Sudan Crisis 2

July 13, 2025

Human Rights Monitoring and Protection of Population in Sudan Using Twitter Data

```
[1]: !java -version
```

openjdk version "11.0.27" 2025-04-15 OpenJDK Runtime Environment (build 11.0.27+6-post-Ubuntu-Oubuntu122.04) OpenJDK 64-Bit Server VM (build 11.0.27+6-post-Ubuntu-Oubuntu122.04, mixed mode, sharing)

[2]: %pip install kafka-python pandas geopandas matplotlib seaborn nltk spacy torch_dransformers pyspark findspark scikit-learn shapely geopy tensorflow==2.15.0_densorflow-hub==0.15.0 tensorflow-text==2.15.0 keras==2.15.0 numpy

Requirement already satisfied: kafka-python in /home/hadoop/py311env/lib/python3.11/site-packages (2.2.10) Requirement already satisfied: pandas in /home/hadoop/py311env/lib/python3.11/site-packages (2.2.3) Requirement already satisfied: geopandas in /home/hadoop/py311env/lib/python3.11/site-packages (1.0.1) Requirement already satisfied: matplotlib in /home/hadoop/py311env/lib/python3.11/site-packages (3.10.3) Requirement already satisfied: seaborn in /home/hadoop/py311env/lib/python3.11/site-packages (0.13.2) Requirement already satisfied: nltk in /home/hadoop/py311env/lib/python3.11/site-packages (3.9.1) Requirement already satisfied: spacy in /home/hadoop/py311env/lib/python3.11/site-packages (3.8.7) Requirement already satisfied: torch in /home/hadoop/py311env/lib/python3.11/site-packages (2.7.0) Requirement already satisfied: transformers in /home/hadoop/py311env/lib/python3.11/site-packages (4.53.1) Requirement already satisfied: pyspark in /home/hadoop/py311env/lib/python3.11/site-packages (4.0.0) Requirement already satisfied: findspark in /home/hadoop/py311env/lib/python3.11/site-packages (2.0.1) Requirement already satisfied: scikit-learn in /home/hadoop/py311env/lib/python3.11/site-packages (1.6.1) Requirement already satisfied: shapely in /home/hadoop/py311env/lib/python3.11/site-packages (2.1.1)

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Requirement already satisfied: geopy in
/home/hadoop/py311env/lib/python3.11/site-packages (2.4.1)
Requirement already satisfied: tensorflow==2.15.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (2.15.0)
Requirement already satisfied: tensorflow-hub==0.15.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (0.15.0)
Requirement already satisfied: tensorflow-text==2.15.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (2.15.0)
Requirement already satisfied: keras==2.15.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (2.15.0)
Requirement already satisfied: numpy in
/home/hadoop/py311env/lib/python3.11/site-packages (1.26.4)
Requirement already satisfied: absl-py>=1.0.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
Requirement already satisfied: astunparse>=1.6.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
Requirement already satisfied: flatbuffers>=23.5.26 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
Requirement already satisfied: gast!=0.5.0,!=0.5.1,!=0.5.2,>=0.2.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(0.6.0)
Requirement already satisfied: google-pasta>=0.1.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(0.2.0)
Requirement already satisfied: h5py>=2.9.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(3.13.0)
Requirement already satisfied: libclang>=13.0.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(18.1.1)
Requirement already satisfied: ml-dtypes~=0.2.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(0.2.0)
Requirement already satisfied: opt-einsum>=2.3.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(3.4.0)
Requirement already satisfied: packaging in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(25.0)
Requirement already satisfied:
protobuf!=4.21.0,!=4.21.1,!=4.21.2,!=4.21.3,!=4.21.4,!=4.21.5,<5.0.0dev,>=3.20.3
in /home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(4.25.8)
Requirement already satisfied: setuptools in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
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(65.5.0)
Requirement already satisfied: six>=1.12.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(1.17.0)
Requirement already satisfied: termcolor>=1.1.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
Requirement already satisfied: typing-extensions>=3.6.6 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(4.13.2)
Requirement already satisfied: wrapt<1.15,>=1.11.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(1.14.1)
Requirement already satisfied: tensorflow-io-gcs-filesystem>=0.23.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(0.37.1)
Requirement already satisfied: grpcio<2.0,>=1.24.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(1.71.0)
Requirement already satisfied: tensorboard<2.16,>=2.15 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(2.15.2)
Requirement already satisfied: tensorflow-estimator<2.16,>=2.15.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from tensorflow==2.15.0)
(2.15.0)
Requirement already satisfied: google-auth<3,>=1.6.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
tensorboard<2.16,>=2.15->tensorflow==2.15.0) (2.40.3)
Requirement already satisfied: google-auth-oauthlib<2,>=0.5 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
tensorboard<2.16,>=2.15->tensorflow==2.15.0) (1.2.2)
Requirement already satisfied: markdown>=2.6.8 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
tensorboard<2.16,>=2.15->tensorflow==2.15.0) (3.8)
Requirement already satisfied: requests<3,>=2.21.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
tensorboard<2.16,>=2.15->tensorflow==2.15.0) (2.32.3)
Requirement already satisfied: tensorboard-data-server<0.8.0,>=0.7.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
tensorboard<2.16,>=2.15->tensorflow==2.15.0) (0.7.2)
Requirement already satisfied: werkzeug>=1.0.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
tensorboard<2.16,>=2.15->tensorflow==2.15.0) (3.1.3)
Requirement already satisfied: cachetools<6.0,>=2.0.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from google-
auth<3,>=1.6.3->tensorboard<2.16,>=2.15->tensorflow==2.15.0) (5.5.2)
Requirement already satisfied: pyasn1-modules>=0.2.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from google-
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auth<3,>=1.6.3->tensorboard<2.16,>=2.15->tensorflow==2.15.0) (0.4.2)
Requirement already satisfied: rsa<5,>=3.1.4 in
/home/hadoop/py311env/lib/python3.11/site-packages (from google-
auth<3,>=1.6.3->tensorboard<2.16,>=2.15->tensorflow==2.15.0) (4.9.1)
Requirement already satisfied: requests-oauthlib>=0.7.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from google-auth-
oauthlib<2,>=0.5->tensorboard<2.16,>=2.15->tensorflow==2.15.0) (2.0.0)
Requirement already satisfied: charset-normalizer<4,>=2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
requests<3,>=2.21.0->tensorboard<2.16,>=2.15->tensorflow==2.15.0) (3.4.2)
Requirement already satisfied: idna<4,>=2.5 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
requests<3,>=2.21.0->tensorboard<2.16,>=2.15->tensorflow==2.15.0) (3.10)
Requirement already satisfied: urllib3<3,>=1.21.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
requests<3,>=2.21.0->tensorboard<2.16,>=2.15->tensorflow==2.15.0) (2.4.0)
Requirement already satisfied: certifi>=2017.4.17 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
requests<3,>=2.21.0->tensorboard<2.16,>=2.15->tensorflow==2.15.0) (2025.4.26)
Requirement already satisfied: pyasn1>=0.1.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from rsa<5,>=3.1.4->google-
auth<3,>=1.6.3->tensorboard<2.16,>=2.15->tensorflow==2.15.0) (0.6.1)
Requirement already satisfied: python-dateutil>=2.8.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from pandas) (2.9.0.post0)
Requirement already satisfied: pytz>=2020.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from pandas) (2025.2)
Requirement already satisfied: tzdata>=2022.7 in
/home/hadoop/py311env/lib/python3.11/site-packages (from pandas) (2025.2)
Requirement already satisfied: pyogrio>=0.7.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from geopandas) (0.11.0)
Requirement already satisfied: pyproj>=3.3.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from geopandas) (3.7.1)
Requirement already satisfied: contourpy>=1.0.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from matplotlib) (1.3.2)
Requirement already satisfied: cycler>=0.10 in
/home/hadoop/py311env/lib/python3.11/site-packages (from matplotlib) (0.12.1)
Requirement already satisfied: fonttools>=4.22.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from matplotlib) (4.58.1)
Requirement already satisfied: kiwisolver>=1.3.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from matplotlib) (1.4.8)
Requirement already satisfied: pillow>=8 in
/home/hadoop/py311env/lib/python3.11/site-packages (from matplotlib) (11.2.1)
Requirement already satisfied: pyparsing>=2.3.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from matplotlib) (3.2.3)
Requirement already satisfied: click in
/home/hadoop/py311env/lib/python3.11/site-packages (from nltk) (8.2.1)
Requirement already satisfied: joblib in
/home/hadoop/py311env/lib/python3.11/site-packages (from nltk) (1.5.1)
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Requirement already satisfied: regex>=2021.8.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from nltk) (2024.11.6)
Requirement already satisfied: tqdm in
/home/hadoop/py311env/lib/python3.11/site-packages (from nltk) (4.67.1)
Requirement already satisfied: spacy-legacy<3.1.0,>=3.0.11 in
/home/hadoop/py311env/lib/python3.11/site-packages (from spacy) (3.0.12)
Requirement already satisfied: spacy-loggers<2.0.0,>=1.0.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from spacy) (1.0.5)
Requirement already satisfied: murmurhash<1.1.0,>=0.28.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from spacy) (1.0.13)
Requirement already satisfied: cymem<2.1.0,>=2.0.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from spacy) (2.0.11)
Requirement already satisfied: preshed<3.1.0,>=3.0.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from spacy) (3.0.10)
Requirement already satisfied: thinc<8.4.0,>=8.3.4 in
/home/hadoop/py311env/lib/python3.11/site-packages (from spacy) (8.3.4)
Requirement already satisfied: wasabi<1.2.0,>=0.9.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from spacy) (1.1.3)
Requirement already satisfied: srsly<3.0.0,>=2.4.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from spacy) (2.5.1)
Requirement already satisfied: catalogue<2.1.0,>=2.0.6 in
/home/hadoop/py311env/lib/python3.11/site-packages (from spacy) (2.0.10)
Requirement already satisfied: weasel<0.5.0,>=0.1.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from spacy) (0.4.1)
Requirement already satisfied: typer<1.0.0,>=0.3.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from spacy) (0.16.0)
Requirement already satisfied: pydantic!=1.8,!=1.8.1,<3.0.0,>=1.7.4 in
/home/hadoop/py311env/lib/python3.11/site-packages (from spacy) (2.11.5)
Requirement already satisfied: jinja2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from spacy) (3.1.6)
Requirement already satisfied: langcodes<4.0.0,>=3.2.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from spacy) (3.5.0)
Requirement already satisfied: language-data>=1.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
langcodes<4.0.0,>=3.2.0->spacy) (1.3.0)
Requirement already satisfied: annotated-types>=0.6.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
pydantic!=1.8,!=1.8.1,<3.0.0,>=1.7.4->spacy) (0.7.0)
Requirement already satisfied: pydantic-core==2.33.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
pydantic!=1.8,!=1.8.1,<3.0.0,>=1.7.4->spacy) (2.33.2)
Requirement already satisfied: typing-inspection>=0.4.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
pydantic!=1.8,!=1.8.1,<3.0.0,>=1.7.4->spacy) (0.4.1)
Requirement already satisfied: blis<1.3.0,>=1.2.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
thinc<8.4.0,>=8.3.4->spacy) (1.2.1)
Requirement already satisfied: confection<1.0.0,>=0.0.1 in
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/home/hadoop/py311env/lib/python3.11/site-packages (from
thinc<8.4.0,>=8.3.4->spacy) (0.1.5)
Requirement already satisfied: shellingham>=1.3.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
typer<1.0.0,>=0.3.0->spacy) (1.5.4)
Requirement already satisfied: rich>=10.11.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
typer<1.0.0,>=0.3.0->spacy) (14.0.0)
Requirement already satisfied: cloudpathlib<1.0.0,>=0.7.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
weasel<0.5.0,>=0.1.0->spacy) (0.21.1)
Requirement already satisfied: smart-open<8.0.0,>=5.2.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
weasel<0.5.0,>=0.1.0->spacy) (7.1.0)
Requirement already satisfied: filelock in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (3.18.0)
Requirement already satisfied: sympy>=1.13.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (1.14.0)
Requirement already satisfied: networkx in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (3.5)
Requirement already satisfied: fsspec in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (2025.3.0)
Requirement already satisfied: nvidia-cuda-nvrtc-cu12==12.6.77 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (12.6.77)
Requirement already satisfied: nvidia-cuda-runtime-cu12==12.6.77 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (12.6.77)
Requirement already satisfied: nvidia-cuda-cupti-cu12==12.6.80 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (12.6.80)
Requirement already satisfied: nvidia-cudnn-cu12==9.5.1.17 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (9.5.1.17)
Requirement already satisfied: nvidia-cublas-cu12==12.6.4.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (12.6.4.1)
Requirement already satisfied: nvidia-cufft-cu12==11.3.0.4 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (11.3.0.4)
Requirement already satisfied: nvidia-curand-cu12==10.3.7.77 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (10.3.7.77)
Requirement already satisfied: nvidia-cusolver-cu12==11.7.1.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (11.7.1.2)
Requirement already satisfied: nvidia-cusparse-cu12==12.5.4.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (12.5.4.2)
Requirement already satisfied: nvidia-cusparselt-cu12==0.6.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (0.6.3)
Requirement already satisfied: nvidia-nccl-cu12==2.26.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (2.26.2)
Requirement already satisfied: nvidia-nvtx-cu12==12.6.77 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (12.6.77)
Requirement already satisfied: nvidia-nvjitlink-cu12==12.6.85 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (12.6.85)
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Requirement already satisfied: nvidia-cufile-cu12==1.11.1.6 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (1.11.1.6)
Requirement already satisfied: triton==3.3.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from torch) (3.3.0)
Requirement already satisfied: huggingface-hub<1.0,>=0.30.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from transformers) (0.32.3)
Requirement already satisfied: pyyaml>=5.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from transformers) (6.0.2)
Requirement already satisfied: tokenizers<0.22,>=0.21 in
/home/hadoop/py311env/lib/python3.11/site-packages (from transformers) (0.21.1)
Requirement already satisfied: safetensors>=0.4.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from transformers) (0.5.3)
Requirement already satisfied: hf-xet<2.0.0,>=1.1.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from huggingface-
hub<1.0,>=0.30.0->transformers) (1.1.2)
Requirement already satisfied: py4j==0.10.9.9 in
/home/hadoop/py311env/lib/python3.11/site-packages (from pyspark) (0.10.9.9)
Requirement already satisfied: scipy>=1.6.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from scikit-learn) (1.15.3)
Requirement already satisfied: threadpoolctl>=3.1.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from scikit-learn) (3.6.0)
Requirement already satisfied: geographiclib<3,>=1.52 in
/home/hadoop/py311env/lib/python3.11/site-packages (from geopy) (2.0)
Requirement already satisfied: wheel<1.0,>=0.23.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
astunparse>=1.6.0->tensorflow==2.15.0) (0.45.1)
Requirement already satisfied: marisa-trie>=1.1.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from language-
data>=1.2->langcodes<4.0.0,>=3.2.0->spacy) (1.2.1)
Requirement already satisfied: oauthlib>=3.0.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from requests-
oauthlib>=0.7.0->google-auth-
oauthlib<2,>=0.5->tensorboard<2.16,>=2.15->tensorflow==2.15.0) (3.3.1)
Requirement already satisfied: markdown-it-py>=2.2.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
rich>=10.11.0->typer<1.0.0,>=0.3.0->spacy) (3.0.0)
Requirement already satisfied: pygments<3.0.0,>=2.13.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
rich>=10.11.0->typer<1.0.0,>=0.3.0->spacy) (2.19.1)
Requirement already satisfied: mdurl~=0.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from markdown-it-
py>=2.2.0->rich>=10.11.0->typer<1.0.0,>=0.3.0->spacy) (0.1.2)
Requirement already satisfied: mpmath<1.4,>=1.1.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from sympy>=1.13.3->torch)
(1.3.0)
Requirement already satisfied: MarkupSafe>=2.1.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
werkzeug>=1.0.1->tensorboard<2.16,>=2.15->tensorflow==2.15.0) (3.0.2)
```

Note: you may need to restart the kernel to use updated packages.

```
[3]: import tensorflow as tf
     import tensorflow hub as hub
     import tensorflow_text as text
     print("TensorFlow:", tf.__version__)
     print("TensorFlow Hub:", hub.__version__)
     print("TensorFlow Text:", text.__version__)
    2025-07-07 17:33:53.784122: E
    external/local_xla/xla/stream_executor/cuda/cuda_dnn.cc:9261] Unable to register
    cuDNN factory: Attempting to register factory for plugin cuDNN when one has
    already been registered
    2025-07-07 17:33:53.784191: E
    external/local_xla/xla/stream_executor/cuda/cuda_fft.cc:607] Unable to register
    cuFFT factory: Attempting to register factory for plugin cuFFT when one has
    already been registered
    2025-07-07 17:33:53.796881: E
    external/local_xla/xla/stream_executor/cuda/cuda_blas.cc:1515] Unable to
    register cuBLAS factory: Attempting to register factory for plugin cuBLAS when
    one has already been registered
    2025-07-07 17:33:53.849274: I tensorflow/core/platform/cpu_feature_guard.cc:182]
    This TensorFlow binary is optimized to use available CPU instructions in
    performance-critical operations.
    To enable the following instructions: AVX2 FMA, in other operations, rebuild
    TensorFlow with the appropriate compiler flags.
    2025-07-07 17:33:54.818070: W
    tensorflow/compiler/tf2tensorrt/utils/py_utils.cc:38] TF-TRT Warning: Could not
    find TensorRT
    TensorFlow: 2.15.0
    TensorFlow Hub: 0.15.0
    TensorFlow Text: 2.15.0
[4]: %pip install --upgrade jupyter ipywidgets
    Requirement already satisfied: jupyter in
    /home/hadoop/py311env/lib/python3.11/site-packages (1.1.1)
    Requirement already satisfied: ipywidgets in
    /home/hadoop/py311env/lib/python3.11/site-packages (8.1.7)
    Requirement already satisfied: notebook in
    /home/hadoop/py311env/lib/python3.11/site-packages (from jupyter) (7.4.3)
    Requirement already satisfied: jupyter-console in
    /home/hadoop/py311env/lib/python3.11/site-packages (from jupyter) (6.6.3)
    Requirement already satisfied: nbconvert in
    /home/hadoop/py311env/lib/python3.11/site-packages (from jupyter) (7.16.6)
    Requirement already satisfied: ipykernel in
```

```
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter) (6.29.5)
Requirement already satisfied: jupyterlab in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter) (4.4.3)
Requirement already satisfied: comm>=0.1.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from ipywidgets) (0.2.2)
Requirement already satisfied: ipython>=6.1.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from ipywidgets) (9.2.0)
Requirement already satisfied: traitlets>=4.3.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from ipywidgets) (5.14.3)
Requirement already satisfied: widgetsnbextension~=4.0.14 in
/home/hadoop/py311env/lib/python3.11/site-packages (from ipywidgets) (4.0.14)
Requirement already satisfied: jupyterlab_widgets~=3.0.15 in
/home/hadoop/py311env/lib/python3.11/site-packages (from ipywidgets) (3.0.15)
Requirement already satisfied: decorator in
/home/hadoop/py311env/lib/python3.11/site-packages (from
ipython>=6.1.0->ipywidgets) (5.2.1)
Requirement already satisfied: ipython-pygments-lexers in
/home/hadoop/py311env/lib/python3.11/site-packages (from
ipython>=6.1.0->ipywidgets) (1.1.1)
Requirement already satisfied: jedi>=0.16 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
ipython>=6.1.0->ipywidgets) (0.19.2)
Requirement already satisfied: matplotlib-inline in
/home/hadoop/py311env/lib/python3.11/site-packages (from
ipython>=6.1.0->ipywidgets) (0.1.7)
Requirement already satisfied: pexpect>4.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
ipython>=6.1.0->ipywidgets) (4.9.0)
Requirement already satisfied: prompt_toolkit<3.1.0,>=3.0.41 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
ipython>=6.1.0->ipywidgets) (3.0.51)
Requirement already satisfied: pygments>=2.4.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
ipython>=6.1.0->ipywidgets) (2.19.1)
Requirement already satisfied: stack data in
/home/hadoop/py311env/lib/python3.11/site-packages (from
ipython>=6.1.0->ipywidgets) (0.6.3)
Requirement already satisfied: typing_extensions>=4.6 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
ipython >= 6.1.0 - ipywidgets) (4.13.2)
Requirement already satisfied: wcwidth in
/home/hadoop/py311env/lib/python3.11/site-packages (from
prompt_toolkit<3.1.0,>=3.0.41->ipython>=6.1.0->ipywidgets) (0.2.13)
Requirement already satisfied: parso<0.9.0,>=0.8.4 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
jedi>=0.16->ipython>=6.1.0->ipywidgets) (0.8.4)
Requirement already satisfied: ptyprocess>=0.5 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
```

```
pexpect>4.3->ipython>=6.1.0->ipywidgets) (0.7.0)
Requirement already satisfied: debugpy>=1.6.5 in
/home/hadoop/py311env/lib/python3.11/site-packages (from ipykernel->jupyter)
(1.8.14)
Requirement already satisfied: jupyter-client>=6.1.12 in
/home/hadoop/py311env/lib/python3.11/site-packages (from ipykernel->jupyter)
Requirement already satisfied: jupyter-core!=5.0.*,>=4.12 in
/home/hadoop/py311env/lib/python3.11/site-packages (from ipykernel->jupyter)
(5.8.1)
Requirement already satisfied: nest-asyncio in
/home/hadoop/py311env/lib/python3.11/site-packages (from ipykernel->jupyter)
(1.6.0)
Requirement already satisfied: packaging in
/home/hadoop/py311env/lib/python3.11/site-packages (from ipykernel->jupyter)
(25.0)
Requirement already satisfied: psutil in
/home/hadoop/py311env/lib/python3.11/site-packages (from ipykernel->jupyter)
(7.0.0)
Requirement already satisfied: pyzmq>=24 in
/home/hadoop/py311env/lib/python3.11/site-packages (from ipykernel->jupyter)
(26.4.0)
Requirement already satisfied: tornado>=6.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from ipykernel->jupyter)
(6.5.1)
Requirement already satisfied: python-dateutil>=2.8.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
client>=6.1.12->ipykernel->jupyter) (2.9.0.post0)
Requirement already satisfied: platformdirs>=2.5 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
core!=5.0.*,>=4.12->ipykernel->jupyter) (4.3.8)
Requirement already satisfied: six>=1.5 in
/home/hadoop/py311env/lib/python3.11/site-packages (from python-
dateutil>=2.8.2->jupyter-client>=6.1.12->ipykernel->jupyter) (1.17.0)
Requirement already satisfied: async-lru>=1.0.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyterlab->jupyter)
Requirement already satisfied: httpx>=0.25.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyterlab->jupyter)
(0.28.1)
Requirement already satisfied: jinja2>=3.0.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyterlab->jupyter)
Requirement already satisfied: jupyter-lsp>=2.0.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyterlab->jupyter)
Requirement already satisfied: jupyter-server<3,>=2.4.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyterlab->jupyter)
```

```
(2.16.0)
Requirement already satisfied: jupyterlab-server<3,>=2.27.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyterlab->jupyter)
(2.27.3)
Requirement already satisfied: notebook-shim>=0.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyterlab->jupyter)
Requirement already satisfied: setuptools>=41.1.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyterlab->jupyter)
(65.5.0)
Requirement already satisfied: anyio>=3.1.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (4.9.0)
Requirement already satisfied: argon2-cffi>=21.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (23.1.0)
Requirement already satisfied: jupyter-events>=0.11.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (0.12.0)
Requirement already satisfied: jupyter-server-terminals>=0.4.4 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (0.5.3)
Requirement already satisfied: nbformat>=5.3.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (5.10.4)
Requirement already satisfied: overrides>=5.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (7.7.0)
Requirement already satisfied: prometheus-client>=0.9 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (0.22.0)
Requirement already satisfied: send2trash>=1.8.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (1.8.3)
Requirement already satisfied: terminado>=0.8.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (0.18.1)
Requirement already satisfied: websocket-client>=1.7 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (1.8.0)
Requirement already satisfied: babel>=2.10 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyterlab-
server<3,>=2.27.1->jupyterlab->jupyter) (2.17.0)
Requirement already satisfied: json5>=0.9.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyterlab-
server<3,>=2.27.1->jupyterlab->jupyter) (0.12.0)
Requirement already satisfied: jsonschema>=4.18.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyterlab-
```

```
server<3,>=2.27.1->jupyterlab->jupyter) (4.24.0)
Requirement already satisfied: requests>=2.31 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyterlab-
server<3,>=2.27.1->jupyterlab->jupyter) (2.32.3)
Requirement already satisfied: idna>=2.8 in
/home/hadoop/py311env/lib/python3.11/site-packages (from anyio>=3.1.0->jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (3.10)
Requirement already satisfied: sniffio>=1.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from anyio>=3.1.0->jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (1.3.1)
Requirement already satisfied: argon2-cffi-bindings in
/home/hadoop/py311env/lib/python3.11/site-packages (from
argon2-cffi>=21.1->jupyter-server<3,>=2.4.0->jupyterlab->jupyter) (21.2.0)
Requirement already satisfied: certifi in
/home/hadoop/py311env/lib/python3.11/site-packages (from
httpx>=0.25.0->jupyterlab->jupyter) (2025.4.26)
Requirement already satisfied: httpcore==1.* in
/home/hadoop/py311env/lib/python3.11/site-packages (from
httpx>=0.25.0->jupyterlab->jupyter) (1.0.9)
Requirement already satisfied: h11>=0.16 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
httpcore==1.*->httpx>=0.25.0->jupyterlab->jupyter) (0.16.0)
Requirement already satisfied: MarkupSafe>=2.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
jinja2>=3.0.3->jupyterlab->jupyter) (3.0.2)
Requirement already satisfied: attrs>=22.2.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
jsonschema>=4.18.0->jupyterlab-server<3,>=2.27.1->jupyterlab->jupyter) (25.3.0)
Requirement already satisfied: jsonschema-specifications>=2023.03.6 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
jsonschema>=4.18.0->jupyterlab-server<3,>=2.27.1->jupyterlab->jupyter)
(2025.4.1)
Requirement already satisfied: referencing>=0.28.4 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
jsonschema>=4.18.0->jupyterlab-server<3,>=2.27.1->jupyterlab->jupyter) (0.36.2)
Requirement already satisfied: rpds-py>=0.7.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
jsonschema>=4.18.0->jupyterlab-server<3,>=2.27.1->jupyterlab->jupyter) (0.25.1)
Requirement already satisfied: python-json-logger>=2.0.4 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
events>=0.11.0->jupyter-server<3,>=2.4.0->jupyterlab->jupyter) (3.3.0)
Requirement already satisfied: pyyaml>=5.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
events>=0.11.0->jupyter-server<3,>=2.4.0->jupyterlab->jupyter) (6.0.2)
Requirement already satisfied: rfc3339-validator in
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
events>=0.11.0->jupyter-server<3,>=2.4.0->jupyterlab->jupyter) (0.1.4)
Requirement already satisfied: rfc3986-validator>=0.1.1 in
```

```
/home/hadoop/py311env/lib/python3.11/site-packages (from jupyter-
events>=0.11.0->jupyter-server<3,>=2.4.0->jupyterlab->jupyter) (0.1.1)
Requirement already satisfied: fqdn in
/home/hadoop/py311env/lib/python3.11/site-packages (from jsonschema[format-
nongpl]>=4.18.0->jupyter-events>=0.11.0->jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (1.5.1)
Requirement already satisfied: isoduration in
/home/hadoop/py311env/lib/python3.11/site-packages (from jsonschema[format-
nongpl]>=4.18.0->jupyter-events>=0.11.0->jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (20.11.0)
Requirement already satisfied: jsonpointer>1.13 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jsonschema[format-
nongpl]>=4.18.0->jupyter-events>=0.11.0->jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (3.0.0)
Requirement already satisfied: uri-template in
/home/hadoop/py311env/lib/python3.11/site-packages (from jsonschema[format-
nongpl]>=4.18.0->jupyter-events>=0.11.0->jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (1.3.0)
Requirement already satisfied: webcolors>=24.6.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from jsonschema[format-
nongpl]>=4.18.0->jupyter-events>=0.11.0->jupyter-
server<3,>=2.4.0->jupyterlab->jupyter) (24.11.1)
Requirement already satisfied: beautifulsoup4 in
/home/hadoop/py311env/lib/python3.11/site-packages (from nbconvert->jupyter)
(4.13.4)
Requirement already satisfied: bleach!=5.0.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
bleach[css]!=5.0.0->nbconvert->jupyter) (6.2.0)
Requirement already satisfied: defusedxml in
/home/hadoop/py311env/lib/python3.11/site-packages (from nbconvert->jupyter)
(0.7.1)
Requirement already satisfied: jupyterlab-pygments in
/home/hadoop/py311env/lib/python3.11/site-packages (from nbconvert->jupyter)
(0.3.0)
Requirement already satisfied: mistune<4,>=2.0.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from nbconvert->jupyter)
Requirement already satisfied: nbclient>=0.5.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from nbconvert->jupyter)
Requirement already satisfied: pandocfilters>=1.4.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from nbconvert->jupyter)
Requirement already satisfied: webencodings in
/home/hadoop/py311env/lib/python3.11/site-packages (from
bleach!=5.0.0->bleach[css]!=5.0.0->nbconvert->jupyter) (0.5.1)
Requirement already satisfied: tinycss2<1.5,>=1.1.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
```

```
bleach[css]!=5.0.0->nbconvert->jupyter) (1.4.0)
    Requirement already satisfied: fastjsonschema>=2.15 in
    /home/hadoop/py311env/lib/python3.11/site-packages (from
    nbformat>=5.3.0->jupyter-server<3,>=2.4.0->jupyterlab->jupyter) (2.21.1)
    Requirement already satisfied: charset-normalizer<4,>=2 in
    /home/hadoop/py311env/lib/python3.11/site-packages (from
    requests>=2.31->jupyterlab-server<3,>=2.27.1->jupyterlab->jupyter) (3.4.2)
    Requirement already satisfied: urllib3<3,>=1.21.1 in
    /home/hadoop/py311env/lib/python3.11/site-packages (from
    requests>=2.31->jupyterlab-server<3,>=2.27.1->jupyterlab->jupyter) (2.4.0)
    Requirement already satisfied: cffi>=1.0.1 in
    /home/hadoop/py311env/lib/python3.11/site-packages (from argon2-cffi-
    bindings->argon2-cffi>=21.1->jupyter-server<3,>=2.4.0->jupyterlab->jupyter)
    (1.17.1)
    Requirement already satisfied: pycparser in
    /home/hadoop/py311env/lib/python3.11/site-packages (from
    cffi>=1.0.1->argon2-cffi-bindings->argon2-cffi>=21.1->jupyter-
    server<3,>=2.4.0->jupyterlab->jupyter) (2.22)
    Requirement already satisfied: soupsieve>1.2 in
    /home/hadoop/py311env/lib/python3.11/site-packages (from
    beautifulsoup4->nbconvert->jupyter) (2.7)
    Requirement already satisfied: arrow>=0.15.0 in
    /home/hadoop/py311env/lib/python3.11/site-packages (from
    isoduration->jsonschema[format-nongpl]>=4.18.0->jupyter-events>=0.11.0->jupyter-
    server<3,>=2.4.0->jupyterlab->jupyter) (1.3.0)
    Requirement already satisfied: types-python-dateutil>=2.8.10 in
    /home/hadoop/py311env/lib/python3.11/site-packages (from
    arrow>=0.15.0->isoduration->jsonschema[format-nongpl]>=4.18.0->jupyter-
    events>=0.11.0->jupyter-server<3,>=2.4.0->jupyterlab->jupyter) (2.9.0.20250516)
    Requirement already satisfied: executing>=1.2.0 in
    /home/hadoop/py311env/lib/python3.11/site-packages (from
    stack_data->ipython>=6.1.0->ipywidgets) (2.2.0)
    Requirement already satisfied: asttokens>=2.1.0 in
    /home/hadoop/py311env/lib/python3.11/site-packages (from
    stack data->ipython>=6.1.0->ipywidgets) (3.0.0)
    Requirement already satisfied: pure-eval in
    /home/hadoop/py311env/lib/python3.11/site-packages (from
    stack_data->ipython>=6.1.0->ipywidgets) (0.2.3)
    Note: you may need to restart the kernel to use updated packages.
[5]: !jupyter nbextension enable --py widgetsnbextension
    usage: jupyter [-h] [--version] [--config-dir] [--data-dir] [--runtime-dir]
                   [--paths] [--json] [--debug]
```

Jupyter: Interactive Computing

[subcommand]

```
positional arguments:
  subcommand
                the subcommand to launch
options:
 -h, --help
                show this help message and exit
  --version
                 show the versions of core jupyter packages and exit
 --config-dir show Jupyter config dir
  --data-dir
                show Jupyter data dir
  --runtime-dir show Jupyter runtime dir
                 show all Jupyter paths. Add -- json for machine-readable
 --paths
                 format.
                 output paths as machine-readable json
  --json
                 output debug information about paths
  --debug
```

Available subcommands: console dejavu events execute kernel kernelspec lab labextension labhub migrate nbconvert notebook run server troubleshoot trust

Jupyter command `jupyter-nbextension` not found.

```
[6]: import sys print(sys.executable)
```

/home/hadoop/py311env/bin/python

```
[7]: import os
    os.environ["JAVA_HOME"] = "/usr/lib/jvm/java-11-openjdk-amd64"
    os.environ["SPARK_HOME"] = "/opt/spark/spark-3.5.6-bin-hadoop3"
    os.environ["HADOOP_HOME"] = "/usr/local/hadoop"
    os.environ["TF_USE_LEGACY_KERAS"] = "1"
```

```
[8]: import findspark findspark.init() import pyspark
```

```
[9]: #Import necessary libraries
import pandas as pd  # Pandas is an open source, BSD-licensed library

providing high-performance, easy-to-use data structures and data analysis

tools for the Python programming language. Pandas Series is a

one-dimensional labeled array capable of holding any data type with axis

import geopandas as gpd
import time
import numpy as np
import logging
import hashlib
from geopy.geocoders import Nominatim
```

```
from geopy.extra.rate_limiter import RateLimiter
      from pyspark.sql import functions as func
      from pyspark.sql.types import IntegerType, StringType, FloatType, __
       →TimestampType, BinaryType
      from pyspark.sql.functions import col, count, when, mean, stddev, abs, sum, u
       ⇔row number
      from pyspark.ml.feature import VectorAssembler, StandardScaler, StringIndexer,
       →OneHotEncoder
      from pyspark.ml import Pipeline
      from pyspark.ml.classification import RandomForestClassifier
      from pyspark.ml.tuning import CrossValidator, ParamGridBuilder
      from pyspark.ml.evaluation import MulticlassClassificationEvaluator,
       →BinaryClassificationEvaluator
      from sklearn.metrics import precision_recall_curve
      from pyspark.sql import Window
      from transformers import pipeline, AutoTokenizer, u
       \hookrightarrow AutoModelForSequenceClassification
      from shapely.geometry import Point
      import torch
[10]: import nltk
      nltk.download('punkt')
                              # Download NLTK essential resources
      !python -m spacy download en_core_web_sm
                                                  # Download spaCy Language Model
     [nltk_data] Downloading package punkt to /home/hadoop/nltk_data...
                   Package punkt is already up-to-date!
     [nltk data]
     Collecting en-core-web-sm==3.8.0
       Downloading https://github.com/explosion/spacy-
     models/releases/download/en_core_web_sm-3.8.0/en_core_web_sm-3.8.0-py3-none-
     any.whl (12.8 MB)
                                 12.8/12.8 MB
     36.1 MB/s eta 0:00:00 0:00:01
       Download and installation successful
     You can now load the package via spacy.load('en_core_web_sm')
[11]: import nltk
      nltk.download('punkt_tab')
     [nltk data] Downloading package punkt_tab to /home/hadoop/nltk_data...
     [nltk_data]
                   Package punkt_tab is already up-to-date!
[11]: True
[12]: # Test NLTK installation
      from nltk.tokenize import word tokenize
      text = "Hello, world!"
```

```
tokens = word_tokenize(text)
      print(tokens)
     ['Hello', ',', 'world', '!']
[13]: import spacy
      try:
          nlp = spacy.load("en_core_web_sm")
      except OSError:
          from spacy.cli import download
          download("en_core_web_sm")
          nlp = spacy.load("en_core_web_sm")
      # Test spaCy installation
      doc = nlp("Hello, world!")
      print([token.text for token in doc])
     ['Hello', ',', 'world', '!']
[14]: # Start SparkSession
      from pyspark.sql import SparkSession
      spark=SparkSession.builder.appName("Sudan Crisis Analysis").config("spark.")
       odriver.memory", "4g").getOrCreate()
      spark
     25/07/07 17:34:21 WARN Utils: Your hostname, julius-virtual-machine resolves to
     a loopback address: 127.0.1.1; using 192.168.145.130 instead (on interface
     ens33)
     25/07/07 17:34:21 WARN Utils: Set SPARK_LOCAL_IP if you need to bind to another
     address
     Setting default log level to "WARN".
     To adjust logging level use sc.setLogLevel(newLevel). For SparkR, use
     setLogLevel(newLevel).
     25/07/07 17:34:22 WARN NativeCodeLoader: Unable to load native-hadoop library
     for your platform... using builtin-java classes where applicable
[14]: <pyspark.sql.session.SparkSession at 0x710b0870abd0>
[15]: #Load the data and handle missing values
      df_pyspark = spark.read.csv("Sudan_Twitter_Data_June_2025latlong.csv", __
       ⇔header=True, inferSchema=True).cache()
      df_pyspark.show(5)
     25/07/07 17:34:30 WARN SparkStringUtils: Truncated the string representation of
     a plan since it was too large. This behavior can be adjusted by setting
     'spark.sql.debug.maxToStringFields'.
     [Stage 2:=======>
                                                                          (1 + 2) / 3
```

```
+-----
____+___
  +-----
_____+
          userId
                   userName
                                       profilePicture|
userCreatedAtl
bio|followers|following|lists|statusesCount|verified|userLocation|lang|
          createdAt|
                         mentions|totalRetweets|favorites|replies|1
inks|firstLink|images|impressions|isImage|firstImage| location|
url|noteTweetText|inReplyTo|inReplyToId|inReplyToUserId|reportName|
Longitude |
____+___
______
_____+
11.93E+18|2.43752092E8|
                  Damascene
nanssolo|https://pbs.twimg...|2011-01-27T18:51:...|Syrian* blunt and...|
941 l
      754 l
            2|
                  182403
                        FALSE|
                                  NULL | en|retweet|RT
@BSonblast: Pl...|2025-06-17T03:32:...| "[""@bsonblast""]"|
                    [] [
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        [] [
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                                       NULL | Abyei
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|1.93E+18|
         1.45E18
                  nana nano|
hydrowanter|https://pbs.twimg...|2021-10-05T06:07:...|she/her | Indones...|
                  37124|
            1|
                        FALSE
                                  NULL | en|retweet|RT
@BSonblast: Pl...|2025-06-17T03:31:...|
                        "[""@bsonblast""]"|
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PCA|https://x.com/use...|
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         1.06E18|
                  bean |
Charlixxx | https://pbs.twimg... | 2018-11-13T12:11:... | pan pirate ... |
152 l
      327 l
            01
                  35414
                        FALSE|
                                  NULL|
                                      en|retweet|RT
@BSonblast: Pl...|2025-06-17T03:30:...| "[""@bsonblast""]"|
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PCA|https://x.com/use...|
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|1.93E+18|
         7.16E17|
                  Pastel
21
                  36040|
                        FALSE
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      554
@blkdesertfair...|2025-06-17T03:30:...|"[""@blkdesertfai...|
     01
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                    []
                            O| FALSE|
                                       NULL | Abyei
PCA|https://x.com/use...|
                     NULL
                           FALSE
                                    NULL
                                              NULL
NULL | 9.594021206 | 28.43772416 |
|1.93E+18|
         1.21E18| ui |
```

```
02A4D3|https://pbs.twimg...|2019-12-22T17:21:...|
                                                   NULL
    2041
                                   NULL| en|retweet|RT @BSonblast:
          01
                   2549|
                         FALSE
    Pl...|2025-06-17T03:29:...| "[""@bsonblast""]"|
                                               01
                                                       01
                                                             01
    []
          NULLI
                 [] [
                           O| FALSE|
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                            NULLI
    PCA | https://x.com/use... |
                                   FALSE
                                             NULLI
                                                          NULL
    NULL | 9.594021206 | 28.43772416 |
    ____+____
    ______
    +----+
    _____+
    only showing top 5 rows
[16]: # Convert PySpark DataFrame to Pandas
    filtered_df_pandas = df_pyspark.toPandas()
[17]: # Configure logging
    logging.basicConfig(level=logging.INFO, format='%(asctime)s - %(levelname)s -

√%(message)s')
    BOT\_THRESHOLD = 0.5
    MEDIA\_THRESHOLD = 0.7
    def process_tweets(scraped_tweets):
       filtered_tweets = []
       total = 0
       skipped_bot = 0
       skipped_media = 0
       for tweet in scraped_tweets:
          total += 1
          try:
              # Bot detection step
              bot_score = bot_detection_model(tweet.user_metadata, tweet.text)
              if bot score > BOT THRESHOLD:
                 skipped_bot += 1
                 logging.info(f"Skipped tweet {tweet.id} due to high bot score:
     continue
              # Media verification step (if media present)
              if tweet.has_media:
                 media_credibility = verify_media(tweet.media_url)
                 if media_credibility < MEDIA_THRESHOLD:</pre>
```

```
skipped_media += 1
                          logging.info(f"Skipped tweet {tweet.id} due to low media__

→credibility: {media_credibility}")
                          continue
                  # Passed both checks
                  filtered tweets.append(tweet)
                  logging.info(f"Accepted tweet {tweet.id} for further processing")
              except Exception as e:
                  logging.error(f"Error processing tweet {tweet.id}: {e}")
                  continue
          logging.info(f"Processed {total} tweets: {len(filtered_tweets)} accepted, __

¬{skipped_bot} skipped (bot), {skipped_media} skipped (media)")

          return filtered_tweets
[18]: print(filtered_df_pandas[['Latitude', 'Longitude']].head(100))
                        Longitude
            Latitude
         9.594021206 28.43772416
     0
         9.594021206 28.43772416
     1
       9.594021206 28.43772416
        9.594021206 28.43772416
     4 9.594021206 28.43772416
     95 9.594021206 28.43772416
     96 9.594021206 28.43772416
     97 9.594021206 28.43772416
     98 9.594021206 28.43772416
     99 9.594021206 28.43772416
     [100 rows x 2 columns]
[19]: import pandas as pd
      filtered_df_pandas['Longitude'] = pd.

    do_numeric(filtered_df_pandas['Longitude'], errors='coerce')

      filtered_df_pandas['Latitude'] = pd.to_numeric(filtered_df_pandas['Latitude'],__
       ⇔errors='coerce')
[20]: # Load Sudan states boundaries to create geolocation filtering pipeline
      states_gdf = gpd.read_file('sudan_states.geojson')
[21]: # Create GeoDataFrame from filtered tweets
      from shapely.geometry import Point
```

```
geometry = [Point(xy) for xy in zip(filtered_df_pandas['Longitude'], __

¬filtered_df_pandas['Latitude'])]
      tweets_gdf = gpd.GeoDataFrame(filtered_df_pandas, geometry=geometry, crs='EPSG:
       [22]: print(states_gdf.columns)
     Index(['Shape_Leng', 'Shape_Area', 'ADM1_EN', 'ADM1_AR', 'ADM1_PCODE',
            'ADM1 REF', 'ADM1ALT1EN', 'ADM1ALT2EN', 'ADM1ALT1AR', 'ADM1ALT2AR',
            'ADMO_EN', 'ADMO_AR', 'ADMO_PCODE', 'date', 'validOn', 'Incidents',
            'geometry'],
           dtype='object')
[23]: print('index_right' in tweets_gdf.columns)
      print('index_right' in states_gdf.columns)
     False
     False
[24]: if 'index_right' in tweets_gdf.columns:
          tweets_gdf = tweets_gdf.drop(columns=['index_right'])
[25]: # Spatial join to assign state to each tweet
      tweets_gdf = gpd.sjoin(
          tweets_gdf,
          states_gdf[['ADM1_EN', 'geometry']],
          how='left',
          predicate='within'
      # Rename the column for clarity
      tweets_gdf.rename(columns={'ADM1_EN': 'state'}, inplace=True)
      # Check results
      print(tweets_gdf[['state', 'geometry']].head())
            state
                                   geometry
     O Abyei PCA POINT (28.43772 9.59402)
     1 Abyei PCA POINT (28.43772 9.59402)
     2 Abyei PCA POINT (28.43772 9.59402)
     3 Abyei PCA POINT (28.43772 9.59402)
     4 Abyei PCA POINT (28.43772 9.59402)
[26]: from collections import Counter
      col_counts = Counter(tweets_gdf.columns)
      duplicates = [col for col, count in col_counts.items() if count > 1]
```

```
print("Duplicate columns:", duplicates)
     Duplicate columns: []
[27]: tweets_gdf = tweets_gdf.loc[:, ~tweets_gdf.columns.duplicated()]
[28]: print(tweets_gdf.index.is_unique)
     True
[29]:
     tweets_gdf.index = pd.RangeIndex(start=0, stop=len(tweets_gdf), step=1)
[30]: # Remove points with empty or invalid geometries and missing states
      tweets_gdf_filtered = tweets_gdf[
          (~tweets_gdf.geometry.is_empty) &
          (tweets_gdf.geometry.is_valid) &
          (tweets_gdf['state'].notna())
      ].copy()
      print(tweets_gdf_filtered[['state', 'geometry']].head())
            state
                                   geometry
     O Abyei PCA POINT (28.43772 9.59402)
     1 Abyei PCA POINT (28.43772 9.59402)
     2 Abyei PCA POINT (28.43772 9.59402)
     3 Abyei PCA POINT (28.43772 9.59402)
     4 Abyei PCA POINT (28.43772 9.59402)
[31]: print(tweets_gdf_filtered.head(10))
                                                   userName
                                                                       alias \
             _id
                        userId
       1.93E+18 2.437521e+08
                                                  Damascene
                                                                    nanssolo
                                                  nana nano
     1 1.93E+18 1.450000e+18
                                                                 hydrowanter
     2 1.93E+18 1.060000e+18
                                                   bean
                                                               Charlixxx_
     3 1.93E+18 7.160000e+17
                                                   Pastel
                                                              soIguessIexist
                                                                   02A4D3
     4 1.93E+18 1.210000e+18
                                                    иi
     5 1.93E+18 5.523299e+08
                                                        TGD
                                                             GrandFilmMaster
     6 1.93E+18 7.060000e+17
                                                WIP I Guess
                                                                    ctdjgurl
                                                   SGUY2004
                                                                   SGUY20044
     7 1.93E+18 1.930000e+18
     8 1.93E+18 1.540000e+18
                                                                 us3rsnam3
     9 1.93E+18 1.616353e+09 Superstar Christie In A Box
                                                                butt um liam
                                           profilePicture \
     0 https://pbs.twimg.com/profile_images/173403408...
     1 https://pbs.twimg.com/profile_images/189138425...
     2 https://pbs.twimg.com/profile_images/145558722...
     3 https://pbs.twimg.com/profile_images/153254988...
     4 https://pbs.twimg.com/profile_images/190776009...
```

```
5 https://pbs.twimg.com/profile_images/316694971...
6 https://pbs.twimg.com/profile_images/185726903...
7 https://pbs.twimg.com/profile_images/192635389...
8 https://pbs.twimg.com/profile_images/181146951...
  https://pbs.twimg.com/profile_images/175423406...
              userCreatedAt
   2011-01-27T18:51:26.000Z
   2021-10-05T06:07:55.000Z
1
  2018-11-13T12:11:55.000Z
3
  2016-04-01T01:12:51.000Z
 2019-12-22T17:21:09.000Z
5
  2012-04-13T01:40:29.000Z
  2016-03-04T15:19:36.000Z
  2025-05-24T17:45:01.000Z
  2022-06-16T15:28:37.000Z
  2013-07-23T23:38:46.000Z
                                                    bio followers following \
   Syrian* blunt and very loud*Regrettably an att...
                                                            941
                                                                       754
   she/her | Indonesia
                          | 24 | Aroace | Hoyo ga...
                                                           156
                                                                       46
                                 pan
                                       pirate go brr
                                                            152
                                                                       327
3
   24 | black | nonbinary lesbian | she/they | Ar...
                                                            488
                                                                       554
4
                                                               14
                                                                         204
5
                           28BlackHe/HimI do whatever
                                                              219
                                                                        2277
   I love my Black People. Not your mule or negro...
                                                            397
6
                                                                       584
7
   Fourth time making a Twitter account GOD PLEAS...
                                                            216
                                                                       954
8
                         old username: bratzondablock
                                                             1290
                                                                        1076
9
                      (not so) Clever musings.she/her
                                                              271
                                                                         347
         ... noteTweetText inReplyTo inReplyToId inReplyToUserId reportName
  lists
0
      2
                     None
                              FALSE
                                            None
                                                             None
                                                                         None
         •••
1
      1
                     None
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2
      0
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      2
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4
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5
      6
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6
      0
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7
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9
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                                            None
                                                                         None
   Latitude
             Longitude
                                          geometry index_right
                                                                      state
  9.594021
             28.437724
                         POINT (28.43772 9.59402)
                                                                 Abyei PCA
  9.594021
             28.437724
                         POINT (28.43772 9.59402)
                                                            0.0
                                                                 Abyei PCA
 9.594021
             28.437724
                         POINT (28.43772 9.59402)
                                                            0.0
                                                                 Abyei PCA
3
  9.594021
             28.437724
                         POINT (28.43772 9.59402)
                                                            0.0
                                                                 Abyei PCA
 9.594021
             28.437724
                         POINT (28.43772 9.59402)
                                                                 Abyei PCA
```

0.0

```
5 9.594021 28.437724 POINT (28.43772 9.59402)
                                                              0.0 Abyei PCA
     6 9.594021 28.437724 POINT (28.43772 9.59402)
                                                              0.0 Abyei PCA
     7 9.594021 28.437724 POINT (28.43772 9.59402)
                                                              0.0 Abyei PCA
     8 9.594021 28.437724 POINT (28.43772 9.59402)
                                                              0.0 Abyei PCA
     9 9.594021 28.437724 POINT (28.43772 9.59402)
                                                              0.0 Abyei PCA
     [10 rows x 39 columns]
[32]: tweets gdf['content type'] = (
          (tweets_gdf['isImage'].astype(str).str.lower() == 'true') &
         tweets_gdf['firstImage'].notnull()
      ).map({True: 'image', False: 'text'})
 []:
 []:
[33]: # Use transformers model that supports Arabic sentiment analysis
      sentiment pipeline = pipeline(
          "sentiment-analysis",
         model="CAMeL-Lab/bert-base-arabic-camelbert-da-sentiment"
      )
      def arabic_sentiment_analysis(text):
         if not isinstance(text, str) or not text.strip():
              return "neutral" # or any default label you prefer
         result = sentiment_pipeline(text)
         return result[0]['label']
     Device set to use cpu
[34]: print(sentiment_pipeline("
                                       !"))
     [{'label': 'positive', 'score': 0.9809406399726868}]
[35]: # Sentiment analysis (pseudo-code)
      tweets_gdf['sentiment'] = tweets_gdf['text'].apply(arabic_sentiment_analysis)
[36]: print(tweets_gdf.columns.tolist())
     ['_id', 'userId', 'userName', 'alias', 'profilePicture', 'userCreatedAt', 'bio',
     'followers', 'following', 'lists', 'statusesCount', 'verified', 'userLocation',
     'lang', 'type', 'text', 'createdAt', 'mentions', 'totalRetweets', 'favorites',
     'replies', 'links', 'firstLink', 'images', 'impressions', 'isImage',
     'firstImage', 'location', 'url', 'noteTweetText', 'inReplyTo', 'inReplyToId',
     'inReplyToUserId', 'reportName', 'Latitude', 'Longitude', 'geometry',
     'index_right', 'state', 'content_type', 'sentiment']
```

```
[]:
[37]: %pip install --upgrade transformers "accelerate>=0.26.0"
     huggingface/tokenizers: The current process just got forked, after parallelism
     has already been used. Disabling parallelism to avoid deadlocks...
     To disable this warning, you can either:
             - Avoid using `tokenizers` before the fork if possible
             - Explicitly set the environment variable TOKENIZERS_PARALLELISM=(true |
     false)
     IOStream.flush timed out
     Requirement already satisfied: transformers in
     /home/hadoop/py311env/lib/python3.11/site-packages (4.53.1)
     Requirement already satisfied: accelerate>=0.26.0 in
     /home/hadoop/py311env/lib/python3.11/site-packages (1.8.1)
     Requirement already satisfied: filelock in
     /home/hadoop/py311env/lib/python3.11/site-packages (from transformers) (3.18.0)
     Requirement already satisfied: huggingface-hub<1.0,>=0.30.0 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from transformers) (0.32.3)
     Requirement already satisfied: numpy>=1.17 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from transformers) (1.26.4)
     Requirement already satisfied: packaging>=20.0 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from transformers) (25.0)
     Requirement already satisfied: pyyaml>=5.1 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from transformers) (6.0.2)
     Requirement already satisfied: regex!=2019.12.17 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from transformers)
     (2024.11.6)
     Requirement already satisfied: requests in
     /home/hadoop/py311env/lib/python3.11/site-packages (from transformers) (2.32.3)
     Requirement already satisfied: tokenizers<0.22,>=0.21 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from transformers) (0.21.1)
     Requirement already satisfied: safetensors>=0.4.3 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from transformers) (0.5.3)
     Requirement already satisfied: tqdm>=4.27 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from transformers) (4.67.1)
     Requirement already satisfied: fsspec>=2023.5.0 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from huggingface-
     hub<1.0,>=0.30.0->transformers) (2025.3.0)
     Requirement already satisfied: typing-extensions>=3.7.4.3 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from huggingface-
     hub<1.0,>=0.30.0->transformers) (4.13.2)
     Requirement already satisfied: hf-xet<2.0.0,>=1.1.2 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from huggingface-
     hub<1.0,>=0.30.0->transformers) (1.1.2)
     Requirement already satisfied: psutil in
```

/home/hadoop/py311env/lib/python3.11/site-packages (from accelerate>=0.26.0)

```
(7.0.0)
Requirement already satisfied: torch>=2.0.0 in
/home/hadoop/py311env/lib/python3.11/site-packages (from accelerate>=0.26.0)
(2.7.0)
Requirement already satisfied: sympy>=1.13.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
torch>=2.0.0->accelerate>=0.26.0) (1.14.0)
Requirement already satisfied: networkx in
/home/hadoop/py311env/lib/python3.11/site-packages (from
torch>=2.0.0->accelerate>=0.26.0) (3.5)
Requirement already satisfied: jinja2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
torch>=2.0.0->accelerate>=0.26.0) (3.1.6)
Requirement already satisfied: nvidia-cuda-nvrtc-cu12==12.6.77 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
torch>=2.0.0->accelerate>=0.26.0) (12.6.77)
Requirement already satisfied: nvidia-cuda-runtime-cu12==12.6.77 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
torch>=2.0.0->accelerate>=0.26.0) (12.6.77)
Requirement already satisfied: nvidia-cuda-cupti-cu12==12.6.80 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
torch>=2.0.0->accelerate>=0.26.0) (12.6.80)
Requirement already satisfied: nvidia-cudnn-cu12==9.5.1.17 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
torch>=2.0.0->accelerate>=0.26.0) (9.5.1.17)
Requirement already satisfied: nvidia-cublas-cu12==12.6.4.1 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
torch>=2.0.0->accelerate>=0.26.0) (12.6.4.1)
Requirement already satisfied: nvidia-cufft-cu12==11.3.0.4 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
torch>=2.0.0->accelerate>=0.26.0) (11.3.0.4)
Requirement already satisfied: nvidia-curand-cu12==10.3.7.77 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
torch>=2.0.0->accelerate>=0.26.0) (10.3.7.77)
Requirement already satisfied: nvidia-cusolver-cu12==11.7.1.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
torch>=2.0.0->accelerate>=0.26.0) (11.7.1.2)
Requirement already satisfied: nvidia-cusparse-cu12==12.5.4.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
torch>=2.0.0->accelerate>=0.26.0) (12.5.4.2)
Requirement already satisfied: nvidia-cusparselt-cu12==0.6.3 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
torch>=2.0.0->accelerate>=0.26.0) (0.6.3)
Requirement already satisfied: nvidia-nccl-cu12==2.26.2 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
torch>=2.0.0->accelerate>=0.26.0) (2.26.2)
Requirement already satisfied: nvidia-nvtx-cu12==12.6.77 in
/home/hadoop/py311env/lib/python3.11/site-packages (from
```

```
torch>=2.0.0->accelerate>=0.26.0) (12.6.77)
     Requirement already satisfied: nvidia-nvjitlink-cu12==12.6.85 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from
     torch>=2.0.0->accelerate>=0.26.0) (12.6.85)
     Requirement already satisfied: nvidia-cufile-cu12==1.11.1.6 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from
     torch>=2.0.0->accelerate>=0.26.0) (1.11.1.6)
     Requirement already satisfied: triton==3.3.0 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from
     torch>=2.0.0->accelerate>=0.26.0) (3.3.0)
     Requirement already satisfied: setuptools>=40.8.0 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from
     triton==3.3.0->torch>=2.0.0->accelerate>=0.26.0) (65.5.0)
     Requirement already satisfied: mpmath<1.4,>=1.1.0 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from
     sympy>=1.13.3->torch>=2.0.0->accelerate>=0.26.0) (1.3.0)
     Requirement already satisfied: MarkupSafe>=2.0 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from
     jinja2->torch>=2.0.0->accelerate>=0.26.0) (3.0.2)
     Requirement already satisfied: charset-normalizer<4,>=2 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from requests->transformers)
     (3.4.2)
     Requirement already satisfied: idna<4,>=2.5 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from requests->transformers)
     (3.10)
     Requirement already satisfied: urllib3<3,>=1.21.1 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from requests->transformers)
     (2.4.0)
     Requirement already satisfied: certifi>=2017.4.17 in
     /home/hadoop/py311env/lib/python3.11/site-packages (from requests->transformers)
     (2025.4.26)
     Note: you may need to restart the kernel to use updated packages.
[38]: import transformers
      print(transformers.__version__)
     4.53.1
[39]: import accelerate
      print(accelerate.__version__)
     1.8.1
[40]: | # Sentiment Analysis with RoBERTa (Hugging Face Transformers)
      import torch
      from transformers import RobertaTokenizer, RobertaForSequenceClassification,
       →Trainer, TrainingArguments
```

```
import evaluate
from sklearn.model_selection import train_test_split
import pandas as pd
import numpy as np
# --- 1. Data Preparation and Cleaning ---
# Remove rows with missing text or sentiment
tweets_gdf = tweets_gdf.dropna(subset=['text', 'sentiment'])
# Map sentiment labels to integers
label2id = {'negative': 0, 'neutral': 1, 'positive': 2}
id2label = {v: k for k, v in label2id.items()}
tweets_gdf['label'] = tweets_gdf['sentiment'].map(label2id)
# Remove rows where mapping failed (unmapped sentiment)
tweets_gdf = tweets_gdf.dropna(subset=['label'])
# Ensure text is string type
tweets_gdf['text'] = tweets_gdf['text'].astype(str)
# --- 2. Train-validation Split ---
train_texts, val_texts, train_labels, val_labels = train_test_split(
   tweets_gdf['text'].tolist(),
   tweets_gdf['label'].astype(int).tolist(),
   test_size=0.2,
   random_state=42
# --- 3. Load Tokenizer and Model ---
model_name = "syedkhalid076/RoBERTa-Sentimental-Analysis-v2"
tokenizer = RobertaTokenizer.from_pretrained(model_name)
model = RobertaForSequenceClassification.from_pretrained(
   model_name,
   num_labels=3,
   id2label=id2label,
   label2id=label2id
)
# --- 4. Tokenize Data ---
train_encodings = tokenizer(train_texts, truncation=True, padding=True, __
 →max length=128)
val_encodings = tokenizer(val_texts, truncation=True, padding=True,_
→max_length=128)
# --- 5. Prepare Dataset Objects ---
class TweetDataset(torch.utils.data.Dataset):
   def __init__(self, encodings, labels):
```

```
self.encodings = encodings
        self.labels = labels
    def __getitem__(self, idx):
        item = {k: torch.tensor(v[idx]) for k, v in self.encodings.items()}
        item['labels'] = torch.tensor(self.labels[idx])
        return item
    def __len__(self):
        return len(self.labels)
train_dataset = TweetDataset(train_encodings, train_labels)
val_dataset = TweetDataset(val_encodings, val_labels)
# --- 6. Define Trainer and Training Arguments ---
training_args = TrainingArguments(
    output_dir='./results',
    num_train_epochs=2,
    per_device_train_batch_size=8,
    per_device_eval_batch_size=8,
    eval_strategy="epoch",
    save_strategy="epoch",
    logging_dir='./logs',
    logging_steps=50,
    load_best_model_at_end=True,
    metric_for_best_model="accuracy"
)
metric = evaluate.load("accuracy")
def compute_metrics(eval_pred):
    logits, labels = eval_pred
    predictions = np.argmax(logits, axis=-1)
    return metric.compute(predictions=predictions, references=labels)
trainer = Trainer(
    model=model,
    args=training_args,
    train_dataset=train_dataset,
    eval_dataset=val_dataset,
    compute metrics=compute metrics,
    tokenizer=tokenizer
# --- 7. Train the Model ---
trainer.train()
# --- 8. Evaluate the Model ---
eval_results = trainer.evaluate()
```

```
2025-07-07 18:17:25,178 - INFO - PyTorch version 2.7.0 available.
2025-07-07 18:17:25,180 - INFO - TensorFlow version 2.15.0 available.
/tmp/ipykernel_6568/562764098.py:83: FutureWarning: `tokenizer` is deprecated
and will be removed in version 5.0.0 for `Trainer._init__`. Use
`processing_class` instead.
  trainer = Trainer(
2025-07-07 18:17:33,794 - INFO - Error while sending or receiving.
Traceback (most recent call last):
 File "/opt/spark/spark-3.5.6-bin-
hadoop3/python/lib/py4j-0.10.9.7-src.zip/py4j/clientserver.py", line 503, in
send command
    self.socket.sendall(command.encode("utf-8"))
ConnectionResetError: [Errno 104] Connection reset by peer
2025-07-07 18:17:33,797 - INFO - Closing down clientserver connection
2025-07-07 18:17:33,800 - INFO - Exception while sending command.
Traceback (most recent call last):
 File "/opt/spark/spark-3.5.6-bin-
hadoop3/python/lib/py4j-0.10.9.7-src.zip/py4j/clientserver.py", line 503, in
send command
    self.socket.sendall(command.encode("utf-8"))
ConnectionResetError: [Errno 104] Connection reset by peer
During handling of the above exception, another exception occurred:
Traceback (most recent call last):
 File "/opt/spark/spark-3.5.6-bin-
hadoop3/python/lib/py4j-0.10.9.7-src.zip/py4j/java_gateway.py", line 1038, in
send command
   response = connection.send_command(command)
 File "/opt/spark/spark-3.5.6-bin-
hadoop3/python/lib/py4j-0.10.9.7-src.zip/py4j/clientserver.py", line 506, in
send_command
   raise Py4JNetworkError(
py4j.protocol.Py4JNetworkError: Error while sending
/home/hadoop/py311env/lib/python3.11/site-
packages/torch/utils/data/dataloader.py:665: UserWarning: 'pin_memory' argument
is set as true but no accelerator is found, then device pinned memory won't be
used.
  warnings.warn(warn_msg)
2025-07-07 18:17:33,806 - INFO - Closing down clientserver connection
<IPython.core.display.HTML object>
/home/hadoop/py311env/lib/python3.11/site-
packages/torch/utils/data/dataloader.py:665: UserWarning: 'pin_memory' argument
```

print("Evaluation results:", eval_results)

```
used.
       warnings.warn(warn_msg)
     /home/hadoop/py311env/lib/python3.11/site-
     packages/torch/utils/data/dataloader.py:665: UserWarning: 'pin memory' argument
     is set as true but no accelerator is found, then device pinned memory won't be
     used.
       warnings.warn(warn_msg)
     <IPython.core.display.HTML object>
     Evaluation results: { 'eval_loss': 2.1457651655509835e-06, 'eval_accuracy': 1.0,
     'eval_runtime': 374.5909, 'eval_samples_per_second': 8.348,
     'eval_steps_per_second': 1.044, 'epoch': 2.0}
[41]: # Predict on the validation set
      predictions_output = trainer.predict(val_dataset)
      predicted_labels = np.argmax(predictions_output.predictions, axis=1)
      predicted_sentiments = [id2label[label] for label in predicted_labels]
      # Create DataFrame for export
      val_df = pd.DataFrame({
          'text': val_texts,
          'true_label': val_labels,
          'predicted label': predicted labels,
          'predicted_sentiment': predicted_sentiments
      })
      # Export to CSV
      val_df.to_csv("sentiment_analysis_predictions.csv", index=False)
      print("Exported predictions to sentiment analysis predictions.csv")
     /home/hadoop/py311env/lib/python3.11/site-
     packages/torch/utils/data/dataloader.py:665: UserWarning: 'pin_memory' argument
     is set as true but no accelerator is found, then device pinned memory won't be
     used.
       warnings.warn(warn_msg)
     Exported predictions to sentiment_analysis_predictions.csv
 []:
[42]: # Load population and conflict severity data
      pop_df = pd.read_csv('sudan_population_by_state.csv') # columns: state,__
       →population source: UNFPA 2024 COD-PS Update
      conflict_df = pd.read_csv('sudan_conflict_severity.csv') # columns: state,_
       ⇔severity score source: ACLED
      # Merge auxiliary data
```

is set as true but no accelerator is found, then device pinned memory won't be

```
weights_df = pop_df.merge(conflict_df, on='state')
[43]: # Remove commas robustly, even if some values are already numeric
      weights_df['population'] = pd.to_numeric(weights_df['population'],__
       ⇔errors='coerce')
      weights_df['severity_score'] = pd.to_numeric(weights_df['severity_score'],_
       ⇔errors='coerce')
[44]: print(weights_df[['state', 'population', 'severity_score']])
                  state population severity_score
     0
             Aj Jazirah
                             5124749
                                                4.03
     1
              Blue Nile
                              813930
                                                0.29
         Central Darfur
     2
                             943721
                                                0.50
     3
            East Darfur
                             2390080
                                                0.16
                Gedaref
     4
                             3091393
                                                0.06
     5
                Kassala
                                                0.00
                            2718540
     6
                                               10.00
               Khartoum
                            5941286
     7
           North Darfur
                             3461818
                                                9.65
     8
         North Kordofan
                            3444769
                                                2.16
     9
               Northern
                            1446861
                                                0.07
     10
                Red Sea
                             2035582
                                                0.00
     11
             River Nile
                             1862303
                                                0.12
     12
                 Sennar
                             2532326
                                                0.81
           South Darfur
                                                2.15
     13
                             3895007
     14 South Kordofan
                             1156469
                                                1.58
     15
            West Darfur
                             618178
                                                4.80
     16
          West Kordofan
                            2612654
                                                1.52
     17
             White Nile
                            3392274
                                                0.61
[45]: # Calculate combined weights
      alpha = 0.5
      weights_df['weight'] = (alpha * weights_df['population'] /__
       ⇔weights_df['population'].sum() +
                               (1 - alpha) * weights_df['severity_score'] /__
       ⇔weights_df['severity_score'].sum())
      # Normalize weights
      weights_df['weight'] /= weights_df['weight'].sum()
      # Determine sample size per state
      total_sample_size = 100
      weights_df['sample_quota'] = (weights_df['weight'] * total_sample_size).round().
       ⇔astype(int)
[46]: # For each state, allocate quotas by content_type and sentiment proportionally
      final_samples = []
```

```
[48]: #Redaction: Strip GPS Coordinates to City-Level Precision

# Configure geocoder with user agent
geolocator = Nominatim(user_agent="sudan_crisis_monitor_v1")

# Add rate limiting (1 request/sec)
reverse = RateLimiter(geolocator.reverse, min_delay_seconds=1)

def get_city_name(lat, lon):
    if pd.isna(lat) or pd.isna(lon):
        return None
    try:
        location = reverse((lat, lon), exactly_one=True, language="en")
        if location:
```

```
address = location.raw.get('address', {})
            return address.get('city') or address.get('town') or address.
  except Exception as e:
        logging.error(f"Geocoding failed for ({lat}, {lon}): {e}")
    return None
# Apply to DataFrame
final_sample_df['Location'] = final_sample_df.apply(lambda row:__
  Get_city_name(row['Latitude'], row['Longitude']), axis=1)
# Remove precise coordinates
final_sample_df = final_sample_df.drop(columns=['Longitude', 'Latitude'])
2025-07-07 22:02:59,407 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=14.39582814&lon=33.53808821&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:01,061 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=14.39582814&lon=33.53808821&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:03,109 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=14.39582814&lon=33.53808821&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:05,068 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=14.39582814&lon=33.53808821&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:06,263 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=14.39582814&lon=33.53808821&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:07,493 - WARNING - RateLimiter caught an error, retrying (0/2
tries). Called with (*((14.39582814, 33.53808821),), **{'exactly_one': True,
'language': 'en'}).
```

```
Traceback (most recent call last):
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 534, in _make_request
    response = conn.getresponse()
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connection.py", line 516, in getresponse
   httplib_response = super().getresponse()
 File "/usr/lib/python3.11/http/client.py", line 1395, in getresponse
    response.begin()
 File "/usr/lib/python3.11/http/client.py", line 325, in begin
    version, status, reason = self._read_status()
 File "/usr/lib/python3.11/http/client.py", line 286, in _read_status
    line = str(self.fp.readline(_MAXLINE + 1), "iso-8859-1")
 File "/usr/lib/python3.11/socket.py", line 718, in readinto
   return self._sock.recv_into(b)
 File "/usr/lib/python3.11/ssl.py", line 1314, in recv_into
   return self.read(nbytes, buffer)
 File "/usr/lib/python3.11/ssl.py", line 1166, in read
    return self._sslobj.read(len, buffer)
TimeoutError: The read operation timed out
The above exception was the direct cause of the following exception:
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 787, in urlopen
   response = self._make_request(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 536, in _make_request
    self._raise_timeout(err=e, url=url, timeout_value=read_timeout)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 367, in _raise_timeout
    raise ReadTimeoutError(
urllib3.exceptions.ReadTimeoutError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Read timed
out. (read timeout=1)
The above exception was the direct cause of the following exception:
Traceback (most recent call last):
```

```
File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/adapters.py", line 667, in send
   resp = conn.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 871, in urlopen
   return self.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 871, in urlopen
   return self.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 841, in urlopen
    retries = retries.increment(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/util/retry.py", line 519, in increment
    raise MaxRetryError(_pool, url, reason) from reason # type: ignore[arg-
type]
           .....
urllib3.exceptions.MaxRetryError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=14.39582814&lon=33.53808821&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
During handling of the above exception, another exception occurred:
Traceback (most recent call last):
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 482, in _request
    resp = self.session.get(url, timeout=timeout, headers=headers)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 602, in get
    return self.request("GET", url, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 589, in request
    resp = self.send(prep, **send_kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 703, in send
   r = adapter.send(request, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
```

```
packages/requests/adapters.py", line 700, in send
   raise ConnectionError(e, request=request)
requests.exceptions.ConnectionError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=14.39582814&lon=33.53808821&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
During handling of the above exception, another exception occurred:
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/extra/rate_limiter.py", line 136, in _retries_gen
    yield i # Run the function.
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/extra/rate_limiter.py", line 274, in __call_
    res = self.func(*args, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/geocoders/nominatim.py", line 372, in reverse
    return self._call_geocoder(url, callback, timeout=timeout)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/geocoders/base.py", line 368, in _call_geocoder
   result = self.adapter.get_json(url, timeout=timeout, headers=req_headers)
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 472, in get_json
   resp = self._request(url, timeout=timeout, headers=headers)
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 494, in _request
   raise GeocoderUnavailable(message)
geopy.exc.GeocoderUnavailable:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=14.39582814&lon=33.53808821&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
2025-07-07 22:03:13,774 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=14.39582814&lon=33.53808821&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:16,441 - WARNING - Retrying (Retry(total=1, connect=None,
```

```
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=14.39582814&lon=33.53808821&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:17,630 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=14.39582814&lon=33.53808821&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:18,837 - WARNING - RateLimiter caught an error, retrying (0/2
tries). Called with (*((14.39582814, 33.53808821),), **{'exactly_one': True,
'language': 'en'}).
Traceback (most recent call last):
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 534, in _make_request
    response = conn.getresponse()
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connection.py", line 516, in getresponse
   httplib_response = super().getresponse()
 File "/usr/lib/python3.11/http/client.py", line 1395, in getresponse
   response.begin()
 File "/usr/lib/python3.11/http/client.py", line 325, in begin
    version, status, reason = self._read_status()
 File "/usr/lib/python3.11/http/client.py", line 286, in _read_status
    line = str(self.fp.readline(_MAXLINE + 1), "iso-8859-1")
 File "/usr/lib/python3.11/socket.py", line 718, in readinto
   return self._sock.recv_into(b)
 File "/usr/lib/python3.11/ssl.py", line 1314, in recv_into
    return self.read(nbytes, buffer)
 File "/usr/lib/python3.11/ssl.py", line 1166, in read
    return self._sslobj.read(len, buffer)
TimeoutError: The read operation timed out
The above exception was the direct cause of the following exception:
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 787, in urlopen
   response = self._make_request(
```

```
_____
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 536, in _make_request
   self._raise_timeout(err=e, url=url, timeout_value=read_timeout)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 367, in _raise_timeout
   raise ReadTimeoutError(
urllib3.exceptions.ReadTimeoutError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Read timed
out. (read timeout=1)
The above exception was the direct cause of the following exception:
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/adapters.py", line 667, in send
   resp = conn.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 871, in urlopen
   return self.urlopen(
          _____
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 871, in urlopen
   return self.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 841, in urlopen
   retries = retries.increment(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/util/retry.py", line 519, in increment
   raise MaxRetryError(_pool, url, reason) from reason # type: ignore[arg-
type]
       _____
urllib3.exceptions.MaxRetryError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=14.39582814&lon=33.53808821&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
During handling of the above exception, another exception occurred:
Traceback (most recent call last):
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
```

resp = self.session.get(url, timeout=timeout, headers=headers)

line 482, in _request

```
File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 602, in get
    return self.request("GET", url, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 589, in request
    resp = self.send(prep, **send_kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 703, in send
    r = adapter.send(request, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/adapters.py", line 700, in send
   raise ConnectionError(e, request=request)
requests.exceptions.ConnectionError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=14.39582814&lon=33.53808821&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
During handling of the above exception, another exception occurred:
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/extra/rate_limiter.py", line 136, in _retries_gen
    yield i # Run the function.
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/extra/rate_limiter.py", line 274, in __call__
    res = self.func(*args, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/geocoders/nominatim.py", line 372, in reverse
    return self. call geocoder(url, callback, timeout=timeout)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/geocoders/base.py", line 368, in _call_geocoder
    result = self.adapter.get_json(url, timeout=timeout, headers=req_headers)
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 472, in get_json
   resp = self._request(url, timeout=timeout, headers=headers)
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
```

line 494, in _request

```
raise GeocoderUnavailable(message)
geopy.exc.GeocoderUnavailable:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=14.39582814&lon=33.53808821&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
2025-07-07 22:03:26,847 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=12.90415662&lon=23.47547804&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:28,506 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=11.46057695&lon=26.12652531&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:29,701 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=11.46057695&lon=26.12652531&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:31,481 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=11.46057695&lon=26.12652531&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:33,449 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=11.46057695&lon=26.12652531&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:35,472 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=14.0387405&lon=35.38913814&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:37,619 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
```

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language=en&addressdetails=1
2025-07-07 22:03:39,463 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:40,647 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:42,431 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:43,612 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:44,797 - WARNING - RateLimiter caught an error, retrying (0/2
tries). Called with (*((15.59742522, 32.53558534),), **{'exactly_one': True,
'language': 'en'}).
Traceback (most recent call last):
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 534, in _make_request
   response = conn.getresponse()
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connection.py", line 516, in getresponse
   httplib_response = super().getresponse()
 File "/usr/lib/python3.11/http/client.py", line 1395, in getresponse
   response.begin()
 File "/usr/lib/python3.11/http/client.py", line 325, in begin
    version, status, reason = self._read_status()
 File "/usr/lib/python3.11/http/client.py", line 286, in _read_status
    line = str(self.fp.readline(_MAXLINE + 1), "iso-8859-1")
 File "/usr/lib/python3.11/socket.py", line 718, in readinto
   return self._sock.recv_into(b)
```

```
File "/usr/lib/python3.11/ssl.py", line 1314, in recv_into
   return self.read(nbytes, buffer)
 File "/usr/lib/python3.11/ssl.py", line 1166, in read
    return self. sslobj.read(len, buffer)
TimeoutError: The read operation timed out
The above exception was the direct cause of the following exception:
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 787, in urlopen
   response = self._make_request(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 536, in _make_request
    self._raise_timeout(err=e, url=url, timeout_value=read_timeout)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 367, in _raise_timeout
    raise ReadTimeoutError(
urllib3.exceptions.ReadTimeoutError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Read timed
out. (read timeout=1)
The above exception was the direct cause of the following exception:
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/adapters.py", line 667, in send
   resp = conn.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 871, in urlopen
   return self.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 871, in urlopen
   return self.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 841, in urlopen
    retries = retries.increment(
              .....
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/util/retry.py", line 519, in increment
    raise MaxRetryError(_pool, url, reason) from reason # type: ignore[arg-
type]
```

```
urllib3.exceptions.MaxRetryError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
During handling of the above exception, another exception occurred:
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 482, in _request
   resp = self.session.get(url, timeout=timeout, headers=headers)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 602, in get
    return self.request("GET", url, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 589, in request
    resp = self.send(prep, **send_kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 703, in send
   r = adapter.send(request, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/adapters.py", line 700, in send
   raise ConnectionError(e, request=request)
requests.exceptions.ConnectionError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
During handling of the above exception, another exception occurred:
Traceback (most recent call last):
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/extra/rate_limiter.py", line 136, in _retries_gen
   yield i # Run the function.
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/extra/rate_limiter.py", line 274, in __call__
    res = self.func(*args, **kwargs)
```

```
File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/geocoders/nominatim.py", line 372, in reverse
   return self._call_geocoder(url, callback, timeout=timeout)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/geocoders/base.py", line 368, in _call_geocoder
    result = self.adapter.get_json(url, timeout=timeout, headers=req_headers)
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 472, in get_json
   resp = self._request(url, timeout=timeout, headers=headers)
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 494, in request
   raise GeocoderUnavailable(message)
geopy.exc.GeocoderUnavailable:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
2025-07-07 22:03:52,804 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:57,774 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:03:58,968 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:02,673 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:04,603 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
```

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port=443): Read timed out. (read timeout=1)")':
/reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:05,809 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:06,998 - WARNING - RateLimiter caught an error, retrying (0/2
tries). Called with (*((15.59742522, 32.53558534),), **{'exactly_one': True,
'language': 'en'}).
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 534, in _make_request
   response = conn.getresponse()
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connection.py", line 516, in getresponse
   httplib_response = super().getresponse()
 File "/usr/lib/python3.11/http/client.py", line 1395, in getresponse
   response.begin()
 File "/usr/lib/python3.11/http/client.py", line 325, in begin
    version, status, reason = self._read_status()
 File "/usr/lib/python3.11/http/client.py", line 286, in _read_status
    line = str(self.fp.readline(_MAXLINE + 1), "iso-8859-1")
 File "/usr/lib/python3.11/socket.py", line 718, in readinto
   return self._sock.recv_into(b)
 File "/usr/lib/python3.11/ssl.py", line 1314, in recv_into
    return self.read(nbytes, buffer)
 File "/usr/lib/python3.11/ssl.py", line 1166, in read
    return self. sslobj.read(len, buffer)
TimeoutError: The read operation timed out
The above exception was the direct cause of the following exception:
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 787, in urlopen
   response = self._make_request(
 File "/home/hadoop/py311env/lib/python3.11/site-
```

```
packages/urllib3/connectionpool.py", line 536, in _make_request
    self._raise_timeout(err=e, url=url, timeout_value=read_timeout)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 367, in _raise_timeout
    raise ReadTimeoutError(
urllib3.exceptions.ReadTimeoutError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Read timed
out. (read timeout=1)
The above exception was the direct cause of the following exception:
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/adapters.py", line 667, in send
   resp = conn.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 871, in urlopen
    return self.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 871, in urlopen
   return self.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 841, in urlopen
   retries = retries.increment(
             ~~~~~~~~~~
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/util/retry.py", line 519, in increment
   raise MaxRetryError(_pool, url, reason) from reason # type: ignore[arg-
type]
       -----
urllib3.exceptions.MaxRetryError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
During handling of the above exception, another exception occurred:
Traceback (most recent call last):
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 482, in _request
   resp = self.session.get(url, timeout=timeout, headers=headers)
 File "/home/hadoop/py311env/lib/python3.11/site-
```

```
packages/requests/sessions.py", line 602, in get
   return self.request("GET", url, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 589, in request
    resp = self.send(prep, **send_kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 703, in send
    r = adapter.send(request, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/adapters.py", line 700, in send
    raise ConnectionError(e, request=request)
requests.exceptions.ConnectionError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
During handling of the above exception, another exception occurred:
Traceback (most recent call last):
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/extra/rate_limiter.py", line 136, in _retries_gen
    yield i # Run the function.
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/extra/rate_limiter.py", line 274, in __call__
   res = self.func(*args, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/geocoders/nominatim.py", line 372, in reverse
    return self. call geocoder(url, callback, timeout=timeout)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/geocoders/base.py", line 368, in _call_geocoder
    result = self.adapter.get_json(url, timeout=timeout, headers=req_headers)
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 472, in get_json
   resp = self._request(url, timeout=timeout, headers=headers)
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 494, in request
   raise GeocoderUnavailable(message)
geopy.exc.GeocoderUnavailable:
```

```
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
2025-07-07 22:04:15,008 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:16,191 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=15.59742522&lon=32.53558534&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:22,274 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:23,905 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:28,080 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:29,947 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:31,138 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:32,757 - WARNING - Retrying (Retry(total=1, connect=None,
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read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:33,938 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:35,823 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:37,007 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:38,963 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:40,800 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:41,976 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:43,164 - WARNING - RateLimiter caught an error, retrying (0/2
tries). Called with (*((13.62471333, 25.35801212),), **{'exactly_one': True,
'language': 'en'}).
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 534, in _make_request
   response = conn.getresponse()
```

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_____
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connection.py", line 516, in getresponse
   httplib_response = super().getresponse()
 File "/usr/lib/python3.11/http/client.py", line 1395, in getresponse
   response.begin()
 File "/usr/lib/python3.11/http/client.py", line 325, in begin
    version, status, reason = self._read_status()
 File "/usr/lib/python3.11/http/client.py", line 286, in _read_status
    line = str(self.fp.readline(_MAXLINE + 1), "iso-8859-1")
 File "/usr/lib/python3.11/socket.py", line 718, in readinto
   return self._sock.recv_into(b)
           .....
 File "/usr/lib/python3.11/ssl.py", line 1314, in recv_into
   return self.read(nbytes, buffer)
           _____
 File "/usr/lib/python3.11/ssl.py", line 1166, in read
    return self._sslobj.read(len, buffer)
TimeoutError: The read operation timed out
The above exception was the direct cause of the following exception:
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 787, in urlopen
   response = self._make_request(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 536, in _make_request
    self._raise_timeout(err=e, url=url, timeout_value=read_timeout)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 367, in _raise_timeout
   raise ReadTimeoutError(
urllib3.exceptions.ReadTimeoutError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Read timed
out. (read timeout=1)
The above exception was the direct cause of the following exception:
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/adapters.py", line 667, in send
   resp = conn.urlopen(
```

```
File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 871, in urlopen
   return self.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 871, in urlopen
    return self.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 841, in urlopen
   retries = retries.increment(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/util/retry.py", line 519, in increment
    raise MaxRetryError(_pool, url, reason) from reason # type: ignore[arg-
type]
           .....
urllib3.exceptions.MaxRetryError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
During handling of the above exception, another exception occurred:
Traceback (most recent call last):
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 482, in request
   resp = self.session.get(url, timeout=timeout, headers=headers)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 602, in get
    return self.request("GET", url, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 589, in request
    resp = self.send(prep, **send_kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 703, in send
   r = adapter.send(request, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/adapters.py", line 700, in send
    raise ConnectionError(e, request=request)
requests.exceptions.ConnectionError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
```

```
exceeded with url: /reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
During handling of the above exception, another exception occurred:
Traceback (most recent call last):
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/extra/rate_limiter.py", line 136, in _retries_gen
   yield i # Run the function.
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/extra/rate_limiter.py", line 274, in __call__
   res = self.func(*args, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/geocoders/nominatim.py", line 372, in reverse
    return self._call_geocoder(url, callback, timeout=timeout)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/geocoders/base.py", line 368, in _call_geocoder
    result = self.adapter.get_json(url, timeout=timeout, headers=req_headers)
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 472, in get_json
   resp = self._request(url, timeout=timeout, headers=headers)
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 494, in _request
   raise GeocoderUnavailable(message)
geopy.exc.GeocoderUnavailable:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=13.62471333&lon=25.35801212&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
2025-07-07 22:04:55,185 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.18240174&lon=30.21860152&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:56,396 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.18240174&lon=30.21860152&format=json&accept-
```

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language=en&addressdetails=1
2025-07-07 22:04:58,061 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
\verb|'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.18240174&lon=30.21860152&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:04:59,245 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.18240174&lon=30.21860152&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:04,053 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=17.58736932&lon=33.96306453&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:05,269 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=17.58736932&lon=33.96306453&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:12,121 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=12.05407646&lon=24.8760273&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:13,977 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=12.05407646&lon=24.8760273&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:16,156 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=12.05407646&lon=24.8760273&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:17,337 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=12.05407646&lon=24.8760273&format=json&accept-
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language=en&addressdetails=1
2025-07-07 22:05:18,538 - WARNING - RateLimiter caught an error, retrying (0/2
tries). Called with (*((12.05407646, 24.8760273),), **{'exactly_one': True,
'language': 'en'}).
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 534, in _make_request
    response = conn.getresponse()
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connection.py", line 516, in getresponse
   httplib_response = super().getresponse()
 File "/usr/lib/python3.11/http/client.py", line 1395, in getresponse
    response.begin()
 File "/usr/lib/python3.11/http/client.py", line 325, in begin
    version, status, reason = self._read_status()
 File "/usr/lib/python3.11/http/client.py", line 286, in _read_status
    line = str(self.fp.readline(_MAXLINE + 1), "iso-8859-1")
 File "/usr/lib/python3.11/socket.py", line 718, in readinto
   return self._sock.recv_into(b)
 File "/usr/lib/python3.11/ssl.py", line 1314, in recv_into
    return self.read(nbytes, buffer)
 File "/usr/lib/python3.11/ssl.py", line 1166, in read
    return self._sslobj.read(len, buffer)
           _____
TimeoutError: The read operation timed out
The above exception was the direct cause of the following exception:
Traceback (most recent call last):
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 787, in urlopen
   response = self._make_request(
              _____
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 536, in _make_request
    self._raise_timeout(err=e, url=url, timeout_value=read_timeout)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 367, in _raise_timeout
    raise ReadTimeoutError(
urllib3.exceptions.ReadTimeoutError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Read timed
out. (read timeout=1)
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The above exception was the direct cause of the following exception:
Traceback (most recent call last):
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/adapters.py", line 667, in send
    resp = conn.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 871, in urlopen
   return self.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 871, in urlopen
   return self.urlopen(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/connectionpool.py", line 841, in urlopen
    retries = retries.increment(
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/urllib3/util/retry.py", line 519, in increment
   raise MaxRetryError(_pool, url, reason) from reason # type: ignore[arg-
type]
       .....
urllib3.exceptions.MaxRetryError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=12.05407646&lon=24.8760273&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
During handling of the above exception, another exception occurred:
Traceback (most recent call last):
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 482, in request
   resp = self.session.get(url, timeout=timeout, headers=headers)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 602, in get
    return self.request("GET", url, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/sessions.py", line 589, in request
   resp = self.send(prep, **send_kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
```

```
packages/requests/sessions.py", line 703, in send
   r = adapter.send(request, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/requests/adapters.py", line 700, in send
    raise ConnectionError(e, request=request)
requests.exceptions.ConnectionError:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=12.05407646&lon=24.8760273&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
During handling of the above exception, another exception occurred:
Traceback (most recent call last):
  File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/extra/rate_limiter.py", line 136, in _retries_gen
    yield i # Run the function.
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/extra/rate_limiter.py", line 274, in __call__
    res = self.func(*args, **kwargs)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/geocoders/nominatim.py", line 372, in reverse
   return self._call_geocoder(url, callback, timeout=timeout)
 File "/home/hadoop/py311env/lib/python3.11/site-
packages/geopy/geocoders/base.py", line 368, in _call_geocoder
   result = self.adapter.get_json(url, timeout=timeout, headers=req_headers)
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 472, in get_json
   resp = self. request(url, timeout=timeout, headers=headers)
 File "/home/hadoop/py311env/lib/python3.11/site-packages/geopy/adapters.py",
line 494, in _request
   raise GeocoderUnavailable(message)
geopy.exc.GeocoderUnavailable:
HTTPSConnectionPool(host='nominatim.openstreetmap.org', port=443): Max retries
exceeded with url: /reverse?lat=12.05407646&lon=24.8760273&format=json&accept-
language=en&addressdetails=1 (Caused by
ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)"))
2025-07-07 22:05:24,749 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
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port=443): Read timed out. (read timeout=1)")':
/reverse?lat=12.05407646&lon=24.8760273&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:26,341 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=12.05407646&lon=24.8760273&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:33,520 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.43755252&lon=22.44914398&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:35,813 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.43755252&lon=22.44914398&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:37,270 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.43755252&lon=22.44914398&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:38,461 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.43755252&lon=22.44914398&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:40,355 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=11.71747777&lon=28.34637592&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:41,560 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=11.71747777&lon=28.34637592&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:43,470 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
```

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port=443): Read timed out. (read timeout=1)")':
/reverse?lat=11.71747777&lon=28.34637592&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:44,653 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=11.71747777&lon=28.34637592&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:46,730 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=11.71747777&lon=28.34637592&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:47,929 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=11.71747777&lon=28.34637592&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:49,560 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=11.71747777&lon=28.34637592&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:50,745 - WARNING - Retrying (Retry(total=0, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
language=en&addressdetails=1
2025-07-07 22:05:52,603 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.17897728&lon=32.74749408&format=json&accept-
language=en&addressdetails=1
2025-07-07 22:05:55,563 - WARNING - Retrying (Retry(total=1, connect=None,
read=None, redirect=None, status=None)) after connection broken by
'ReadTimeoutError("HTTPSConnectionPool(host='nominatim.openstreetmap.org',
port=443): Read timed out. (read timeout=1)")':
/reverse?lat=13.17897728&lon=32.74749408&format=json&accept-
language=en&addressdetails=1
```

```
[49]: HIGH_RISK_KEYWORDS = {
          'ar': [' ', ' ', ' ', ' '[, # Shelter, displaced, camp, hideouts
          'en': ['shelter GPS', 'refugee camp location', 'RSF hideout']
      }
      #Risk assessment matrix
      def assess risk(tweet):
          risk_score = 0
          # Geolocation check
          if tweet['coordinates']:
             precision = tweet.get('precision', 9999)
             risk_score += 3 if precision < 100 else 1
          # Entity recognition
          entities = ner_analyzer(tweet['text'])
          if 'LOC' in entities and 'shelter' in tweet['text']:
             risk_score += 2
          # Image analysis
          if shelter_detected(tweet['media']):
             risk_score += 3
          return risk_score
[54]: # Export the results to CSV
      final_sample_df.to_csv("risk_assessment_results.csv", index=False)
      print("Exported risk assessment results to risk assessment results.csv")
     Exported risk assessment results to risk_assessment_results.csv
[55]: #Alert System
      def send_alert(tweet):
          message = f" High-risk post detected: {tweet['url']}\n"
          message += f"Risk Score: {tweet['risk_score']}/4\n"
          message += f"Content: {tweet['text'][:200]}..."
          twitter_api.send_dm("@SudanRightsMonitor", message)
          log_to_incident_db(tweet) # For ICC evidentiary chain [5]
 []:
 []:
 []:
[64]: # Threat Detection
      from PIL import Image
      import numpy as np
      import requests
      from io import BytesIO
      import ast
```

```
# 1. Define class names
class_names = [
    "armed conflict",
    "displacement",
    "looting",
    "sexual violence",
    "infrastructure destruction",
    "protest suppression",
    "famine"
1
def load_and_preprocess_image(entry):
    if entry is None or entry == '' or entry == [] or (isinstance(entry, float)
 →and np.isnan(entry)):
        return np.zeros((224, 224, 3), dtype=np.float32)
    if isinstance(entry, str):
        try:
            parsed = ast.literal_eval(entry)
            if isinstance(parsed, list):
                entry = parsed
        except Exception:
            pass
    if isinstance(entry, list):
        if len(entry) == 0:
            return np.zeros((224, 224, 3), dtype=np.float32)
        entry = entry[0]
    if isinstance(entry, str):
        if entry.startswith('http://') or entry.startswith('https://'):
            try:
                response = requests.get(entry, timeout=10)
                img = Image.open(BytesIO(response.content)).convert("RGB").
 →resize((224, 224))
                return np.array(img, dtype=np.float32) / 255.0
            except Exception as e:
                print(f"Warning: Could not download image {entry}: {e}")
                return np.zeros((224, 224, 3), dtype=np.float32)
        else:
            try:
                img = Image.open(entry).convert("RGB").resize((224, 224))
                return np.array(img, dtype=np.float32) / 255.0
            except Exception as e:
                print(f"Warning: Could not open image {entry}: {e}")
                return np.zeros((224, 224, 3), dtype=np.float32)
    elif isinstance(entry, np.ndarray):
        if entry.shape == (224, 224, 3):
            return entry.astype(np.float32)
```

```
try:
                 img = Image.fromarray((entry * 255).astype(np.uint8)).convert("RGB")
                 img = img.resize((224, 224))
                return np.array(img, dtype=np.float32) / 255.0
             except Exception as e:
                print(f"Warning: Could not process array image: {e}")
                return np.zeros((224, 224, 3), dtype=np.float32)
        else:
            print(f"Warning: Unsupported image format: {type(entry)}")
            return np.zeros((224, 224, 3), dtype=np.float32)
     # Preprocess images
    final_sample_df['image'] = final_sample_df['images'].
      →apply(load_and_preprocess_image)
    # Prepare input arrays
    texts = final_sample_df['text'].astype(str).values
    images = np.stack(final_sample_df['image'].values)
    # Model inference
    predictions = model.predict([texts, images])
    predicted_labels = (predictions > 0.5).astype(int)
    # Add class-named columns
    for idx, class_name in enumerate(class_names):
        final_sample_df[f'pred_{class_name}'] = predicted_labels[:, idx]
        final_sample_df[f'prob_{class_name}'] = predictions[:, idx]
     # Export
    final_sample_df.to_csv("threat_detection_predictions.csv", index=False)
    print("Exported threat detection predictions to threat detection predictions.
      ⇔csv")
    Warning: Could not open image
    "[""http://pbs.twimg.com/media/GsfuzYgW8AAQAW6.jpg""]": [Errno 2] No such file
    or directory: ""[""http://pbs.twimg.com/media/GsfuzYgW8AAQAW6.jpg""]""
    3/3 [======] - 15s 5s/step
    Exported threat detection predictions to threat_detection_predictions.csv
[]:
[]:
```