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import cv2
import numpy as np
import os
import matplotlib.pyplot as plt
import tifffile as tiff
from pathlib import Path
import os
import scipy.io
import numpy as np

from google.colab import drive
drive.mount('/content/drive')
import os
import shutil
import scipy.io as sio

# Define directories
original_dir = '/content/drive/My Drive/Croppedimages'
new_dir = '/content/drive/My Drive/Croppedimageswithrgb'

# Create new directory
os.makedirs(new_dir, exist_ok=True)

def save_channel_as_mat(channel_data, save_path):
    sio.savemat(save_path, {'croppedImg': channel_data})

# Iterate over the original directory
for folder in os.listdir(original_dir):
    folder_path = os.path.join(original_dir, folder)
    new_folder_path = os.path.join(new_dir, folder)
    os.makedirs(new_folder_path, exist_ok=True)

    for subfolder in os.listdir(folder_path):
        subfolder_path = os.path.join(folder_path, subfolder)
        new_subfolder_path = os.path.join(new_folder_path, subfolder)
        os.makedirs(new_subfolder_path, exist_ok=True)

        for file in os.listdir(subfolder_path):
            file_path = os.path.join(subfolder_path, file)
            new_file_path = os.path.join(new_subfolder_path, file)

            if 'RGB_cropped.mat' in file:
                mat_contents = sio.loadmat(file_path)
                rgb_image = mat_contents['croppedImg']

                # Extract R, G, B channels
                R_channel = rgb_image[:, :, 0]
                G_channel = rgb_image[:, :, 1]
                B_channel = rgb_image[:, :, 2]

                # Save R, G, B channels as separate .mat files
                save_channel_as_mat(R_channel, new_file_path.replace('RGB_cropped.mat', 'R_cropped.mat'))
                save_channel_as_mat(G_channel, new_file_path.replace('RGB_cropped.mat', 'G_cropped.mat'))
                save_channel_as_mat(B_channel, new_file_path.replace('RGB_cropped.mat', 'B_cropped.mat'))

            else:
                # Copy other files as they are
                shutil.copy(file_path, new_file_path)

print("Processing completed and files copied to the new directory.")

def create_subblocks(image, block_size=100, num_subblocks=10, overlap_ratio=0.9):
    h, w = image.shape
    step_size = int(block_size * (1 - overlap_ratio))
    subblocks = []

    # Start from the center
    center_x, center_y = h // 2, w // 2

    for i in range(-int(np.sqrt(num_subblocks))//2, int(np.sqrt(num_subblocks))//2 + 1):
        for j in range(-int(np.sqrt(num_subblocks))//2, int(np.sqrt(num_subblocks))//2 + 1):
            start_x = center_x + i * step_size - block_size // 2
            start_y = center_y + j * step_size - block_size // 2
            if start_x >= 0 and start_x + block_size <= h and start_y >= 0 and start_y + block_size <= w:
                subblock = image[start_x:start_x + block_size, start_y:start_y + block_size]
                subblocks.append(subblock)
            if len(subblocks) >= num_subblocks:
                return subblocks

    return subblocks

def process_directory(input_directory, output_directory):
    if not os.path.exists(output_directory):
        os.makedirs(output_directory)

    for folder in sorted(os.listdir(input_directory)):
        folder_path = os.path.join(input_directory, folder)
        if os.path.isdir(folder_path):
            output_folder_path = os.path.join(output_directory, folder)
            if not os.path.exists(output_folder_path):
                os.makedirs(output_folder_path)

            for subfolder in sorted(os.listdir(folder_path)):
                subfolder_path = os.path.join(folder_path, subfolder)

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        if os.path.isdir(subfolder_path):
            output_subfolder_path = os.path.join(output_folder_path, subfolder)
            if not os.path.exists(output_subfolder_path):
                os.makedirs(output_subfolder_path)

            for mat_file in sorted(os.listdir(subfolder_path)):
                if mat_file.endswith('.mat'):
                    mat_file_path = os.path.join(subfolder_path, mat_file)
                    mat_contents = scipy.io.loadmat(mat_file_path)
                    if 'croppedImg' in mat_contents:
                        image_data = mat_contents['croppedImg']
                        if image_data.ndim == 3:
                            image_data = np.mean(image_data, axis=2)
                            subblocks = create_subblocks(image_data)

                    band_folder = os.path.join(output_subfolder_path, os.path.splitext(mat_file)[0])
                    if not os.path.exists(band_folder):
                        os.makedirs(band_folder)

                    for i, subblock in enumerate(subblocks):
                        subblock_filename = f"{os.path.splitext(mat_file)[0]}_subblock_{i+1}.mat"
                        subblock_path = os.path.join(band_folder, subblock_filename)
                        scipy.io.savemat(subblock_path, {'subblock': subblock})
                        print(f"Saved subblock: {subblock_path}")

input_directory = "/content/drive/My Drive/Croppedimageswithrgb"
output_directory = "/content/drive/My Drive/Subblocks10"
process_directory(input_directory, output_directory)
import numpy as np
import os
import scipy.io

def create_column_vector(subblocks, total_size=10000):
    vectors = []
    for subblock in subblocks:
        if subblock is not None:
            vectors.append(subblock.flatten())
        else:
            vectors.append(np.zeros(total_size))
    combined_vector = np.concatenate(vectors)
    return combined_vector

def process_directory_in_chunks(input_directory, chunk_size=10):
    subfolders = sorted(os.listdir(input_directory))
    num_subfolders = len(subfolders)
    gram_matrix_chunks = []

    for chunk_start in range(0, num_subfolders, chunk_size):
        chunk_end = min(chunk_start + chunk_size, num_subfolders)
        gram_matrix_chunk = []

        for folder in subfolders[chunk_start:chunk_end]:
            folder_path = os.path.join(input_directory, folder)
            samples = sorted(os.listdir(folder_path))

            for sample in samples:
                sample_path = os.path.join(folder_path, sample)
                bands = sorted(os.listdir(sample_path))
                subblocks_dict = {band: [] for band in bands}

                for band in bands:
                    band_path = os.path.join(sample_path, band)
                    subblock_files = sorted([os.path.join(band_path, f) for f in os.listdir(band_path) if f.endswith('.mat')])

                    for subblock_file in subblock_files:
                        try:
                            mat_contents = scipy.io.loadmat(subblock_file)
                            subblock_data = mat_contents.get('subblock', None)
                            if subblock_data is not None:
                                subblocks_dict[band].append(subblock_data)
                            else:
                                subblocks_dict[band].append(None)
                        except Exception as e:
                            subblocks_dict[band].append(None)
                            print(f"Error loading {subblock_file}: {e}")

                for subblock_idx in range(10):
                    subblocks = [subblocks_dict[band][subblock_idx] if len(subblocks_dict[band]) > subblock_idx else None for band in bands]

                    # If a whole band is missing, replace it with zeros
                    for i, subblock in enumerate(subblocks):
                        if subblock is None:
                            subblocks[i] = np.zeros((100, 100))

                column_vector = create_column_vector(subblocks)
                if column_vector.size == 70000: # Ensure the column vector is the correct size
                    gram_matrix_chunk.append(column_vector)

    if gram_matrix_chunk: # Ensure chunk is not empty before converting to array
        gram_matrix_chunk = np.array(gram_matrix_chunk).T
        chunk_file = f'gram_matrix_chunk_{chunk_start}_{chunk_end}.npy'
        np.save(chunk_file, gram_matrix_chunk)
        gram_matrix_chunks.append(chunk_file)
        print(f"Saved chunk: {chunk_file}")

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    return gram_matrix_chunks

def merge_chunks(chunk_files, output_file):
    gram_matrix = []
    for chunk_file in chunk_files:
        chunk = np.load(chunk_file)
        gram_matrix.append(chunk)
    gram_matrix = np.concatenate(gram_matrix, axis=1)
    np.save(output_file, gram_matrix)
    print(f'Final gram matrix saved to {output_file}')

def make_gram_matrix_downloadable(output_file):
    import shutil
    from google.colab import files

    shutil.move(output_file, "/content/gram_matrix.npy")
    files.download("/content/gram_matrix.npy")

# Define input and output paths
input_directory = "/content/drive/My Drive/Subblocks10"
output_file = "gram_matrix.npy"

# Process directory in chunks
chunk_files = process_directory_in_chunks(input_directory)

# Merge all chunks into a final gram matrix
merge_chunks(chunk_files, output_file)

# Make the final gram matrix downloadable
make_gram_matrix_downloadable(output_file)

import numpy as np
import pandas as pd

# Load the numpy file from Google Drive
npy_file_path = "/content/drive/My Drive/gram_matrix.npy"
gram_matrix = np.load(npy_file_path)

# Convert the numpy array to a DataFrame
df = pd.DataFrame(gram_matrix)

# Save the DataFrame to a CSV file
csv_file_path = "/content/gram_matrix.csv"
df.to_csv(csv_file_path, index=False)

# Create a download link for the CSV file
from google.colab import files
files.download(csv_file_path)

import numpy as np

# Load the Gram matrix from the .npy file
file_path = '/content/drive/My Drive/gram_matrix.npy'
M = np.load(file_path)

# Check the shape of the loaded matrix to confirm
print("Shape of Gram matrix:", M.shape)

# Step 1: Calculate  $I = M^T M$ 
M_T = M.T
I = np.dot(M_T, M)

# Step 2: Compute the Covariance Matrix of I
I_centered = I - np.mean(I, axis=0)
cov_I = np.cov(I_centered, rowvar=False)

# Step 3: Compute the Pseudoinverse of I
I_pinv = np.linalg.pinv(I)

# Step 4: Calculate the Eigenvectors and Eigenvalues of  $I_{pinv} * cov_I$ 
eigvals, eigvecs = np.linalg.eig(np.dot(I_pinv, cov_I))

# Sorting eigenvalues and eigenvectors
sorted_indices = np.argsort(eigvals)[::-1]
eigvals = eigvals[sorted_indices]
eigvecs = eigvecs[:, sorted_indices]

# Print the results
print("Eigenvalues:")
print(eigvals)
print("\nEigenvectors:")
print(eigvecs)

# Save the results
np.save('eigvals.npy', eigvals)
np.save('eigvecs.npy', eigvecs)

# Plot the Cumulative Normalized Eigenvalues
def plot_cumulative_normalized_eigenvalues(eigenvalues, threshold=0.80):
    sorted_eigenvalues = np.sort(np.abs(eigenvalues))[::-1] # Sort in descending order
    cumulative_sum = np.cumsum(sorted_eigenvalues)
    total_sum = cumulative_sum[-1]
    normalized_cumulative_sum = cumulative_sum / total_sum

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plt.figure(figsize=(10, 6))
plt.plot(normalized_cumulative_sum, marker='o')
plt.title('Cumulative Normalized Eigenvalues')
plt.xlabel('Number of Eigenvalues')
plt.ylabel('Cumulative Normalized Sum')
plt.grid(True)
plt.show()

num_eigenvalues = np.searchsorted(normalized_cumulative_sum, threshold) + 1
return num_eigenvalues

num_eigenvalues_for_80 = plot_cumulative_normalized_eigenvalues(eigvals, threshold=0.80)
print(f'Number of eigenvalues needed to reach 80% variance: {num_eigenvalues_for_80}')
# Select Eigenvectors Corresponding to Top Eigenvalues
top_eigenvectors = eigvecs[:, :num_eigenvalues_for_80]
# Step 5: Compute New Basis Vectors
V = np.dot(gram_matrix, top_eigenvectors)

# Step 6: Construct the Dimensionally Reduced Data
def construct_reduced_data(V, gram_matrix):
    V_T = V.T
    reduced_data = np.dot(V_T, gram_matrix)
    return reduced_data

reduced_data = construct_reduced_data(V, gram_matrix)

# Save the reduced data and make it downloadable
np.save('/content/reduced_data.npy', reduced_data)
# Create a link to download the reduced data
from google.colab import files
files.download('/content/reduced_data.npy')

print('Shape of reduced data:', reduced_data.shape)
import numpy as np
from sklearn.preprocessing import MinMaxScaler
from google.colab import files

# Load the reduced data from the drive
reduced_data_path = '/content/drive/My Drive/reduced_data.npy'
reduced_data = np.load(reduced_data_path)

# Normalize the reduced data
scaler = MinMaxScaler()
normalized_reduced_data = scaler.fit_transform(reduced_data)

# Check the shape and range of the normalized data
print("Normalized reduced data shape:", normalized_reduced_data.shape)
print("Min value:", normalized_reduced_data.min())
print("Max value:", normalized_reduced_data.max())

# Save the normalized reduced data to a CSV file
normalized_reduced_data_path = 'normalized_reduced_data.csv'
np.savetxt(normalized_reduced_data_path, normalized_reduced_data, delimiter=',')

# Automatically download the file
files.download(normalized_reduced_data_path)

# Save the normalized reduced data to a Numpy file
normalized_reduced_data_npy_path = 'normalized_reduced_data.npy'
np.save(normalized_reduced_data_npy_path, normalized_reduced_data)

# Automatically download the Numpy file
files.download(normalized_reduced_data_npy_path)

import pandas as pd
import numpy as np

# Load the target soil data from the Excel file
file_path = '/content/drive/My Drive/Targetsoil.xlsx'
df = pd.read_excel(file_path)

# Extract the proportions of sand, silt, and clay
proportions = df[['Sand_N', 'Silt_N', 'Clay_N']].values

# Initialize the target matrix with zeros
num_proportions = proportions.shape[0]
num_subblocks_per_sample = 10
num_samples_per_proportion = 3
total_columns_ideal = num_proportions * num_samples_per_proportion * num_subblocks_per_sample

# Adjust the number of columns to match the actual data
total_columns_actual = 1840
if total_columns_actual < total_columns_ideal:
    missing_columns = total_columns_ideal - total_columns_actual
    print(f"Missing columns: {missing_columns}")
else:
    missing_columns = 0

# Initialize the target matrix with zeros
target_matrix = np.zeros((3, total_columns_actual))

# Fill the target matrix with the proportion values

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column_index = 0
for i in range(num_proportions):
    for _ in range(num_samples_per_proportion):
        for _ in range(num_subblocks_per_sample):
            if column_index < total_columns_actual:
                target_matrix[:, column_index] = proportions[i]
                column_index += 1

# Save the target matrix to a CSV file
target_matrix_file_path = '/content/drive/My Drive/target_matrix.csv'
np.savetxt(target_matrix_file_path, target_matrix, delimiter=',')

# Make the target matrix downloadable
from google.colab import files
files.download(target_matrix_file_path)

print(f"Target matrix saved to {target_matrix_file_path}")
print("Download initiated.")

# Check the size of the target matrix
print("Target matrix shape:", target_matrix.shape)

import pandas as pd
import numpy as np

# Load the target matrix from CSV
target_file_path = '/content/drive/My Drive/target_matrix.csv' # Correct file name
target_df = pd.read_csv(target_file_path, header=None)

# Convert to numpy array and transpose to match the expected shape (3, 1840)
target_matrix = target_df.to_numpy()

# Check the shape of the target matrix
print('Shape of target matrix:', target_matrix.shape)

# Ensure the target matrix is of shape (3, 1840)
if target_matrix.shape[0] != 3:
    target_matrix = target_matrix.T

print('Updated shape of target matrix:', target_matrix.shape)

import numpy as np
import pandas as pd
from sklearn.gaussian_process import GaussianProcessRegressor
from sklearn.gaussian_process.kernels import RBF, ConstantKernel as C
from sklearn.model_selection import train_test_split
from sklearn.metrics import mean_squared_error
import matplotlib.pyplot as plt

# Load the normalized reduced data
normalized_reduced_data_path = '/content/drive/My Drive/normalized_reduced_data.csv'
normalized_reduced_data = pd.read_csv(normalized_reduced_data_path, header=None).to_numpy()

# Load the target matrix
target_file_path = '/content/drive/My Drive/target_matrix.csv'
target_df = pd.read_csv(target_file_path, header=None)
target_matrix = target_df.to_numpy()

# Ensure the target matrix is of shape (3, 1840)
if target_matrix.shape[0] != 3:
    target_matrix = target_matrix.T

print('Shape of normalized reduced data:', normalized_reduced_data.shape)
print('Shape of target matrix:', target_matrix.shape)
# Split the data into training and testing sets
train_ratio = 0.8
X_train, X_test, y_train, y_test = train_test_split(
    normalized_reduced_data.T, target_matrix.T, train_size=train_ratio, random_state=42
)

# Define the kernel
kernel = C(1.0, (1e-4, 1e1)) * RBF(1.0, (1e-4, 1e1))
# Train the Gaussian Process model for each target variable
models = []
for i in range(y_train.shape[1]):
    gpr = GaussianProcessRegressor(kernel=kernel, n_restarts_optimizer=10, random_state=42)
    gpr.fit(X_train, y_train[:, i])
    models.append(gpr)

# Predict and evaluate the model
y_pred = np.zeros_like(y_test)
for i, gpr in enumerate(models):
    y_pred[:, i] = gpr.predict(X_test)

mse = mean_squared_error(y_test, y_pred)
print(f'Mean Squared Error: {mse}')
# Plot the results
plt.figure(figsize=(12, 6))
plt.plot(y_test[:, 0], label='True Sand')
plt.plot(y_pred[:, 0], label='Predicted Sand')
plt.legend()
plt.title('Sand Prediction')
plt.show()

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plt.figure(figsize=(12, 6))
plt.plot(y_test[:, 1], label='True Silt')
plt.plot(y_pred[:, 1], label='Predicted Silt')
plt.legend()
plt.title('Silt Prediction')
plt.show()

plt.figure(figsize=(12, 6))
plt.plot(y_test[:, 2], label='True Clay')
plt.plot(y_pred[:, 2], label='Predicted Clay')
plt.legend()
plt.title('Clay Prediction')
plt.show()
import pandas as pd

# Predict the values for the test set
y_pred = np.zeros_like(y_test)
for i, gpr in enumerate(models):
    y_pred[:, i] = gpr.predict(X_test)

# Create a DataFrame to display actual and predicted values side by side
results_df = pd.DataFrame({
    'Sample': range(1, len(y_test) + 1),
    'Actual Clay': y_test[:, 0],
    'Predicted Clay': y_pred[:, 0],
    'Actual Silt': y_test[:, 1],
    'Predicted Silt': y_pred[:, 1],
    'Actual Sand': y_test[:, 2],
    'Predicted Sand': y_pred[:, 2]
})

# Display the results
print(results_df)

# Optionally, save the results to a CSV file
results_df.to_csv('gpr_actual_vs_predicted.csv', index=False)

# Automatically download the CSV file (for Google Colab)
from google.colab import files
files.download('gpr_actual_vs_predicted.csv')

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