes
                f.seek(offset)
                channel data = np.fromfile(f, dtype=np.float32,
count=data count)
                image.append(channel data.reshape((1,height,
image width)))
        return np.vstack(image)
    @staticmethod
    def get partial image from height(base path, row, height):
        xml files = utils.find xml files(base path)
        image files = utils.find_qub_files(base_path)
        shapes = [utils.extract sequence numbers(xml file) for
xml file in xml files]
        images =
[utils._read_partial_data_of_given_height(qub_path,shape[1], shape[2],
row, height) for qub path, shape in zip(image files, shapes)]
        return images
```

```
@staticmethod
  def get_image_meta_data(base_path):
        xml_files = utils.find_xml_files(base_path)
        shapes = [utils.extract_sequence_numbers(xml_file) for
xml_file in xml_files]
        return shapes

data_paths = [
    "ENTER_LIST_OF_PATHS",
]

datapipe = SlidingWindowDataPipe(
    image_paths=data_paths,
        window_size=250,
        step_size=250
)
dataloader = DataLoader(datapipe, batch_size=12, shuffle=True)
dataloader_iter = iter(dataloader)
```

Example Usage of dataset

```
dataloader_iter.__next__()
```

ABS

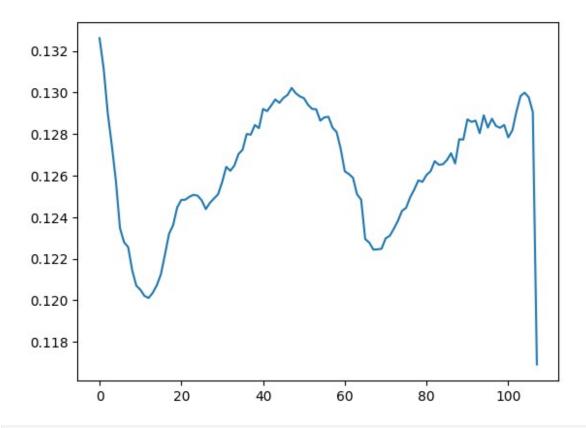
```
def calculate abs(f n, r n):
    return np.sum(np.abs(f n - r n))
abs values = {}
abs noise 25 = \{\}
abs noise 5 = \{\}
for key1, key2, key3 in zip(reflectance vectors.keys(),
                             reflectance vectors noise 25.keys(),
                             reflectance vectors noise 5.keys()):
    ref vec = denoised reflectance image[7:115, 1000, 200]
    abs_values[key1] = calculate_abs(ref_vec,
reflectance vectors[kev1])
    abs noise 25[key2] = calculate abs(ref vec,
reflectance_vectors_noise_25[key2])
    abs noise 5[key3] = calculate abs(ref vec,
reflectance vectors noise 5[key3])
abs values
```

```
{'c2mb29 Igneous Gabbroic A-
881757 Lunar Gabbrocontaining Plag Pyroxene and Ilmenite':
3.0309330292966967,
 'birllm046 unbrecciated lunar meteorite coarse texture':
12.492682048995588.
 'c1lm36_Igneous__Lunar_Unbrecciated_Basalt_': 3.6990471664203888,
 'cclm35 Breccia Lunar Feldspathic Breccia': 2.726251986159569.
 'c10l01 Antarctic Meteorite of Presumed Lunar Origin':
8.174762611219567,
 'c3mb29 Silicate (Ino) Pyroxene A-
881757 Lunar Gabbrocontaining Plag Pyroxene and Ilmenite':
4.587674998395645,
 'colm01 Antarctic Meteorite of Presumed Lunar Origin':
8.405454563394146,
 'c12lm1 Antarctic Meteorite of Presumed Lunar Origin':
3.8087252690275637,
 'c6mb29 Igneous Gabbroic A-
881757_Lunar_Gabbrocontaining_Plag__Pyroxene_and_Ilmenite':
3.5941383237977513,
'bir1lm048 Mare basalt': 8.061934945022614,
'cama01 Anomalous (ACANOM)__Antarctic_meteorite_of_presumed_lunar_orig
in': 2.998137063170352,
 'calm34 Breccia Lunar Feldspathic Breccia': 31.95410963954807,
 'cflm34_Breccia__Lunar_Feldspathic_Breccia': 18.137495132223997,
 'cpmb29 Igneous Gabbroic A-
881757 Lunar Gabbrocontaining Plag Pyroxene and Ilmenite':
3.986389991094251,
 'c1lm50b 0.148 g': 17.575408278183684,
 'cclm34_Breccia_Lunar_Feldspathic_Breccia': 2.1815875116385026,
 'cblm34 Breccia Lunar Feldspathic Breccia': 2.897205682939041,
 'birllm053 Breccia Lunar Feldspathic Breccia': 4.518390249579475,
 'celm13 (E) White end.': 26.184883510858967,
 'bir1lm044 Silicate (Ino) Pyroxene from lunar basalt':
16.34594287447547,
 'cllm52b Breccia Lunar Feldspathic Regolith Breccia 0.97 g':
2.167923484028919,
 'c1lm42 Silicate (Tecto) Feldspar Plagioclase from lunar basalt':
43.70341453668339,
 'cllm51 Lunar meteorite feldspathic fragmental breccia':
9.664285571896851,
 's12lm1 Antarctic Meteorite of Presumed_Lunar_Origin':
3.8337587275096374,
 'c1lm52c Breccia Lunar Feldspathic Regolith Breccia 0.97 g':
13.919895536996412.
 cclm13_Top_whitish.': 12.552244594445531,
 'cblm35 Breccia Lunar Feldspathic Breccia': 3.2627331822973185,
 'c1lm50c 0.148_g': 35.33550602630124,
 'sblm02 Antarctic Meteorite of Presumed Lunar Origin':
2.436514356599916,
```

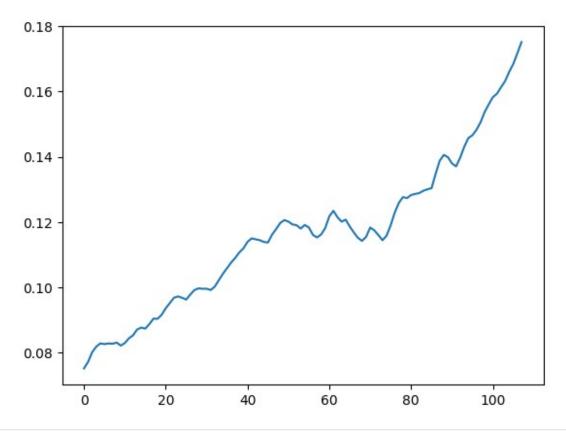
```
'c2lm06 Antarctic Meteorite of Presumed Lunar Origin':
2.9259272937509353,
 's2lm06 Antarctic Meteorite of Presumed Lunar Origin':
2.890376715720617.
 'bir1lm047 Mare basalt': 3.9610863632306046,
 'sslm01 Antarctic Meteorite of Presumed Lunar Origin':
8.237970697762178,
 cllm50_0.148_g': 22.41122467039846,
 'c1lm51c Lunar meteorite feldspathic fragmental breccia':
43.61221132308978,
 'birllm054 Breccia Lunar Feldspathic Breccia': 6.915736203272035,
 's10lm1 Antarctic Meteorite of Presumed_Lunar_Origin':
9.417175214001064,
 'c8mb29 Silicate (Ino) Pyroxene A-
881757 Lunar Gabbrocontaining Plag Pyroxene and Ilmenite':
4.237128171488529,
 'c9mb29 Igneous Gabbroic A-
881757_Lunar_Gabbrocontaining_Plag__Pyroxene_and_Ilmenite':
12.573381786384088,
 'cllm52 Breccia Lunar Feldspathic Regolith Breccia 0.97 g':
2.272715187502431,
 'cdlm34 Breccia Lunar Feldspathic Breccia': 26.979724515424618.
 'crlm01 Antarctic Meteorite of Presumed Lunar Origin':
6.006470341901541,
 'cnmb29 Igneous Gabbroic A-
881757 Lunar Gabbrocontaining Plag Pyroxene and Ilmenite':
26.09015217236132,
 'cnlm01 Antarctic Meteorite of Presumed Lunar Origin':
2.36574484374201,
 'cblm02 Antarctic Meteorite of Presumed Lunar Origin':
2.432665715708545,
 'rcalm03 Ground portion of LM-LAM-002': 25.506231251966177,
 'calm02 Antarctic Meteorite of Presumed Lunar Origin':
2.2576679480551376,
 'calm01 Antarctic Meteorite of Presumed Lunar Origin':
1.9781938407608117,
 'calm35 Breccia Lunar Feldspathic Breccia': 10.001322180505204,
 'cllm34 Breccia Lunar Feldspathic Breccia': 10.93539685225542,
 'interpolated data': 3.16713986636\overline{8069},
 'cblm03 Ground portion of LM-LAM-002': 25.247666391521232,
 'c10lm1 Antarctic Meteorite of Presumed Lunar Origin':
9.454390356871226,
 'c1lm51b Lunar meteorite feldspathic fragmental breccia':
14.979831804113843,
 'chlm01 Antarctic Meteorite of Presumed Lunar Origin':
3.7540763961692414,
 's10m01 Antarctic Meteorite of Presumed Lunar Origin':
8.78406592689958,
 'bir1lm045 unbrecciated lunar meteorite coarse texture':
4.477612280084221,
```

```
'calm03 Ground portion of LM-LAM-002': 25.513748723545742,
 'srlm01 Antarctic Meteorite of Presumed Lunar Origin':
6.010284992188235,
 'cdlm35 Breccia Lunar Feldspathic Breccia': 24.8019392758351,
'camt313 Igneous Olivine Gabbro Purchased from catchafallingstar.com
': 16.150427359526468,
 'c7mb29 Silicate (Ino) Pyroxene A-
881757 Lunar Gabbrocontaining Plag Pyroxene and Ilmenite':
4.352561237609393,
 'c2lm41 Silicate (Ino) Pyroxene from lunar basalt':
26.298611737891097.
 'celm34 Breccia Lunar Feldspathic Breccia': 3.9615279908671144,
 'c10m01 Antarctic Meteorite of Presumed Lunar Origin':
8.814675242147624,
 'c2lm42 Silicate (Tecto) Feldspar Plagioclase from lunar basalt':
43.8512628781821.
 'calmor Antarctic Meteorite of Presumed Lunar Origin':
2.6477119300012015,
 cblm13 Mostly black side opposite of (A).': 4.038708973972942,
 'calmn1 Antarctic Meteorite of Presumed Lunar Origin':
4.47659915176231,
 'c1lm41_Silicate_(Ino)__Pyroxene__from_lunar_basalt':
25.19390811498709,
 cllm39_Igneous__Lunar_Unbrecciated_Basalt_': 5.013335472498116,
 'comb29 Igneous Gabbroic A-
881757 Lunar Gabbrocontaining Plag Pyroxene and Ilmenite':
26.83789952406646,
 'calmc2 Antarctic Meteorite of Presumed Lunar Origin':
4.013957831560372,
 'c4mb29 Igneous Gabbroic A-
881757 Lunar Gabbrocontaining Plag Pyroxene and Ilmenite':
6.1507077908507,
 'cslm01 Antarctic Meteorite of Presumed Lunar Origin':
8.251951933707305,
 celm35 Breccia Lunar Feldspathic Breccia': 3.3125295432107156,
 'sblm03_Ground_portion_of_LM-LAM-002': 25.22508270145452,
 'cdlm13_(D)_Bottom_black_flat_with_brown_spot.': 8.68905329555699,
 'cllm38_Breccia__Lunar_Basaltic_Breccia': 3.1671398663680694,
 'cflm35 Breccia Lunar Feldspathic Breccia': 2.828681050865722,
 'solm01 Antarctic Meteorite of Presumed Lunar Origin':
8.406352338620511.
 'calmn2 Antarctic Meteorite of Presumed Lunar Origin':
10.378957266332014,
 'calmca Antarctic Meteorite of Presumed Lunar Origin':
3.3284909270600296,
 'c1lm37 Breccia Lunar Basaltic Breccia': 2.7602745149868575,
 'shlm01 Antarctic Meteorite of Presumed Lunar Origin':
3.7537877730500524,
 'cqmb29 Igneous Gabbroic A-
```

```
881757 Lunar Gabbrocontaining Plag Pyroxene and Ilmenite':
33.100889599777425}
temp = min(abs values.values())
res = [key for key in abs values if abs values[key] == temp]
temp25 = min(abs noise 25.values())
res25 = [key for key in abs noise 25 if abs noise 25[key] == temp25]
temp5 = min(abs noise 5.values())
res5 = [key for key in abs_noise_5 if abs_noise_5[key] == temp5]
print(temp, res)
print(temp25, res25)
print(temp5, res5)
                                          Traceback (most recent call
NameError
last)
Cell In[37], line 1
----> 1 prinarrowt(temp, res)
      2 print(temp25, res25)
     3 print(temp5, res5)
NameError: name 'prinarrowt' is not defined
plt.plot(reflectance vectors['c1lm52b Breccia Lunar Feldspathic Regol
ith Breccia 0.97 g'])
[<matplotlib.lines.Line2D at 0x7fc82ecbd960>]
```



plt.plot(ref_vec)
[<matplotlib.lines.Line2D at 0x7fc82f8e62c0>]



```
diff = {}
for key in abs_noise_25.keys():
    diff[key] = abs_noise_25[key] + cprms_noise_25[key] * 100

temp25 = min(diff.values())
res25 = [key for key in diff if diff[key] == temp25]
res25
['calmcr_Antarctic_Meteorite_of_Presumed_Lunar_Origin']
plt.plot(reflectance_vectors_noise_25['calmcr_Antarctic_Meteorite_of_Presumed_Lunar_Origin'])
[<matplotlib.lines.Line2D at 0x7fc82ed7b4f0>]
```

