task5 NLP W2V

May 10, 2025

#This notebook introduce a complete implementation of a Word2Vec-like Skip-Gram model using PyTorch, the Hugging Face Datasets library, and a custom tokenizer. The used dataset is "yelp_review_full".

1 Install and Import Dependencies

[2]: !pip install datasets transformers torch tqdm

```
Collecting datasets
 Downloading datasets-3.6.0-py3-none-any.whl.metadata (19 kB)
Requirement already satisfied: transformers in /usr/local/lib/python3.11/dist-
packages (4.51.3)
Requirement already satisfied: torch in /usr/local/lib/python3.11/dist-packages
(2.6.0+cu124)
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(4.67.1)
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xxhash-3.5.0-cp311-cp311-manylinux_2_17_x86_64.manylinux2014_x86_64.whl.metadata
(12 kB)
Collecting multiprocess<0.70.17 (from datasets)
  Downloading multiprocess-0.70.16-py311-none-any.whl.metadata (7.2 kB)
Collecting fsspec<=2025.3.0,>=2023.1.0 (from
fsspec[http]<=2025.3.0,>=2023.1.0->datasets)
  Downloading fsspec-2025.3.0-py3-none-any.whl.metadata (11 kB)
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Requirement already satisfied: huggingface-hub>=0.24.0 in
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Requirement already satisfied: pyyaml>=5.1 in /usr/local/lib/python3.11/dist-
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Requirement already satisfied: regex!=2019.12.17 in
/usr/local/lib/python3.11/dist-packages (from transformers) (2024.11.6)
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Requirement already satisfied: typing-extensions>=4.10.0 in
/usr/local/lib/python3.11/dist-packages (from torch) (4.13.2)
Requirement already satisfied: networkx in /usr/local/lib/python3.11/dist-
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Requirement already satisfied: jinja2 in /usr/local/lib/python3.11/dist-packages
(from torch) (3.1.6)
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manylinux2014_x86_64.whl.metadata (1.5 kB)
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/usr/local/lib/python3.11/dist-packages (from sympy==1.13.1->torch) (1.3.0)
Requirement already satisfied: aiohttp!=4.0.0a0,!=4.0.0a1 in
/usr/local/lib/python3.11/dist-packages (from
fsspec[http]<=2025.3.0,>=2023.1.0->datasets) (3.11.15)
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aiohttp!=4.0.0a0,!=4.0.0a1->fsspec[http]<=2025.3.0,>=2023.1.0->datasets) (2.6.1)
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/usr/local/lib/python3.11/dist-packages (from
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Requirement already satisfied: multidict<7.0,>=4.5 in
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/usr/local/lib/python3.11/dist-packages (from
aiohttp!=4.0.0a0,!=4.0.0a1-fsspec[http] <= 2025.3.0,>= 2023.1.0-fasets) (6.4.3)
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/usr/local/lib/python3.11/dist-packages (from
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Requirement already satisfied: six>=1.5 in /usr/local/lib/python3.11/dist-
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curand-cu12, nvidia-cufft-cu12, nvidia-cuda-runtime-cu12, nvidia-cuda-nvrtc-
cu12, nvidia-cuda-cupti-cu12, nvidia-cublas-cu12, fsspec, dill, nvidia-cusparse-
cu12, nvidia-cudnn-cu12, multiprocess, nvidia-cusolver-cu12, datasets
 Attempting uninstall: nvidia-nvjitlink-cu12
   Found existing installation: nvidia-nvjitlink-cu12 12.5.82
   Uninstalling nvidia-nvjitlink-cu12-12.5.82:
      Successfully uninstalled nvidia-nvjitlink-cu12-12.5.82
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    Found existing installation: nvidia-curand-cu12 10.3.6.82
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      Successfully uninstalled nvidia-curand-cu12-10.3.6.82
  Attempting uninstall: nvidia-cufft-cu12
    Found existing installation: nvidia-cufft-cu12 11.2.3.61
   Uninstalling nvidia-cufft-cu12-11.2.3.61:
      Successfully uninstalled nvidia-cufft-cu12-11.2.3.61
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    Found existing installation: nvidia-cuda-runtime-cu12 12.5.82
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      Successfully uninstalled nvidia-cuda-runtime-cu12-12.5.82
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      Successfully uninstalled nvidia-cuda-nvrtc-cu12-12.5.82
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  Attempting uninstall: nvidia-cublas-cu12
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Found existing installation: nvidia-cublas-cu12 12.5.3.2
        Uninstalling nvidia-cublas-cu12-12.5.3.2:
          Successfully uninstalled nvidia-cublas-cu12-12.5.3.2
      Attempting uninstall: fsspec
        Found existing installation: fsspec 2025.3.2
        Uninstalling fsspec-2025.3.2:
          Successfully uninstalled fsspec-2025.3.2
      Attempting uninstall: nvidia-cusparse-cu12
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      Attempting uninstall: nvidia-cudnn-cu12
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        Uninstalling nvidia-cudnn-cu12-9.3.0.75:
          Successfully uninstalled nvidia-cudnn-cu12-9.3.0.75
      Attempting uninstall: nvidia-cusolver-cu12
        Found existing installation: nvidia-cusolver-cu12 11.6.3.83
        Uninstalling nvidia-cusolver-cu12-11.6.3.83:
          Successfully uninstalled nvidia-cusolver-cu12-11.6.3.83
    ERROR: pip's dependency resolver does not currently take into account all
    the packages that are installed. This behaviour is the source of the following
    dependency conflicts.
    gcsfs 2025.3.2 requires fsspec==2025.3.2, but you have fsspec 2025.3.0 which is
    incompatible.
    Successfully installed datasets-3.6.0 dill-0.3.8 fsspec-2025.3.0
    multiprocess-0.70.16 nvidia-cublas-cu12-12.4.5.8 nvidia-cuda-cupti-cu12-12.4.127
    nvidia-cuda-nvrtc-cu12-12.4.127 nvidia-cuda-runtime-cu12-12.4.127 nvidia-cudnn-
    cu12-9.1.0.70 nvidia-cufft-cu12-11.2.1.3 nvidia-curand-cu12-10.3.5.147 nvidia-
    cusolver-cu12-11.6.1.9 nvidia-cusparse-cu12-12.3.1.170 nvidia-nvjitlink-
    cu12-12.4.127 xxhash-3.5.0
[3]: import torch
     import torch.nn as nn
     from torch.utils.data import Dataset, DataLoader
     from datasets import load_dataset
     import random
     from collections import Counter
     import numpy as np
     from tqdm import tqdm
```

2 Load and Preprocess the Dataset

```
[4]: dataset = load dataset("yelp review full", split="train[:10%]")
     texts = [item['text'] for item in dataset]
     tokenized_texts = [text.lower().split() for text in texts]
     flat tokens = [word for sentence in tokenized texts for word in sentence]
    /usr/local/lib/python3.11/dist-packages/huggingface_hub/utils/_auth.py:104:
    UserWarning:
    Error while fetching `HF_TOKEN` secret value from your vault: 'Requesting secret
    HF_TOKEN timed out. Secrets can only be fetched when running from the Colab
    UI.'.
    You are not authenticated with the Hugging Face Hub in this notebook.
    If the error persists, please let us know by opening an issue on GitHub
    (https://github.com/huggingface/huggingface_hub/issues/new).
      warnings.warn(
                              | 0.00/6.72k [00:00<?, ?B/s]
    README.md:
                 0%|
    train-00000-of-00001.parquet:
                                    0%1
                                                 | 0.00/299M [00:00<?, ?B/s]
                                   0%1
                                                 | 0.00/23.5M [00:00<?, ?B/s]
    test-00000-of-00001.parquet:
    Generating train split:
                              0%1
                                           | 0/650000 [00:00<?, ? examples/s]
    Generating test split:
                             0%1
                                           | 0/50000 [00:00<?, ? examples/s]
```

3 Build Vocabulary

```
[41]: vocab_size = 10000
min_freq = 5
word_freq = Counter(flat_tokens)
most_common = word_freq.most_common(vocab_size - 2)

word2idx = {'<UNK>': 0, '<PAD>': 1}
for i, (word, _) in enumerate(most_common, start=2):
    word2idx[word] = i
idx2word = {idx: word for word, idx in word2idx.items()}
```

4 Generate Skip-Gram Pairs

```
context_pos = center_pos + w
    if w != 0 and 0 <= context_pos < len(indices):
        pairs.append((indices[center_pos], indices[context_pos]))
    return pairs

pairs = generate_skipgram_pairs(tokenized_texts)</pre>
```

5 Dataset and DataLoader

```
[43]: class SkipGramDataset(Dataset):
    def __init__(self, pairs):
        self.pairs = pairs

def __len__(self):
        return len(self.pairs)

def __getitem__(self, idx):
        center, context = self.pairs[idx]
        return torch.tensor(center), torch.tensor(context)

batch_size = 256
train_dataset = SkipGramDataset(pairs)
train_loader = DataLoader(train_dataset, batch_size=batch_size, shuffle=True)
```

6 Word2Vec Skip-Gram Model

```
class Word2Vec(nn.Module):
    def __init__(self, vocab_size, embedding_dim):
        super(Word2Vec, self).__init__()
        self.center_embeddings = nn.Embedding(vocab_size, embedding_dim)
        self.context_embeddings = nn.Embedding(vocab_size, embedding_dim)

def forward(self, center_words, context_words):
        center_embeds = self.center_embeddings(center_words)
        context_embeds = self.context_embeddings(context_words)
        scores = torch.sum(center_embeds * context_embeds, dim=1)
        return scores

embedding_dim = 200

model = Word2Vec(vocab_size=len(word2idx), embedding_dim=embedding_dim)
device = torch.device("cuda" if torch.cuda.is_available() else "cpu")
model = model.to(device)
```

7 Training the Model

```
[45]: optimizer = torch.optim.Adam(model.parameters(), lr=0.0005)
      loss_fn = nn.BCEWithLogitsLoss()
      epochs = 20
      for epoch in range(epochs):
          model.train()
          total_loss = 0
          for center, context in tqdm(train_loader):
              center, context = center.to(device), context.to(device)
              # Create positive and negative samples
              positive_labels = torch.ones(center.size(0)).to(device)
              negative_context = torch.randint(0, len(word2idx), context.size()).
       →to(device)
              negative_labels = torch.zeros(center.size(0)).to(device)
              # Forward pass
              pos_scores = model(center, context)
              neg_scores = model(center, negative_context)
              # Compute loss
              loss = loss_fn(pos_scores, positive_labels) + loss_fn(neg_scores, u
       →negative_labels)
              optimizer.zero_grad()
              loss.backward()
              optimizer.step()
              total_loss += loss.item()
          print(f"Epoch {epoch + 1}/{epochs}, Loss: {total_loss:.4f}")
     100%|
               | 13355/13355 [01:22<00:00, 161.95it/s]
     Epoch 1/20, Loss: 90971.1613
               | 13355/13355 [01:23<00:00, 160.64it/s]
     Epoch 2/20, Loss: 46661.9170
              | 13355/13355 [01:23<00:00, 160.65it/s]
     Epoch 3/20, Loss: 30855.2078
     100%|
              | 13355/13355 [01:22<00:00, 161.11it/s]
     Epoch 4/20, Loss: 23525.2784
     100%|
               | 13355/13355 [01:23<00:00, 160.81it/s]
```

```
Epoch 5/20, Loss: 19235.0791
          | 13355/13355 [01:22<00:00, 161.17it/s]
Epoch 6/20, Loss: 16391.2795
          | 13355/13355 [01:23<00:00, 160.57it/s]
100%|
Epoch 7/20, Loss: 14326.2613
100%|
        | 13355/13355 [01:22<00:00, 161.00it/s]
Epoch 8/20, Loss: 12737.8142
100%|
         | 13355/13355 [01:23<00:00, 160.30it/s]
Epoch 9/20, Loss: 11480.3478
100%|
          | 13355/13355 [01:23<00:00, 160.43it/s]
Epoch 10/20, Loss: 10494.2649
100%|
          | 13355/13355 [01:23<00:00, 160.66it/s]
Epoch 11/20, Loss: 9709.4226
          | 13355/13355 [01:22<00:00, 161.29it/s]
100%|
Epoch 12/20, Loss: 9074.4453
100%|
          | 13355/13355 [01:23<00:00, 160.64it/s]
Epoch 13/20, Loss: 8542.2664
100%|
          | 13355/13355 [01:23<00:00, 160.20it/s]
Epoch 14/20, Loss: 8126.1015
100%|
          | 13355/13355 [01:23<00:00, 159.15it/s]
Epoch 15/20, Loss: 7787.4119
100%|
          | 13355/13355 [01:23<00:00, 160.48it/s]
Epoch 16/20, Loss: 7503.0659
100%|
          | 13355/13355 [01:23<00:00, 160.00it/s]
Epoch 17/20, Loss: 7273.2559
          | 13355/13355 [01:23<00:00, 159.99it/s]
100%|
Epoch 18/20, Loss: 7057.2664
          | 13355/13355 [01:23<00:00, 160.12it/s]
Epoch 19/20, Loss: 6877.6071
          | 13355/13355 [01:23<00:00, 160.46it/s]
```

Epoch 20/20, Loss: 6728.2118

8 Save and Load the Model

```
[39]: # Save model and vocab
torch.save(model.state_dict(), "skipgram_model.pt")
torch.save(word2idx, "word2idx.pt")

# To load later:
# model.load_state_dict(torch.load("skipgram_model.pt"))
# model.eval()
```

9 Inference – Get Similar Words

```
[40]: def get_similar_words(query_word, top_n=5):
          model.eval()
          if query_word not in word2idx:
              print(f"'{query word}' not in vocabulary.")
          with torch.no_grad():
              query_idx = word2idx[query_word]
              query_vec = model.center_embeddings(torch.tensor([query_idx]).
       →to(device))
              all_embeddings = model.center_embeddings.weight.data
              similarities = torch.matmul(query_vec, all_embeddings.T).squeeze(0)
              similar_indices = similarities.topk(top_n + 1).indices.tolist()[1:]
              print(f"Words similar to '{query_word}':")
              for idx in similar_indices:
                  print(f"- {idx2word[idx]}")
      # Example
      get_similar_words("good")
```

```
Words similar to 'good':
- machine
- clothing
- perfectly,
- classy
- quiet
```