```
In [1]: import pandas as pd
       import numpy as np
       import os
       from tqdm import tqdm
       from datetime import datetime
       from datetime import timedelta
       from datetime import date as dtdt
       from pytz import timezone
       import itertools
       import math
       # from datetime import datetime, timedelta
       # Important, make sure to use the correct file
       weather_station = 'MI-14850-TRAVERSE_CITY_CHERRY_CPTL_AP'
       # In this part, we select the number of years used for the experiment
       start_year_lib = [2006, 2007, 2008, 2009, 2010, 2011, 2012, 2013, 2014, 2015
       # start_year_lib = [2006, 2007, 2008]
       hour_lib = ['00:00', '01:00', '02:00', '03:00', '04:00', '05:00', '06:00',
                  '10:00', '11:00', '12:00', '13:00', '14:00', '15:00', '16:00',
                  '18:00', '19:00', '20:00', '21:00', '22:00', '23:00']
       # Initialize an empty dataframe to store the combined data
       df combined all = pd.DataFrame()
       # Initialize an empty list to store the lengths of each 'df_GOES_meteo_combi
       lengths list = []
       def daterange(date1, date2):
          for n in range(int ((date2 - date1).days) + 1):
              yield date1 + timedelta(n)
       def round datetime to nearest hour(obj arr, STATE ID):
          arr_len = len(obj_arr)
          Date CST = []
          Time CST = []
          for i in range(arr_len):
              # iterate through
              date item = obj arr['Date'][i]
              time_item = obj_arr['Time'][i]
              t = datetime.strptime(date item + " " + time item, "%Y-%m-%d %H:%M")
              # Calculate the number of minutes past the last full hour
              minutes_past_hour = t.minute + t.second / 60
              # Round up to the next whole number of hours if the time is more tha
              # or round down to the current hour if it's less than 30 minutes pas
              if minutes_past_hour >= 30:
                  num hours = math.ceil(minutes past hour / 60)
              else:
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num\ hours = 0
      # Create a new datetime object representing the rounded time
      if STATE ID in ['IL', 'WI']:
          # No need to dial back one hour
          rounded_time_temp = t + timedelta(hours=num_hours)
      else:
          rounded time temp = t + timedelta(hours=num hours-1)
       rounded_time=datetime(year=rounded_time_temp.year,
                     month=rounded time temp.month,
                     day=rounded time temp.day,
                     hour=rounded_time_temp.hour, minute=0, second=0)
       result stamp = rounded time.strftime("%Y-%m-%d %H:%M")
      new date, new time = result stamp.split(' ')
      Date CST.append(new date)
      Time CST.append(new time)
   obj_arr['Date_CST'] = Date_CST
   obj arr['Time CST'] = Time CST
   return obj arr
def check snow 24 120(df):
   does_snow_24_120 = []
   for i in range(len(df)):
      if i + 120 < len(df):
          if any(df['is_snow_precip'].iloc[i+24:i+120]):
             does snow 24 120.append(True)
          else:
             does_snow_24_120.append(False)
      else:
          does snow 24 120 append(False)
   df['does_snow_24_120'] = does_snow_24_120
   return df
def lake 1D matcher(df temp, df lake 1D map):
   # left join df temp with df lake 1D map based on latitude and longitude
   df_merged_temp = pd.merge(df_lake_1D_map, df_temp, on=['latitude', 'long']
   # extract value column into a list
   value_temp = df_merged_temp['value'].tolist()
   return value temp
def is valid data(df temp):
   crit_1 = 0
   crit 2 = 0
   crit 3 = 0
   # Pass in value
   i temp = df temp.value
```

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try:
        i temp max = i temp.max().max()
       # Acquire mode in the array
       i_temp_mode = i_temp.mode()[0]
   except:
       i_{max} = 0
       i \text{ temp mode} = 0
   # Check Criteria #1:
   if i temp max <= 0.03:
        crit_1 = 1
   # Check Criteria #2:
   if i_temp_mode <= 0.02:</pre>
       crit_2 = 1
   # Check Criteria #3
   if len(i temp) <= 3000:
       crit_3 = 1
   crit_sum = crit_1 + crit_2 + crit_3
   if crit sum > 0:
       cond = False
   else:
        cond = True
    return cond
def cloud_finder(value_temp):
   # Deduct 0.1 from all elements in the array
   value_temp = [x - 0.1 \text{ for } x \text{ in } value\_temp]
   # Count the number of elements that are larger than or equal to 0
   count = sum(1 \text{ for } x \text{ in } value\_temp \text{ if } x >= 0)
   return count
for start_year in start_year_lib:
   ## It is always the case
   end_year = start_year + 1
   filename = weather_station[0:9]+str(start_year)+'Fall-'+str(end_year)+'S
   ## Extract the state indicator
   STATE_ID = filename[:2]
   STATE_2_LTR = filename[:2]
   # print(STATE_2_LTR)
```

```
# Check if they exist
if os.path.exists('NSW_Weather/'+weather_station+'/'):
   print('Weather station data exists for ', weather station)
else:
   print('Weather station data does not exist for ', weather_station)
if os.path.isfile('NSW Weather/'+weather station+'/'+filename):
   print("File exists, reading table!")
   temp table = pd.read csv('NSW Weather/'+weather station+'/'+filename
else:
   print("File does not exist, please rewind!")
# Go get the satellite imagery data
folder_name = 'zone_0_'+filename[9:13]+'Fall_'+filename[18:22]+'Spring'
# print(folder_name)
# Acquire the folder location for 2-D lake data based on folder name
folder_name_2D = folder_name[0:7]+'T_'+folder_name[7:]
# print(folder_name_2D)
# Add the parent folder name
parent_path = 'GOES_Hourly_Statistics/'
# Check if they exist
if os.path.exists(parent_path + folder_name):
   print('1-D Lake Michigan data exists for ', folder_name[7:15], ' to
else:
   print('1-D Lake Michigan data does not exist for ', folder_name[7:15
if os.path.exists(parent path + folder name 2D):
   print('2-D Lake Michigan data exists for ', folder_name_2D[9:17], '
else:
   print('2-D Lake Michigan data does not exist for ', folder_name[9:17
# Start a new part
 print(type(start_year))
print(type(start_year))
print(type(start_year))
print(type(start_year))
temp_start = int(start_year)
temp end = int(end year)
start_dt = dtdt(temp_start, 10, 1)
end_dt = dtdt(temp_end, 3, 31)
weather_date_theo = [dt.strftime("%Y%m%d") for dt in daterange(start_dt,
csv_date_list = list(itertools.chain.from_iterable(itertools.repeat(x, 2
csv_time_list = hour_lib * len(weather_date_theo)
# Example usage
weather_with_CST = round_datetime_to_nearest_hour(temp_table, STATE_ID)
weather_with_CST['Precip (in)'] = weather_with_CST['Precip (in)'].replace
weather_with_CST['Temp (F)'] = weather_with_CST['Temp (F)'].replace('M',
is_snow_precip = ((weather_with_CST['Precip (in)'] > 0) & (weather_with_
weather_with_CST['is_snow_precip'] = is_snow_precip
weather_with_CST = check_snow_24_120(weather_with_CST)
```

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# Initialize empty list to store results
\# does_snow_24_120 = []
# # Iterate through each row in the 'is snow precip' column
# for i in range(len(weather_with_CST['is_snow_precip'])):
      # Check if the next 24 to 120 rows contain more than 2 True values
      if i+120 < len(weather_with_CST['is_snow_precip']):</pre>
#
          rolling sum = weather with CST['is snow precip'][i+24:i+121].r
#
          count_true = np.sum(rolling_sum > 2)
#
    else:
         count true = 0
#
#
    # Append the result to the list
#
      does snow 24 120.append(count true)
# # Add the list to the dataframe
# weather_with_CST['does_snow_24_120'] = does_snow_24_120
Date CST = pd.Series(csv date list, name = 'Date CST')
Time_CST = pd.Series(csv_time_list, name = 'Time_CST')
# Start to retrieve files
# Get a list of all files in the directory
file_list_1D = os.listdir(parent_path + folder_name)
# Sort the list of files (Necessary on Linux)
file_list_1D.sort()
# Get a list of all files in the directory
file_list_2D = os.listdir(parent_path + folder_name_2D)
# Sort the list of files (Necessary on Linux)
file_list_2D.sort()
intend_date_list = []
for date in csv date list:
    intend date = date[:4] + '.' + date[4:6] + '.' + date[6:]
    intend_date_list.append(intend_date)
intend_time_list = [t.replace(':', '') for t in csv_time_list]
intend_timestamp_list = [f"{date}.{time}" for date, time in zip(intend_d
Date UTC = []
for date in csv_date_list:
    intend_date = date[:4] + '-' + date[4:6] + '-' + date[6:]
    Date_UTC.append(intend_date)
Time UTC = csv time list.copy()
file_1D_timestamp = []
for filename in file list 1D:
    file 1D = filename[7:22]
    file 1D timestamp.append(file 1D)
```

```
# Define UTC and CST time zones
utc tz = timezone('UTC')
cst_tz = timezone('Etc/GMT+6')
# Example lists of datetime strings
date_utc_list = Date_UTC.copy()
time_utc_list = Time_UTC.copy()
# Convert datetime strings from UTC to CST
date_cst_list = []
time cst list = []
for date_str, time_str in zip(date_utc_list, time_utc_list):
    datetime utc = datetime.strptime(date str + ' ' + time str, '%Y-%m-%
    datetime utc = utc tz.localize(datetime utc)
    datetime cst = datetime utc.astimezone(cst tz)
    date_cst_list.append(datetime_cst.strftime('%Y-%m-%d'))
    time_cst_list.append(datetime_cst.strftime('%H:%M'))
data dict = {'Date UTC': Date UTC,
         'Time_UTC': Time_UTC,
         'Date CST': date cst list,
         'Time_CST': time_cst_list,
         'intend_timestamp_list': intend_timestamp_list}
# create the DataFrame using the dictionary
df_GOES_time_lib = pd.DataFrame(data_dict)
df_GOES_file_lib = pd.DataFrame({'file_timestamp': file_1D_timestamp, 'f
df GOES combined = pd.merge(df GOES time lib, df GOES file lib, left on=
df_GOES_combined.fillna('None', inplace=True)
output dir = 'output/GOES file lib dir/'
output_csv_name = str(start_year)+'Fall_'+str(end_year)+'Spring_GOES_lib
output file path = os.path.join(output dir, output csv name)
df_GOES_combined.to_csv(output_file_path, index=False)
####################
df_reference_1D = pd.read_csv('02-05-2023/zone_0_sample_take_2/' + 'goes
table_1D_len = df_reference_1D.shape[0]
df_lake_1D_map = df_reference_1D[['latitude', 'longitude']].copy()
matched_1D_file_list = df_GOES_combined['file_list_1D'].tolist()
matched_2D_file_list = df_GOES_combined['file_list_2D'].tolist()
matrix = df reference 1D.values
df_tester_again = pd.read_csv('02-05-2023/zone_0_sample_take_2/' + 'goes'
temp_result_tester = lake_1D_matcher(df_tester_again, df_lake_1D_map)
####################
lake_1D_list = []
# lat lists = []
\# lon_lists = []
cond list = []
count list = []
```

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cloud exist list = []
    for file_name in tqdm(matched_1D_file_list):
    # for file name in matched 1D file list[1769:1775]:
        try:
            temp_file_path = parent_path + folder_name + '/' + file_name
    #
              print( temp_file_path)
    #
              print(counter)
            df temp = pd.read csv(temp file path)
            value_temp = lake_1D_matcher(df_temp, df_lake_1D_map)
            cond = is_valid_data(df_temp)
            cond_list.append(cond)
            lake 1D list.append(value temp)
            num_clouds = cloud_finder(value_temp)
            count list.append(num clouds)
            if num_clouds < 720:</pre>
                exist_temp = False
            else:
                exist_temp = True
            # Replace all NaN values in the 'exist_temp' array with 0.0
            exist_temp = np.nan_to_num(exist_temp, nan=0.0)
            cloud_exist_list.append(exist_temp)
    #
              lat_lists.append(lat_list)
    #
              lon_lists.append(lon_list)
        except FileNotFoundError:
            lake 1D list.append(np.zeros(3599))
            cond_list.append(False)
            count list.append(0)
            cloud_exist_list.append(False)
    # list of matrices
    lake_2D_list = []
      # loop over file names
#
      for file_name in tqdm(matched_2D_file_list):
#
          try:
#
              # read csv file into dataframe
#
              temp file path = parent path + folder name 2D + '/' + file nam
#
              df_temp = pd.read_csv(temp_file_path)
#
              df_temp = df_temp.iloc[1:, 1:]
#
              # Replace NaN values in 'values' with 0 in 'df_temp'
#
              df\_temp = df\_temp_fillna(0)
#
                print(df_temp.shape)
      #
#
              # convert dataframe to numpy array/matrix
#
              mat_temp = df_temp.values
#
      #
                mat_temp = np.array(df_temp.values.flatten())
#
              # assume df temp is a DataFrame with multiple columns
#
      #
                arrays = [df_temp.iloc[:, i].to_numpy() for i in range(len(d))
#
      #
                mat temp = arrays
#
          except FileNotFoundError:
#
              # if file does not exist, save NaN
              mat\_temp = np.zeros((105, 79))
#
          # append matrix to list
          lake 2D list.append(mat temp)
```

```
df GOES combined['lake 1D list'] = lake 1D list
     df GOES combined['lake 2D list'] = lake 2D list
   df GOES combined['data usable'] = cond list
   df_GOES_combined['cloud_count'] = count_list
   df_GOES_combined['cloud_exist'] = cloud_exist_list
   df_GOES_meteo_combined = pd.merge(df_GOES_combined, weather_with_CST, or
   column_names = df_GOES_meteo_combined.columns.tolist()
   df GOES meteo combined = df GOES meteo combined.drop(['Date', 'Time', 'i
    df GOES meteo combined.rename(columns={'file list 1D': 'File name for 1D'
   df_GOES_meteo_combined.rename(columns={'file_list_2D': 'File_name_for_2D'}
   df_GOES_meteo_combined.rename(columns={'lake_1D_list': 'Lake_data_1D'},
     df_GOES_meteo_combined.rename(columns={'lake_2D_list': 'Lake_data_2D'}
   column names = df GOES meteo combined.columns.tolist()
   # Concatenate the temporary data to the 'df_combined_all' dataframe
   df_combined_all = pd.concat([df_combined_all, df_GOES_meteo_combined], i
   # Store the length of 'df_GOES_meteo_combined' in the 'lengths_list'
    lengths_list.append(len(df_GOES_meteo_combined))
Weather station data exists for MI-14850-TRAVERSE CITY CHERRY CPTL AP
File exists, reading table!
1-D Lake Michigan data exists for 2006Fall to 2007Spring
2-D Lake Michigan data exists for 2006Fall to 2007Spring
/tmp/ipykernel_58001/1036582874.py:175: ParserWarning: Falling back to the
'python' engine because the 'c' engine does not support skipfooter; you can
avoid this warning by specifying engine='python'.
  temp_table = pd.read_csv('NSW_Weather/'+weather_station+'/'+filename, ski
prows = 8, skipfooter = 15)
             4368/4368 [01:07<00:00, 64.64it/s]
/tmp/ipykernel 58001/1036582874.py:175: ParserWarning: Falling back to the
'python' engine because the 'c' engine does not support skipfooter; you can
avoid this warning by specifying engine='python'.
 temp table = pd.read csv('NSW Weather/'+weather station+'/'+filename, ski
prows = 8, skipfooter = 15)
Weather station data exists for MI-14850-TRAVERSE_CITY_CHERRY_CPTL_AP
File exists, reading table!
1-D Lake Michigan data exists for 2007Fall to 2008Spring
2-D Lake Michigan data exists for 2007Fall to 2008Spring
100% | 4392/4392 [01:11<00:00, 61.48it/s]
/tmp/ipykernel_58001/1036582874.py:175: ParserWarning: Falling back to the
'python' engine because the 'c' engine does not support skipfooter; you can
avoid this warning by specifying engine='python'.
 temp table = pd.read csv('NSW Weather/'+weather station+'/'+filename, ski
prows = 8, skipfooter = 15)
Weather station data exists for MI-14850-TRAVERSE_CITY_CHERRY_CPTL_AP
File exists, reading table!
1-D Lake Michigan data exists for 2008Fall to 2009Spring
2-D Lake Michigan data exists for 2008Fall to 2009Spring
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4368/4368 [01:12<00:00, 60.25it/s]
/tmp/ipykernel_58001/1036582874.py:175: ParserWarning: Falling back to the
'python' engine because the 'c' engine does not support skipfooter; you can
avoid this warning by specifying engine='python'.
  temp table = pd.read csv('NSW Weather/'+weather station+'/'+filename, ski
prows = 8, skipfooter = 15)
Weather station data exists for MI-14850-TRAVERSE CITY CHERRY CPTL AP
File exists, reading table!
1-D Lake Michigan data exists for 2009Fall to 2010Spring
2-D Lake Michigan data exists for 2009Fall to 2010Spring
        | 4368/4368 [01:01<00:00, 71.25it/s]
/tmp/ipykernel_58001/1036582874.py:175: ParserWarning: Falling back to the
'python' engine because the 'c' engine does not support skipfooter; you can
avoid this warning by specifying engine='python'.
  temp_table = pd.read_csv('NSW_Weather/'+weather_station+'/'+filename, ski
prows = 8, skipfooter = 15)
Weather station data exists for MI-14850-TRAVERSE CITY CHERRY CPTL AP
File exists, reading table!
1-D Lake Michigan data exists for 2010Fall to 2011Spring
2-D Lake Michigan data exists for 2010Fall to 2011Spring
             4368/4368 [00:55<00:00, 79.07it/s]
/tmp/ipykernel 58001/1036582874.py:175: ParserWarning: Falling back to the
'python' engine because the 'c' engine does not support skipfooter; you can
avoid this warning by specifying engine='python'.
  temp_table = pd.read_csv('NSW_Weather/'+weather_station+'/'+filename, ski
prows = 8, skipfooter = 15)
Weather station data exists for MI-14850-TRAVERSE_CITY_CHERRY_CPTL_AP
File exists, reading table!
1-D Lake Michigan data exists for 2011Fall to 2012Spring
2-D Lake Michigan data exists for 2011Fall to 2012Spring
       | 4392/4392 [01:14<00:00, 58.82it/s]
/tmp/ipykernel_58001/1036582874.py:175: ParserWarning: Falling back to the
'python' engine because the 'c' engine does not support skipfooter; you can
avoid this warning by specifying engine='python'.
  temp_table = pd.read_csv('NSW_Weather/'+weather_station+'/'+filename, ski
prows = 8, skipfooter = 15)
Weather station data exists for MI-14850-TRAVERSE_CITY_CHERRY_CPTL_AP
File exists, reading table!
1-D Lake Michigan data exists for 2012Fall to 2013Spring
2-D Lake Michigan data exists for 2012Fall to 2013Spring
       4368/4368 [01:21<00:00, 53.47it/s]
/tmp/ipykernel_58001/1036582874.py:175: ParserWarning: Falling back to the
'python' engine because the 'c' engine does not support skipfooter; you can
avoid this warning by specifying engine='python'.
  temp_table = pd.read_csv('NSW_Weather/'+weather_station+'/'+filename, ski
prows = 8, skipfooter = 15)
Weather station data exists for MI-14850-TRAVERSE_CITY_CHERRY_CPTL_AP
File exists, reading table!
1-D Lake Michigan data exists for 2013Fall to 2014Spring
2-D Lake Michigan data exists for 2013Fall to 2014Spring
```

```
4368/4368 [01:01<00:00, 71.22it/s]
        /tmp/ipykernel_58001/1036582874.py:175: ParserWarning: Falling back to the
        'python' engine because the 'c' engine does not support skipfooter; you can
        avoid this warning by specifying engine='python'.
          temp table = pd.read csv('NSW Weather/'+weather station+'/'+filename, ski
        prows = 8, skipfooter = 15)
        Weather station data exists for MI-14850-TRAVERSE CITY CHERRY CPTL AP
        File exists, reading table!
        1-D Lake Michigan data exists for 2014Fall to 2015Spring
        2-D Lake Michigan data exists for 2014Fall to 2015Spring
                4368/4368 [01:12<00:00, 60.01it/s]
        /tmp/ipykernel_58001/1036582874.py:175: ParserWarning: Falling back to the
        'python' engine because the 'c' engine does not support skipfooter; you can
        avoid this warning by specifying engine='python'.
          temp_table = pd.read_csv('NSW_Weather/'+weather_station+'/'+filename, ski
        prows = 8, skipfooter = 15)
        Weather station data exists for MI-14850-TRAVERSE CITY CHERRY CPTL AP
        File exists, reading table!
        1-D Lake Michigan data exists for 2015Fall to 2016Spring
        2-D Lake Michigan data exists for 2015Fall to 2016Spring
                     4392/4392 [01:18<00:00, 55.67it/s]
        /tmp/ipykernel 58001/1036582874.py:175: ParserWarning: Falling back to the
        'python' engine because the 'c' engine does not support skipfooter; you can
        avoid this warning by specifying engine='python'.
          temp_table = pd.read_csv('NSW_Weather/'+weather_station+'/'+filename, ski
        prows = 8, skipfooter = 15)
        Weather station data exists for MI-14850-TRAVERSE_CITY_CHERRY_CPTL_AP
        File exists, reading table!
        1-D Lake Michigan data exists for 2016Fall to 2017Spring
        2-D Lake Michigan data exists for 2016Fall to 2017Spring
        100% | 4368/4368 [01:15<00:00, 58.22it/s]
In [2]: import numpy as np
        import pandas as pd
        from sklearn.model_selection import train_test_split
        from sklearn.preprocessing import StandardScaler
        from sklearn.metrics import mean_squared_error, mean_absolute_error
        import tensorflow as tf
        from tensorflow.keras.models import Sequential
        from tensorflow.keras.layers import Conv1D, Dense, Flatten, Dropout
        X = np.stack(df filtered['Lake data 1D'].to numpy())
        df_filtered['does_snow_24_120'] = df_filtered['does_snow_24_120'].apply(lamb
        y = df_filtered['does_snow_24_120'].values.astype(int)
        # print(y)
        # Fill NaN values with 0
        X = np.nan_to_num(X)
        y = np.nan to num(y)
        input data = []
        output_data = []
```

```
for i in range(len(X) - 35):
    input data.append(X[i:i+21])
    output_data.append(y[i+35])
input data = np.stack(input data)
output data = np.stack(output data)
# Scale the input data
scaler = StandardScaler()
input data scaled = scaler.fit transform(input data.reshape(input data.shape
# Reshape the input data to match ConvlD input shape (batch size, steps, inp
input data scaled = input data scaled.reshape(input data scaled.shape[0], in
# Split the data into training and testing sets
X_train, X_test, y_train, y_test = train_test_split(input_data_scaled, output
model = Sequential()
model.add(Conv1D(64, 3, activation='relu', input_shape=(X_train.shape[1], X_
model.add(Conv1D(128, 3, activation='relu'))
model.add(Dropout(0.1))
model.add(Conv1D(128, 3, activation='relu'))
model.add(Dropout(0.1))
model.add(Flatten())
model.add(Dense(128, activation='relu'))
model.add(Dense(1, activation='sigmoid'))
model.compile(optimizer='adam', loss='binary crossentropy', metrics=['mae',
# model.compile(optimizer='adam', loss='mse', metrics=['mae', 'accuracy'])
history = model.fit(X train, y train, epochs=200, batch size=64, validation
2023-05-11 08:03:18.998254: I tensorflow/core/platform/cpu_feature_guard.c
c:193] This TensorFlow binary is optimized with oneAPI Deep Neural Network
Library (oneDNN) to use the following CPU instructions in performance-criti
cal operations: SSE4.1 SSE4.2 AVX AVX2 FMA
To enable them in other operations, rebuild TensorFlow with the appropriate
compiler flags.
```

```
NameError

Cell In[2], line 10

7 from tensorflow.keras.models import Sequential

8 from tensorflow.keras.layers import Conv1D, Dense, Flatten, Dropout

---> 10 X = np.stack(df_filtered['Lake_data_1D'].to_numpy())

12 df_filtered['does_snow_24_120'] = df_filtered['does_snow_24_120'].a

pply(lambda x: int(round(x)) if isinstance(x, float) and not np.isnan(x) el

se (int(x) if not np.isnan(x) else 0))

14 y = df_filtered['does_snow_24_120'].values.astype(int)

NameError: name 'df_filtered' is not defined
```

In [ ]: