```
import pandas as pd
from bertopic import BERTopic
import re
import nltk
from nltk.corpus import stopwords
from nltk.tokenize import word_tokenize
from sklearn.feature_extraction.text import CountVectorizer
🚌 c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\site-packages\tqdm\auto.py:21: TqdmWarning: IProgress not found. Ple
        from .autonotebook import tqdm as notebook_tqdm
nltk.download('stopwords', download_dir='C:/Users/ramirolobo/nltk_data')
nltk.download('punkt', download_dir='C:/Users/ramirolobo/nltk_data')
nltk.data.path.append('C:/Users/ramirolobo/nltk_data')
      [nltk_data] Downloading package stopwords to
      [nltk data]
                         C:/Users/ramirolobo/nltk data...
      [nltk_data]
                       Package stopwords is already up-to-date!
      [nltk_data] Downloading package punkt to
      [nltk_data]
                         C:/Users/ramirolobo/nltk data...
      [nltk_data]
                      Package punkt is already up-to-date!
#load texts
text_chunks = pd.read_csv("data/text_chunks.csv")
texts = text_chunks["text"].tolist()
#define stopwords
stop_words = set(stopwords.words('english'))
custom_stopwords = {
    tom_stopwords = {
  "chapter", "book", "section", "article",
  "i", "iii", "iii", "iv", "v", "vii", "vii",
  "ix", "xi", "xii", "xiii", "xiv", "xv", "xvi", "xvii",
  "xviii", "xix", "xx", "xxii", "xxiii", "xxivi", "xxv",
  "xxvi", "xxvii", "xxviii", "xxiii", "xxxiii",
  "xxxiv", "xxxvi, "xxxviii", "xxxviii", "xxxiix",
  "xxxiv", "xxxvi, "xxxvii", "xxxviii", "xxxixi", "xxxix",

all_stopwords = stop_words.union(custom_stopwords)
#function to preprocess text
{\tt def\ preprocess\_text(text):}
    text = text.lower()
    text = re.sub(r"[^a-z\s]", "", text) # remove punctuation and numbers
    words = text.split() # split by whitespace instead of word_tokenize
    filtered_words = [w for w in words if w not in all_stopwords]
    return " ".join(filtered_words)
#apply preprocessing
text_chunks["cleaned_text"] = text_chunks["text"].apply(preprocess_text)
text_chunks.head()
```

_ _ *		Unnamed: 0	author	title	chunk	text	year	century	<pre>cleaned_text</pre>		
	0	1	Arrian	The Anabasis of Alexander\r\nor, The History o	0	the anabasis of alexander	130	2nd c. CE	anabasis alexander		
	1	2	Arrian	The Anabasis of Alexander\r\nor, The History o	1	the anabasis of alexander	130	2nd c. CE	anabasis alexander		
	2	3	Arrian	The Anabasis of Alexander\r\nor, The History o	2	or the history of the wars and conquests of	130	2nd c. CE	history wars conquests alexander great		
	3	4	Arrian	The Anabasis of Alexander\r\nor, The History o	3	literally translated with a commentary from th	130	2nd c. CE	literally translated commentary greek arrian n		
	4	5	Arrian	The Anabasis of Alexander\r\nor,	4	e j chinnock ma Ilb london rector	130	2nd c.	e j chinnock llb london rector		

```
cleaned_texts = text_chunks["cleaned_text"].dropna().tolist()

#get vectorizer model to remove any residual stopwords
vectorizer_model = CountVectorizer(stop_words="english")

#fit BERTopic model
topic_model = BERTopic(
    #vectorizer_model=vectorizer_model,
```

```
#calculate_probabilities=True,
    #verbose=True,
    #nr_topics="auto",  # Automatically determine the number of topics
    #language="english"  # Specify the language for stopwords
)

topics, probs = topic_model.fit_transform(cleaned_texts)

#topic_model.save("bertopic_model")  #save model
topic_model = BERTopic.load("bertopic_model")  # load model

topics = topic_model.get_topic_info()
#topics.to_csv("data/topics.csv", index=False)

#avoid training model each time
topics = pd.read_csv("data/topics.csv")

# top 15 topics
topics.loc[1:20, :]
```

	. , ,		•			
_		Topic	Count	Name	Representation	Representative_Docs
	1	0	4446	0_french_english_england_france	[french, english, england, france, ships, sea,	[advantage wind english day fortyfour ships ac
	2	1	2679	1_athenians_lacedaemonians_athens_athenian	[athenians, lacedaemonians, athens, athenian,	[terms armistice ships delivered number sixty $\hdots \hdots$
	3	2	928	2_operations_lines_strategic_line	[operations, lines, strategic, line, point, en	[front operations space separates two armies $$\textsc{u}_{\cdot\cdot\cdot}$$
	4	3	921	3_theory_mind_must_us	[theory, mind, must, us, may, things, therefor	[influence theoretical principles upon real li
	5	4	554	4_sun_wu_tz_chi	[sun, wu, tz, chi, yu, tsao, chinese, chang, c	[return elder sun tz mentioned two passages sh
	6	5	353	5_object_war_destruction_therefore	[object, war, destruction, therefore, politica	[destruction enemys military force leading pri
	7	6	311	6_river_indus_called_rivers	[river, indus, called, rivers, name, hebrew, e	[unquestionable therefore let record indus lar
	8	7	307	7_eordaea_rha_ulm_crateas	[eordaea, rha, ulm, crateas, ariaspians, mount	[ulm magnesia victory malplaquet, peithon son
	9	8	177	8_military_generals_general_spirit	[military, generals, general, spirit, virtue,	[assistance military virtue parts genius comma
	10	9	177	9_darius_persians_alexander_persian	[darius, persians, alexander, persian, king, g	[reflections fate darius alexander sent body d
	11	10	174	10_rhine_archduke_austrians_austrian	[rhine, archduke, austrians, austrian, danube,	[leaving austria rear russia front austria lau
	12	11	171	11_divisions_battalions_columns_deployed	[divisions, battalions, columns, deployed, col	[whole armies deployed skirmishers still neces
	13	12	149	12_wall_mound_engines_towers	[wall, mound, engines, towers, walls, stones,	[round city able bring military engines walls

Topics seems to primarily identify authors rather than common themes between them.

```
topic_model.get_representative_docs(topics)
```

```
{-1: ['mahan december', 'dumfries december',
```

```
2: ['notice', 'disastrous', 'index']}
```

```
#topics over time
timestamps = text_chunks['year'].tolist()
```

^{&#}x27;january thirty twentytwo april thirty twenty difference time trincomalee saints nine hours half'],

^{0: [&#}x27;varus general horse man uncommon spirit skill encouraged men pursuing enemy disposed troops convenient places rest gave battle enemy enemys cavalry made bold stand foot relieving making general halt assist horse battle',

^{&#}x27;austrians directed operations upon meuse sarre moselle concert prussians part useless army upper rhine force one hundred twenty thousand men flanks protected troops could pushed forward even probable without changing direction war',

^{&#}x27;result first combat wiped account possible stop first success put second part battle coming day even king lost advantages first would always set second'],

^{1: [&#}x27;advantage wind english day fortyfour ships action dutch eighty many english said larger two fleets passed opposite tacks english windward tromp rear seeing dutch order battle badly formed ships two three lines overlapping',

time arrived strong english squadron six shipsoftheline admiral hughes absence similar french force gave entire control sea english arrival suffren nearly three years later mean holland drawn war stations negapatam',

^{&#}x27;england sea hour fast approaching great colonial expeditions made last year war illustrious triumph sea power england france spain united first'],

```
topics_over_time = topic_model.topics_over_time(cleaned_texts, timestamps=timestamps, nr_bins=7, global_tuning=False)

#visualize topics over time
topics_over_time_vis = topic_model.visualize_topics_over_time(topics_over_time)
topics_over_time_vis

#another topic model with fixed number of topics
topic_model_2 = BERTopic(nr_topics=50)
topics_2, probs_2 = topic_model_2.fit_transform(cleaned_texts)
```

```
KevboardInterrupt
                                                                                                                                                           Traceback (most recent call last)
Cell In[13], line 3
                       1 #another topic model with fixed number of topics
                      2 topic_model_2 = BERTopic(nr_topics=50)
----> 3 topics_2, probs_2 = topic_model_2.fit_transform(cleaned_texts)
File c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\site-packages\bertopic\_bertopic.py:454, in
BERTopic.fit_transform(self, documents, embeddings, images, y)
                                            logger.info("Embedding - Transforming documents to embeddings.")
               452
                                              self.embedding_model = select_backend(self.embedding_model, language=self.language, verbose=self.verbose)
               453
                                             embeddings = self._extract_embeddings(
  --> 454
               455
                                                            documents.Document.values.tolist(),
               456
                                                            images=images,
                                                           method="document",
               457
                                                           verbose=self.verbose.
               458
               459
                                            logger.info("Embedding - Completed \u2713")
               460
               461 else:
\label{programs python loss} File c:\Users\raminolobo\AppData\Local\Programs\Python\Python\212\Lib\site-packages\bertopic\_bertopic\py:3711, in the program of the progra
BERTopic._extract_embeddings(self, documents, images, method, verbose)
                                            embeddings = self.embedding_model.embed_words(words=documents, verbose=verbose)
           3710 elif method == "document":
                                            embeddings = self.embedding_model.embed_documents(documents, verbose=verbose)
  -> 3711
           3712 elif documents[0] is None and images is None:
           3713
                                            raise ValueError(
           3714
                                                             "Make sure to use an embedding model that can either embed documents"
           3715
                                                             "or images depending on which you want to embed.'
           3716
                                            )
\label{local_Programs_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python_Python
BaseEmbedder.embed_documents(self, document, verbose)
                  50 def embed_documents(self, document: List[str], verbose: bool = False) -> np.ndarray:
                   51
                                              """Embed a list of n words into an n-dimensional
                                            matrix of embeddings.
                  52
                  53
           (…)
                                             that each have an embeddings size of `m`
                  60
                  61
---> 62
                                            return self.embed(document, verbose)
File c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\site-
packages \verb|\bertopic| backend \verb|\colored| sentence transformers.py: 84, in Sentence Transformer Backend.embed (self, documents, verbose) | the sentence transformer Backend and the sentence trans
                  72 def embed(self, documents: List[str], verbose: bool = False) -> np.ndarray:
                                               """Embed a list of n documents/words into an n-dimensional
                  73
                                            matrix of embeddings.
                  74
                  75
           (\ldots)
                  82
                                                          that each have an embeddings size of `m`
                  83
                                            embeddings = self.embedding_model.encode(documents, show_progress_bar=verbose)
 ---> 84
                  85
File c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\site-
packages\sentence transformers\SentenceTransformer.py:685, in SentenceTransformer.encode(self, sentences, prompt name, prompt,
batch_size, show_progress_bar, output_value, precision, convert_to_numpy, convert_to_tensor, device, normalize_embeddings,
  **kwargs)
               682 features.update(extra_features)
               684 with torch.no_grad():
 --> 685
                                            out_features = self.forward(features, **kwargs)
               686
                                             if self.device.type == "hpu":
                                                           out_features = copy.deepcopy(out_features)
File c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\site-
packages\sentence_transformers\SentenceTransformer.py:758, in SentenceTransformer.forward(self, input, **kwargs)
                                            module_kwarg_keys = self.module_kwargs.get(module_name, [])
               756
                                           module_kwargs = {key: value for key, value in kwargs.items() if key in module_kwarg_keys}
input = module(input, **module_kwargs)
               757
--> 758
               759 return input
\label{lem:file:c:site-packages hord} File: c:\Users\raminolobo\AppData\Local\Programs\Python\Python312\Lib\Site-packages\torch\nn\modules\module.py:1751, in the control of the control
Module._wrapped_call_impl(self, *args, **kwargs)
           1749
                                          return self._compiled_call_impl(*args, **kwargs) # type: ignore[misc]
           1750 else:
                                           return self._call_impl(*args, **kwargs)
-> 1751
\label{thm:policy} File c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\Site-packages\torch\nn\modules\module.py:1762, in the program of t
Module._call_impl(self, *args, **kwargs)
           1757 # If we don't have any hooks, we want to skip the rest of the logic in
           1758 # this function, and just call forward.
           1759 if not (self._backward_hooks or self._backward_pre_hooks or self._forward_hooks or self._forward_pre_hooks
                                                           or _global_backward_pre_hooks or _global_backward_hooks
           1760
           1761
                                                           or _global_forward_hooks or _global_forward_pre_hooks):
                                            return forward_call(*args, **kwargs)
  -> 1762
           1764 result = None
           1765 called_always_called_hooks = set()
\label{localProgramsPythonPython312Lib} File c: \Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\Site-Programs\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Py
packages\sentence_transformers\models\Transformer.py:442, in Transformer.forward(self, features, **kwargs)
```

```
435 """Returns token_embeddings, cls_token"""
           436 trans features = {
           437
                                  key: value
           438
                                  for key, value in features.items()
           439
                                  if key in ["input_ids", "attention_mask", "token_type_ids", "inputs_embeds"]
           440 }
 --> 442 outputs = self.auto_model(**trans_features, **kwargs, return_dict=True)
           443 token_embeddings = outputs[0]
           444 features["token_embeddings"] = token_embeddings
File c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\site-packages\torch\nn\modules\module.py:1751, in
Module._wrapped_call_impl(self, *args, **kwargs)
                                 return self._compiled_call_impl(*args, **kwargs) # type: ignore[misc]
        1749
        1750 else:
-> 1751
                                  return self._call_impl(*args, **kwargs)
File c: \Users \rownoodules \modules 
Module._call_impl(self, *args, **kwargs)
        1757 # If we don't have any hooks, we want to skip the rest of the logic in
         1758 # this function, and just call forward.
         1759 \ \text{if not (self.\_backward\_pre\_hooks or self.\_forward\_pre\_hooks or s
         1760
                                              or _global_backward_pre_hooks or _global_backward_hooks
        1761
                                              or _global_forward_hooks or _global_forward_pre_hooks):
                                  return forward_call(*args, **kwargs)
 -> 1762
        1764 result = None
         1765 called_always_called_hooks = set()
\label{localProgramsPythonPython312Lib} File \ c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\Site-Programs\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\P
packages\transformers\models\bert\modeling_bert.py:1144, in BertModel.forward(self, input_ids, attention_mask, token_type_ids,
position_ids, head_mask, inputs_embeds, encoder_hidden_states, encoder_attention_mask, past_key_values, use_cache,
output_attentions, output_hidden_states, return_dict)
        1137 # Prepare head mask if needed
         1138 # 1.0 in head_mask indicate we keep the head
        1139 # attention_probs has shape bsz x n_heads x N x N
         1140 # input head_mask has shape [num_heads] or [num_hidden_layers x num_heads]
         1141 # and head_mask is converted to shape [num_hidden_layers x batch x num_heads x seq_length x seq_length]
         1142 head_mask = self.get_head_mask(head_mask, self.config.num_hidden_layers)
 -> 1144 encoder_outputs = self.encoder(
        1145
                                  embedding_output,
         1146
                                  attention_mask=extended_attention_mask,
        1147
                                  head mask=head mask,
         1148
                                  encoder_hidden_states=encoder_hidden_states,
        1149
                                  encoder attention mask=encoder extended attention mask,
        1150
                                  past_key_values=past_key_values,
        1151
                                  use_cache=use_cache,
        1152
                                  output_attentions=output_attentions,
        1153
                                  output_hidden_states=output_hidden_states,
         1154
                                  return_dict=return_dict,
         1155 )
         1156 sequence_output = encoder_outputs[0]
         1157 pooled_output = self.pooler(sequence_output) if self.pooler is not None else None
File c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\site-packages\torch\nn\modules\module.py:1751, in
Module._wrapped_call_impl(self, *args, **kwargs)
        1749
                                  return self._compiled_call_impl(*args, **kwargs) # type: ignore[misc]
        1750 else:
-> 1751
                                  return self._call_impl(*args, **kwargs)
File c: \Users \ramin olobo \App Data \Local \Programs \Python \312 \Lib \Site-packages \torch \nn \modules \module.py: 1762, in \Lib \Site-packages \Lib \Normal \N
Module._call_impl(self, *args, **kwargs)
         1757 # If we don't have any hooks, we want to skip the rest of the logic in
         1758 # this function, and just call forward.
        1759 if not (self._backward_hooks or self._backward_pre_hooks or self._forward_hooks or self._forward_pre_hooks
        1760
                                              or _global_backward_pre_hooks or _global_backward_hooks
                                              or _global_forward_hooks or _global_forward_pre_hooks):
        1761
-> 1762
                                  return forward_call(*args, **kwargs)
        1764 result = None
         1765 called_always_called_hooks = set()
File c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\site-
packages\transformers\models\bert\modeling_bert.py:695, in BertEncoder.forward(self, hidden_states, attention_mask, head_mask,
encoder_hidden_states, encoder_attention_mask, past_key_values, use_cache, output_attentions, output_hidden_states,
return dict)
                                  layer_outputs = self._gradient_checkpointing_func(
           684
           685
                                              layer_module.__call_
           686
                                              hidden\_states,
         (...)
                                              output_attentions,
           692
           693
                                  )
           694 else:
  --> 695
                                  layer_outputs = layer_module(
           696
                                              hidden_states,
           697
                                              attention mask.
           698
                                              layer_head_mask,
           699
                                              encoder_hidden_states,
           700
                                              encoder_attention_mask,
           701
                                              past_key_value,
           702
                                              output_attentions,
           703
           705 hidden_states = layer_outputs[0]
            706 if lice rache
```

```
/ou ii use caciie.
  1750 else:
-> 1751
  1760
  1761
-> 1762
   628
   629 )
   250
   251
```

```
Module. wrapped call impl(self, *args, **kwargs)
                                           return self. compiled call impl(*args, **kwargs) # type: ignore[misc]
                                           return self._call_impl(*args, **kwargs)
Module._call_impl(self, *args, **kwargs)
           1757 # If we don't have any hooks, we want to skip the rest of the Logic in
           1758 # this function, and just call forward.
           1759 if not (self._backward_hooks or self._backward_pre_hooks or self._forward_hooks or self._forward_pre_hooks
                                                          or _global_backward_pre_hooks or _global_backward_hooks
                                                          or global_forward_hooks or _global_forward_pre_hooks):
                                            return forward_call(*args, **kwargs)
          1764 result = None
          1765 called_always_called_hooks = set()
File c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\site-
packages \verb|\transformers| models mo
encoder_hidden_states, encoder_attention_mask, past_key_value, output_attentions)
                                            cross_attn_present_key_value = cross_attention_outputs[-1]
                                           present_key_value = present_key_value + cross_attn_present_key_value
  --> 627 layer_output = apply_chunking_to_forward(
                                         self.feed_forward_chunk, self.chunk_size_feed_forward, self.seq_len_dim, attention_output
              630 outputs = (layer_output,) + outputs
              632 # if decoder, return the attn key/values as the last output
\label{thm:python} File c:\Users\raminolobo\AppData\Local\Programs\Python\Python312\Lib\Site-packages\transformers\pytorch\_utils.py:253, in the program of the program of
apply_chunking_to_forward(forward_fn, chunk_size, chunk_dim, *input_tensors)
                                            # concatenate output at same dimension
                                            return torch.cat(output_chunks, dim=chunk_dim)
--> 253 return forward_fn(*input_tensors)
File c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\site-
packages\transformers\models\bert\modeling_bert.py:640, in BertLayer.feed_forward_chunk(self, attention_output)
              638 def feed_forward_chunk(self, attention_output):
              639
                                           intermediate_output = self.intermediate(attention_output)
--> 640
                                           layer_output = self.output(intermediate_output, attention_output)
              641
                                           return layer_output
File c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\Site-packages\torch\nn\modules\module.py:1751, in the control of the c
Module._wrapped_call_impl(self, *args, **kwargs)
                                    return self._compiled_call_impl(*args, **kwargs) # type: ignore[misc]
           1750 else:
                                          return self. call impl(*args, **kwargs)
 -> 1751
\label{thm:policy} File c:\Users\rown\end{thm} File c:\Users\rown\end{thm:policy} Thon\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Pyth
Module._call_impl(self, *args, **kwargs)
          1757 # If we don't have any hooks, we want to skip the rest of the logic in
           1758 # this function, and just call forward.
           1759 if not (self._backward_hooks or self._backward_pre_hooks or self._forward_hooks or self._forward_pre_hooks
                                                          or _global_backward_pre_hooks or _global_backward_hooks
          1760
          1761
                                                          or _global_forward_hooks or _global_forward_pre_hooks):
                                           return forward_call(*args, **kwargs)
 -> 1762
          1764 result = None
          1765 called_always_called_hooks = set()
File c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\site-
packages\transformers\models\bert\modeling_bert.py:552, in BertOutput.forward(self, hidden_states, input_tensor)
              551 def forward(self, hidden_states: torch.Tensor, input_tensor: torch.Tensor) -> torch.Tensor:
                                            hidden_states = self.dense(hidden_states)
 --> 552
              553
                                            hidden_states = self.dropout(hidden_states)
                                            hidden_states = self.LayerNorm(hidden_states + input_tensor)
File c:\Users\ramirolobo\AppData\Local\Programs\Python\Python312\Lib\Site-packages\torch\nn\modules\module.py:1751, in the control of the c
Module._wrapped_call_impl(self, *args, **kwargs)

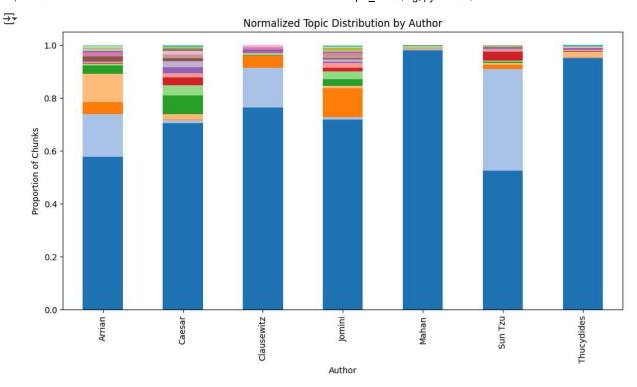
1749 return self._compiled_call_impl(*args, **kwargs) # type: ignore[misc]
           1750 else:
-> 1751
                                           return self._call_impl(*args, **kwargs)
File c: \Users \ ramirolobo \ App Data \ Local \ Programs \ Python \ Python \ 21 \ Lib \ Site-packages \ torch \ Nn \ Modules \ Module. \ py: 1762, in \ Python \ P
Module._call_impl(self, *args, **kwargs)
           1757 # If we don't have any hooks, we want to skip the rest of the logic in
           1758 # this function, and just call forward.
           1759 if not (self._backward_hooks or self._backward_pre_hooks or self._forward_hooks or self._forward_pre_hooks
                                                          \hbox{\tt or \_global\_backward\_pre\_hooks} \ \hbox{\tt or \_global\_backward\_hooks}
          1760
                                           or _global_forward_hooks or _global_forward_pre_hooks):
return forward call(*args. **kwargs)
          1761
-> 1762
```

```
#not meaningful topics
topics_2 = topic_model_2.get_topic_info()
topics_2.head(15)
```

```
\overline{\Sigma}
               Topic Count
                                                                                 Name
                                                                                                                                           Representation
                                                                                                                                                                                                               Representative_Docs
           0
                     -1
                                 10
                                      [conquest difficulties national wars wars inst...
           1
                      0
                               155
                                                        0_disastrous_notice_
                                                                                                                          [disastrous, notice, , , , , , , ]
                                                                                                                                                                                                                    [, notice, disastrous]
           2
                             4448
                                                1_french_english_ships_sea
                                                                                                 [french, english, ships, sea, england, france,...
                                                                                                                                                                               [ship first last might brought action beginnin...
                      2
           3
                          17122
                                                   2_army_one_upon_would [army, one, upon, would, war, men, enemy, may,... [danger could save baggage whole army cohorts ...
#add topics to text_chunks df
document_info = topic_model.get_document_info(cleaned_texts)
text_chunks['topic'] = document_info['Topic']
topic_by_author = (
       text_chunks.groupby("author")["topic"]
       .value_counts()
       .unstack(fill_value=0)
)
topic_by_author
 \overline{\Sigma}
                    topic
                                               0
                                                                                                                         ... 72 73 74 75 76 77 78 79
                                    -1
                  author
              Arrian
                                1858
                                             66
                                                       157
                                                                  2
                                                                         43
                                                                                  10
                                                                                             1
                                                                                                 287
                                                                                                          292
                                                                                                                                   12
                                                                                                                                           0
                                                                                                                                                  0
                                                                                                                                                         0
                                                                                                                                                               1
                                                                                                                                                                     11
                                                                                                                                                                             0
                                                                                                                                                                                    0
                                                                                                                                                                                         11
                                                                                                                                                                                                 3
              Caesar
                                1916
                                            135
                                                        37
                                                                 12
                                                                         58
                                                                                   16
                                                                                             0
                                                                                                              4
                                                                                                                     4
                                                                                                                                    0
                                                                                                                                           0
                                                                                                                                                  0
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                                                                                                                                                               9
                                                                                                                                                                      0
                                                                                                                                                                            10
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                                                                                                                                                                                                 0
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                                                                                                                                                               n
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                                                                                                                                                                                                 O
           Clausewitz
                                 934
                                             30
                                                          2
                                                               258
                                                                        444
                                                                                    1
                                                                                         324
                                                                                                      1
                                                                                                              0
                                                                                                                  76
                                                                                                                                    0
                                                                                                                                                         0
                                                                                                                                                                             0
                                                                                                                                                                                    0
                                1616
                                            247
                                                        28
                                                                         43
                                                                                    6
                                                                                                              7
                                                                                                                   61
                                                                                                                                         10
                                                                                                                                                                             0
                                                                                                                                                                                           0
                                                                                                                                                                                                 6
              Jomini
                                                               521
                                                                                           11
                                                                                                                                    0
                                                                                                                                                  1
                                                                                                                                                               0
                                                                                                                                                                                  11
              Mahan
                                  299
                                           3782
                                                        10
                                                                 39
                                                                         41
                                                                                    8
                                                                                             8
                                                                                                      1
                                                                                                              2
                                                                                                                   12
                                                                                                                                    0
                                                                                                                                           2
                                                                                                                                                  0
                                                                                                                                                         0
                                                                                                                                                               0
                                                                                                                                                                      0
                                                                                                                                                                             0
                                                                                                                                                                                    0
                                                                                                                                                                                           0
                                                                                                                                                                                                 0
             Sun Tzu
                                  560
                                             21
                                                          3
                                                                 83
                                                                         42
                                                                                512
                                                                                             5
                                                                                                     0
                                                                                                              2
                                                                                                                   18
                                                                                                                                    0
                                                                                                                                           0
                                                                                                                                                  0
                                                                                                                                                         1
                                                                                                                                                               0
                                                                                                                                                                      0
                                                                                                                                                                             1
                                                                                                                                                                                    0
                                                                                                                                                                                           0
                                                                                                                                                                                                 2
           Thucydides
                                  702
                                            165
                                                     2442
                                                                 13
                                                                        250
                                                                                             4
                                                                                                      4
                                                                                                              0
                                                                                                                     5
                                                                                                                                    0
                                                                                                                                           0
                                                                                                                                                  9
                                                                                                                                                                             0
                                                                                                                                                                                    0
                                                                                                                                                                                           0
                                                                                                                                                                                                 0
         7 rows × 83 columns
#topics with more than n occurrences across all chunks
n = 100
top_topics = topics[topics["Count"] > n]["Topic"].tolist()
top_topics.remove(15) # exclude noisy topic 15
top_topics = top_topics[1:] # exclude noisy topic -1
#get top topics by author
top_topics_by_author = topic_by_author[top_topics]
# convert to proportion of total document counts per topic belonging to each author
topics_by_author_norm = topic_by_author.div(topic_by_author.sum(axis=1), axis=0)
top\_topics\_by\_author\_norm = top\_topics\_by\_author.div(top\_topics\_by\_author.sum(axis=1), \ axis=0) \ \# \ get \ top \ topics \ by \ author \ normalized \ average \ for \ average \ for \ f
top_topics_by_author_norm.head(10)
 \rightarrow
                                           0
                                                                             2
                                                                                                                               5
                                                                                                                                                6
                                                                                                                                                                                  8
                                                                                                                                                                                                                 10
                   topic
                                                            1
                                                                                              3
                                                                                                                                                                                                                                  11
                  author
              Arrian
                               0.000680 0.0278
                               0.239362
                                               0.065603
                                                                0.021277
                                                                                 0.102837
                                                                                                  0.028369
                                                                                                                   0.000000
                                                                                                                                   0.030142
                                                                                                                                                    0.007092
                                                                                                                                                                     0.007092
                                                                                                                                                                                      0.000000
                                                                                                                                                                                                      0.001773
                                                                                                                                                                                                                       0.000000
                                                                                                                                                                                                                                         0.1117
              Caesar
           Clausewitz
                               0.025840
                                                0.001723
                                                               0.222222
                                                                                0.382429
                                                                                                  0.000861
                                                                                                                   0.279070
                                                                                                                                   0.000861
                                                                                                                                                     0.000000
                                                                                                                                                                     0.065461
                                                                                                                                                                                      0.000861
                                                                                                                                                                                                       0.016365
                                                                                                                                                                                                                        0.003445
                                                                                                                                                                                                                                        0.0000
                               0.198075 0.022454
                                                                0.417803
                                                                                0.034483
                                                                                                  0.004812 0.008821
                                                                                                                                    0.000802
                                                                                                                                                     0.005613
                                                                                                                                                                     0.048917
                                                                                                                                                                                      0.000802
                                                                                                                                                                                                      0.121893
                                                                                                                                                                                                                        0.129912 0.0016
              Jomini
                               0.967511
                                                0.002558
                                                                 0.009977
                                                                                  0.010489
                                                                                                   0.002047
                                                                                                                   0.002047
                                                                                                                                    0.000256
                                                                                                                                                     0.000512
                                                                                                                                                                     0.003070
                                                                                                                                                                                      0.000000
                                                                                                                                                                                                       0.000512
                                                                                                                                                                                                                        0.000256
              Mahan
                                                                                                                                                                                                                                         0.0000
             Sun Tzu
                               0.030043 0.004292
                                                                 0.118741
                                                                                  0.060086
                                                                                                  0.732475
                                                                                                                   0.007153
                                                                                                                                    0.000000
                                                                                                                                                     0.002861
                                                                                                                                                                     0.025751
                                                                                                                                                                                      0.000000
                                                                                                                                                                                                      0.000000
                                                                                                                                                                                                                        0.002861
                                                                                                                                                                                                                                         0.0114
           Thucydides 0.056352 0.834016 0.004440
                                                                                0.085383 0.000342 0.001366 0.001366
                                                                                                                                                   0.000000 0.001708
                                                                                                                                                                                      0.001025
                                                                                                                                                                                                      0.000000
                                                                                                                                                                                                                       0.000342
                                                                                                                                                                                                                                        0.0119
```

import matplotlib.pyplot as plt
#topics by author

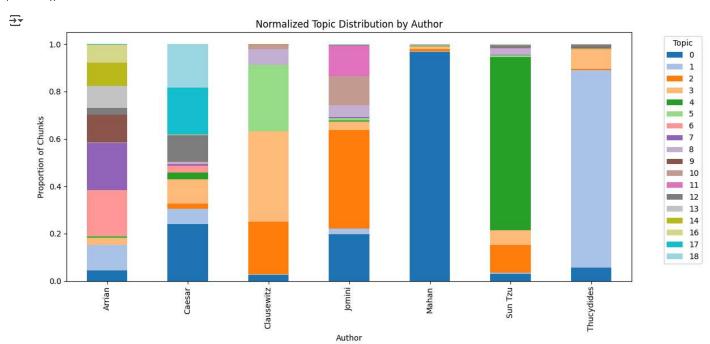
```
topics_by_author_norm.plot(kind='bar', stacked=True, colormap='tab20', figsize=(12, 6))
plt.title("Normalized Topic Distribution by Author")
plt.xlabel("Author")
plt.ylabel("Proportion of Chunks")
plt.legend(title="Topic", bbox_to_anchor=(1.05, 1), loc='upper left')
plt.tight_layout()
plt.show()
```



Topic -1 0 1



```
#top topics by author
top_topics_by_author_norm.plot(kind='bar', stacked=True, colormap='tab20', figsize=(12, 6))
plt.title("Normalized Topic Distribution by Author")
plt.xlabel("Author")
plt.ylabel("Proportion of Chunks")
plt.legend(title="Topic", bbox_to_anchor=(1.05, 1), loc='upper left')
plt.tight_layout()
plt.show()
```



Almost all of Mahan's documents texts under topic 0. Similarly, for Thucydides almost all topics fall under Topic 1 and for Sun Tzu almost all of his texts fall under Topic 4. For the remaining four authors, there is a larger degree of variation in the topics their texts were classified. Clausewitz's texts largely fall under topics 2, 3, and 5. Jomini's primarily fall under topics 0, 2, 10, and 11.

top_topics_by_author

_	topic	0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	16	17	18
	author																		
	Arrian	66	157	2	43	10	1	287	292	1	172	0	1	41	139	143	115	1	0
	Caesar	135	37	12	58	16	0	17	4	4	0	1	0	63	0	0	2	112	103
	Clausewitz	30	2	258	444	1	324	1	0	76	1	19	4	0	0	1	0	0	0
	Jomini	247	28	521	43	6	11	1	7	61	1	152	162	2	2	0	1	1	1
	Mahan	3782	10	39	41	8	8	1	2	12	0	2	1	0	1	1	0	0	1
	Sun Tzu	21	3	83	42	512	5	0	2	18	0	0	2	8	0	0	2	0	1
	Thucydides	165	2442	13	250	1	4	4	0	5	3	0	1	35	4	0	1	0	0

topic_by_author = topic_by_author.drop(-1, axis=1)

```
author_by_topic_norm = topic_by_author.div(topic_by_author.sum(axis=0), axis=1).T
author_by_top_topics = author_by_topic_norm.loc[top_topics, :]
```

author_by_top_topics

	author topic			Mahan	Sun Tzu	Thucydides			
	0	0.014845	0.030364	0.006748	0.055556	0.850652	0.004723	0.037112	
	1	0.058604	0.013811	0.000747	0.010452	0.003733	0.001120	0.911534	
	2	0.002155	0.012931	0.278017	0.561422	0.042026	0.089440	0.014009	
	3	0.046688	0.062975		0.045603	0.271444			
	4	0.018051	0.028881	1 0.001805 0.010830 0.014440 0.924188		0.924188	0.001805		
	5	0.002833	0.000000 0.917847 0.031161 0.022663 0		0.014164	0.011331			
	6	0.922830	0.054662	0.003215	0.003215	0.003215	0.000000	0.012862	
	7	0.951140	0.013029	0.000000	0.022801	0.006515	0.006515	0.000000	
	8	0.005650	0.022599	0.429379	0.344633	0.067797	0.101695	0.028249	
	9	0.971751	0.000000	0.005650	0.005650	0.000000	0.000000	0.016949	
	10	0.000000	0.005747	0.109195	0.873563	0.011494	0.000000	0.000000	
	11	0.005848	0.000000	0.023392	0.947368	0.005848	0.011696	0.005848	
	12	0.275168	0.422819	0.000000	0.013423	0.000000	0.053691	0.234899	
	13	0.952055	0.000000	0.000000	0.013699	0.006849	0.000000	0.027397	
	14	0.986207	0.000000	0.006897	0.000000	0.006897	0.000000	0.000000	
	16	0.950413	0.016529	0.000000	0.008264	0.000000	0.016529	0.008264	
	17	0.008772	0.982456	0.000000	0.008772	0.000000	0.000000	0.000000	
	18	0.000000	0.971698	0.000000	0.009434	0.009434	0.009434	0.000000	

```
author_by_top_topics.plot(
    kind='bar',
    stacked=True,
    colormap='tab20',
    figsize=(12, 6)
)

plt.title("Normalized Author Distribution for Top Topics")
plt.xlabel("Topic") # <-- Corrected
plt.ylabel("Proportion of Text Assigned to the Topic from Each Author") # <-- Corrected
plt.legend(title="Author", bbox_to_anchor=(1.05, 1), loc='upper left')
plt.tight_layout()
plt.show()</pre>
```