CWordTM Toolkit Usage on the Holy Bible (CUV)

This Jupyter notebook demonstrates how to use the package "CWordTM" on the Holy Bible (Chinese Union Version - Traditional Chinese):

1. Utility Features

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- 2. Text Visualization Word Cloud
- 3. Text Summarization
- 4. Pivot Table
- 5. OT Quotes
- 6. Topic Modeling LDA and BERTopic

```
In [1]: # Import the Package CWordTM
        import cwordtm
        from cwordtm import *
        [nltk_data] Downloading package stopwords to
        [nltk data]
                        C:\Users\johnnyc\AppData\Roaming\nltk_data...
                      Package stopwords is already up-to-date!
        [nltk_data]
        [nltk_data] Downloading package wordnet to
        [nltk_data]
                       C:\Users\johnnyc\AppData\Roaming\nltk_data...
        [nltk_data]
                      Package wordnet is already up-to-date!
        [nltk_data] Downloading package punkt to
        [nltk_data]
                        C:\Users\johnnyc\AppData\Roaming\nltk_data...
        [nltk_data]
                      Package punkt is already up-to-date!
        [nltk_data] Downloading package averaged_perceptron_tagger to
        [nltk_data]
                        C:\Users\johnnyc\AppData\Roaming\nltk_data..
        [nltk_data]
                      Package averaged_perceptron_tagger is already up-to-
        [nltk_data]
```

1. Utility Features

```
In [2]: # Load the whole Bible
        bible = "cuv.csv"
        cdf = util.load_word(bible, info=True)
        Loading file 'D:\Dev\Anaconda3\lib\site-packages\cwordtm\data\cuv.csv' ...
        Dataset Information:
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 31102 entries, 0 to 31101
        Data columns (total 9 columns):
         # Column
                     Non-Null Count Dtype
         0 book
                        31102 non-null object
         1 book_no
                        31102 non-null int64
            chapter
                        31102 non-null int64
         3 verse
                        31102 non-null int64
         4 text 31102 non-null object 5 testament 31102 non-null int64
           category 31102 non-null object
            cat
                        31102 non-null object
         8 cat no
                        31102 non-null int64
        dtypes: int64(5), object(4)
        memory usage: 2.1+ MB
```

Extract Partial Scripture

```
In [3]: # Extract OT Scripture
  otdf = util.extract(cdf, testament=0)
  otdf.head()
```

Out[3]:		book	book_no	chapter	verse	text	testament	category	cat	cat_no
	0	Gen	1	1	1	起初 神創造天地。	0	Torah	tor	0
	1	Gen	1	1	2	地是空虛混沌. 淵面黑暗. 神的靈運行在水面上。	0	Torah	tor	0
	2	Gen	1	1	3	神說、要有光、就有了光。	0	Torah	tor	0
	3	Gen	1	1	4	神看光是好的、就把光暗分開了。	0	Torah	tor	0
	4	Gen	1	1	5	神稱光為畫、稱暗為夜. 有晚上、有早晨、這是頭一日。	0	Torah	tor	0

```
In [4]: # Extract Gospels (The first four book in NT)
gos = util.extract(cdf, category='gos')
```

```
gos.head()
Out[4]:
            book book no chapter verse
                                                                         text testament category cat cat no
                                   亞伯拉罕的後裔、大衛的子孫、耶穌基督的家譜. 〔後裔子孫原文
       23145
             Mat
                     40
                                                                                       Gospel gos
                                                                                                   5
                                                                  都作兒子下同〕
       23146
                     40
                                         亞伯拉罕生以撒. 以撒生雅各. 雅各生猶大和他的弟兄.
                                                                                                   5
             Mat
                                                                                       Gospel gos
                                   猶大從他瑪氏生法勒斯和謝拉. 法勒斯生希斯崙. 希斯崙生亞蘭.
       23147
             Mat
                     40
                            1
                                 3
                                                                                                   5
                                                                                       Gospel gos
                                             亞蘭生亞米拿達. 亞米拿達生拿順. 拿順生撒門.
       23148
             Mat
                     40
                                                                                       Gospel gos
                                     撒門從喇合氏生波阿斯. 波阿斯從路得氏生俄備得. 俄備得生耶
                     40
                                                                                                   5
       23149
                                                                                       Gospel gos
             Mat
In [5]: # Extract the Book of Romans
       rom = util.extract(cdf, book='Rom')
       rom.head()
            book book no chapter verse
                                                                      text testament
                                                                                     category cat cat_no
                                                                                      Pauline
       27930
            Rom
                     45
                                      耶穌基督的僕人保羅、奉召為使徒、特派傳 神的福音.
                                                                                                   7
                                                                                      Epistles
                                                                                      Pauline
                                                                                            pau
                                          這福音是 神從前藉眾先知、在聖經上所應許的、
       27931
             Rom
                     45
                            1
                                 2
                                                                                1
                                                                                                   7
                                                                                      Epistles
                                                                                      Pauline
                            1
                                    論到他兒子我主耶穌基督. 按肉體說、是從大衛後裔生的、
                                                                                1
                                                                                                   7
       27932
                     45
                                 3
             Rom
                                                                                            pau
                                                                                      Epistles
                                                                                      Pauline
       27933
                                    按聖善的靈說、因從死裡復活、以大能顯明是神的兒子。
             Rom
                     45
                            1
                                                                                1
                                                                                            pau
                                                                                      Epistles
                                    我們從他受了恩惠、並使徒的職分、在萬國之中叫人為他的
                                                                                      Pauline
       27934
                            1
                                 5
                     45
                                                                                            pau
                                                                                                   7
                                                                名信服直道。
                                                                                      Epistles
In [6]: # Extract Verse 28 of Chapter 8 of Romans
       rom8_28 = util.extract(cdf, book='Rom', chapter=8, verse=28)
       rom8_28.text
             我們曉得萬事都互相效力、叫愛神的人得益處、就是按他旨意被召的人。
       28143
      Name: text, dtype: object
In [7]: # Another way to extract Rom 8:28
       rom8_28 = util.extract2(cdf, filter='Rom 8:28')
       rom8_28.text
              我們曉得萬事都互相效力、叫愛神的人得益處、就是按他旨意被召的人。
       Name: text, dtype: object
In [8]: # Extract Rom 8:1~10
       rom8_1_10 = util.extract2(cdf, filter='Rom 8:1-10')
       list(rom8_1_10.text)
      ['如今那些在基督耶穌裡的、就不定罪了。'
Out[8]:
        '因為賜生命聖靈的律、在基督耶穌裡釋放了我、使我脫離罪和死的律了。'
        '律法既因肉體軟弱、有所不能行的、\u3000神就差遣自己的兒子、成為罪身的形狀、作了贖罪祭、在肉體中定了罪案.'<mark>,</mark>
        '使律法的義、成就在我們這不隨從肉體、只隨從聖靈的人身上。
        '因為隨從肉體的人、體貼肉體的事. 隨從聖靈的人、體貼聖靈的事。',
        '體貼肉體的就是死. 體貼聖靈的乃是生命平安.
        '原來體貼肉體的、就是與\u3000神為仇. 因為不服\u3000神的律法、也是不能服。',
        '而且屬肉體的人、不能得\u3000神的喜歡。'
        '如果\u3000神的靈住在你們心裡、你們就不屬肉體、乃屬聖靈了. 人若沒有基督的靈、就不是屬基督的。',
        '基督若在你們心裡、身體就因罪而死、心靈卻因義而活. ']
       2. Text Visualization - Word Cloud
In [9]: # Extract the NT Scripture for Word Cloud
       text_list = util.get_text_list(cdf[cdf.testament==1]) # Load New Testament Scripture
       text_list[:10]
      ['亞伯拉罕的後裔、大衛的子孫、耶穌基督的家譜. 〔後裔子孫原文都作兒子下同〕',
Out[9]:
```

```
In [9]: # Extract the NT Scripture for Word Cloud text_list = util.get_text_list(cdf[cdf.testament==1]) # load New Testament Scripture text_list[:10]

Out[9]: ['亞伯拉罕的後裔、大衛的子孫、耶穌基督的家譜. [後裔子孫原文都作兒子下同]', '亞伯拉罕生以撒. 以撒生雅各. 雅各生猶大和他的弟兄.', '遊大從他瑪氏生法勒斯和謝拉. 法勒斯生希斯崙. 希斯崙生亞蘭.', '亞蘭生亞米拿達. 亞米拿達生拿順.拿順生撒門.', '撒門從喇合氏生波阿斯. 波阿斯從路得氏生俄備得. 俄備得生耶西.', '耶西生大衛王。大衛從鳥利亞的妻子生所羅門.', '所羅門生羅波安. 羅波安生亞比雅. 亞比雅生亞撒.', '亞撒生約沙法. 約沙法生約蘭. 約蘭生鳥西亞.', '鳥西亞生約坦. 約坦生亞哈斯. 亞哈斯生希西家.', '希西家生瑪拿西. 瑪拿西生亞們. 亞們生約西亞.']

In [10]: # White background with no image mask viz.chi wordcloud(text list)
```

Building prefix dict from the default dictionary ...

Loading model from cache C:\Users\johnnyc\AppData\Local\Temp\jieba.cache

Loading Chinese vocabulary 'D:\Dev\Anaconda3\lib\site-packages\cwordtm\data\bible_vocab.txt' ...

Loading model cost 0.529 seconds.

Prefix dict has been built successfully.

Building prefix dict from D:\Dev\Anaconda3\lib\site-packages\cwordtm\dictionary\dict.txt.big.txt ...

Prefix dict has been built successfully.

D:\Dev\Anaconda3\lib\site-packages\wordcloud\wordcloud.py:106: MatplotlibDeprecationWarning: The get_cmap function w as deprecated in Matplotlib 3.7 and will be removed two minor releases later. Use ``matplotlib.colormaps[name]`` or ``matplotlib.colormaps.get_cmap(obj)`` instead.

self.colormap = plt.cm.get_cmap(colormap)



In [11]: # Use internal image mask

viz.chi_wordcloud(text_list, bg='black', image=1)

Building prefix dict from D:\Dev\Anaconda3\lib\site-packages\cwordtm\dictionary\dict.txt.big.txt ...

Loading model from cache C:\Users\johnnyc\AppData\Local\Temp\jieba.u819f581d122236472c15f14136fc73d9.cache
Loading Chinese vocabulary 'D:\Dev\Anaconda3\lib\site-packages\cwordtm\data\bible_vocab.txt' ...

Loading model cost 0.892 seconds.

Prefix dict has been built successfully.

D:\Dev\Anaconda3\lib\site-packages\wordcloud\wordcloud.py:106: MatplotlibDeprecationWarning: The get_cmap function w as deprecated in Matplotlib 3.7 and will be removed two minor releases later. Use ``matplotlib.colormaps[name]`` or ``matplotlib.colormaps.get_cmap(obj)`` instead.

self.colormap = plt.cm.get_cmap(colormap)



3. Text Summarization

```
In [12]: # Extract and summarize Chapter 8 of Romans
rom8 = util.extract2(cdf, 'Rom 8')
ta.summary_chi(rom8)

Building prefix dict from D:\Dev\Anaconda3\lib\site-packages\cwordtm\dictionary\dict.txt.big.txt ...
Loading model from cache C:\Users\johnnyc\AppData\Local\Temp\jieba.u819f581d122236472c15f14136fc73d9.cache
Loading Chinese vocabulary 'D:\Dev\Anaconda3\lib\site-packages\cwordtm\data\bible_vocab.txt' ...

Loading model cost 0.895 seconds.
Prefix dict has been built successfully.

['因為隨從肉體的人、體貼肉體的事. 隨從聖靈的人、體貼聖靈的事',
'而且屬肉體的人、不能得神的喜歡',
'如果神的靈住在你們心裡、你們就不屬肉體、乃屬聖靈了. 人若沒有基督的靈、就不是屬基督的']
```

4. Pivot Table

Show Bible Scripture Statistics through a Pivot Table

```
In [13]: pivot.stat(cdf, chi=True)
```

Out[13]:

			chapter	verse	text
category	book_no	book			
Torah	1	Gen	50	1533	51460
	2	Exo	40	1213	40057
	3	Lev	27	859	29228
	4	Num	36	1288	41654
	5	Deu	34	959	35904
	•••				
General Epistles	65	Jud	1	25	1030
Sub-Total			34	735	25960
Apocalypse	66	Rev	22	404	15606
Sub-Total			22	404	15606
	Total		1189	31102	1062163

77 rows × 3 columns

5. OT Quotes

Identify Cited Sources in OT Scripture for some NT verses

```
In [14]: rom10 = util.extract2(cdf, 'Rom 10')
                  quot.show_quot(rom10, lang='chi')
                  Building prefix dict from D:\Dev\Anaconda3\lib\site-packages\cwordtm\dictionary\dict.txt.big.txt ...
                  Loading model from cache C:\Users\johnnyc\AppData\Local\Temp\jieba.u819f581d122236472c15f14136fc73d9.cache
                  \label{loss} Loading Chinese vocabulary 'D:\Dev\Anaconda3\lib\site-packages\cwordtm\data\bible\_vocab.txt' \dots and the control of the control 
                  Loading file 'D:\Dev\Anaconda3\lib\site-packages\cwordtm\data\cuv.csv' ...
                  Loading file 'D:\Dev\Anaconda3\lib\site-packages\cwordtm\data\book_categories.csv' ...
                  (1)羅10:5摩西寫著說、『人若行那出於律法的義、就必因此活著。』
                  Loading model cost 0.923 seconds.
                  Prefix dict has been built successfully.
                  (2)羅10:6惟有出於信心的義如此說、『你不要心裡說、誰要升到天上去呢.就是要領下基督來
                  (3)羅 10:8 他到底怎麼說呢. 他說、『這道離你不遠、正在你口裡、在你心裡。』就是我們所傳信主的道。
                  (4)羅10:11經上說、『凡信他的人、必不至於羞愧。』
                  (5)羅10:13因為『凡求告主名的、就必得救。』
                  (6) 羅 10:15 若沒有奉差遣、怎能傳道呢. 如經上所記、『報福音傳喜信的人、他們的腳蹤何等佳美。』
(7) 羅 10:16 只是人沒有都聽從福音. 因為以賽亞說、『主阿、我們所傳的有誰信呢。』
-> 0.6723 賽 53:1 我們所傳的、〔或作所傳與我們的〕有誰信呢. 耶和華的膀臂向誰顯露呢。
                  (8)羅10:18 但我說、人沒有聽見麼.誠然聽見了. 『他們的聲音傳遍天下、他們的言語傳到地極。』
                  (9)羅10:19我再說、以色列人不知道麼.先有摩西說、『我要用那不成子民的、惹動你們的憤恨.我要用那無知的民、觸動你們的怒氣。』
                             -> 0.5403 申 32:21 他們以那不算為神的、觸動我的憤恨、以虛無的神、惹了我的怒氣、我也要以那不成子民的、觸動他們的憤恨、
                  以愚昧的國民、惹了他們的怒氣。
                   (10) 羅 10:20 又有以賽亞放膽說、
                                                                              『沒有尋找我的、我叫他們遇見.沒有訪問我的、我向他們顯現。』
                                                                     素來沒有訪問我的、現在求問我.沒有尋找我的、我叫他們遇見.沒有稱為我名下的、我對他們說、我在這裡、
                             -> 0.6651 賽 65:1
                  我在這裡。
                  (11) 羅 10:21 至於以色列人、他說、『我整天伸手招呼那悖逆頂嘴的百姓。』
                             -> 0.6086 賽 65:2
                                                                     我整天伸手招呼那悖逆的百姓、他們隨自己的意念行不善之道.
```

6. Topic Modeling

LDA Model

```
In [15]: # Build an LDA Model on the NT Scripture
bible = "cuv.csv"
lda = tm.lda_process(bible, cat=2, chi=True, eval=True)
```

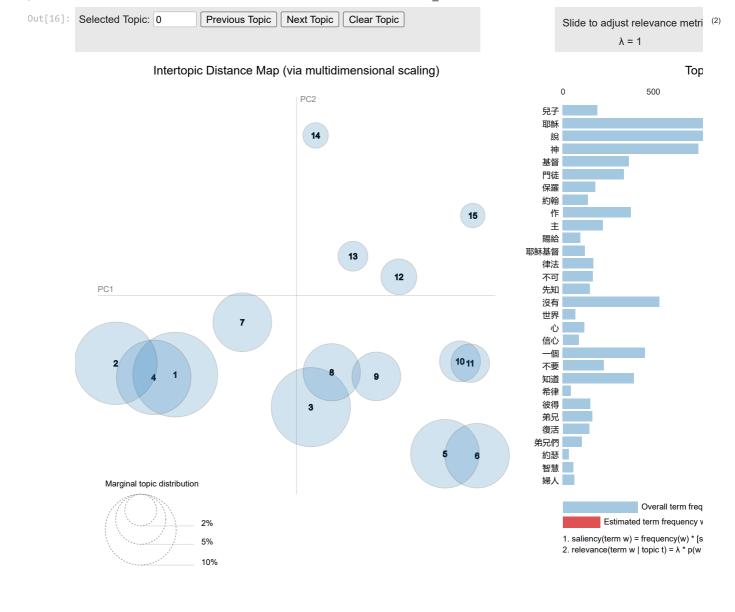
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```
Loading Bible 'D:\Dev\Anaconda3\lib\site-packages\cwordtm\data\cuv.csv' ...
Corpus loaded!
Text preprocessed!
Text trained!
If no visualization is shown,
 you may execute the following commands to show the visualization:
   > import pyLDAvis
   > pyLDAvis.display(lda.vis data)
Visualization prepared!
Topics from LDA Model:
[(0,
  '0.019*"說" + 0.012*"神" + 0.008*"保羅" + 0.008*"沒有" + 0.007*"作" + 0.006*"聽見" + '
  '0.006*"看見" + 0.006*"猶太人" + 0.006*"事" + 0.005*"律法"'),
  .
'0.022*"說" + 0.011*"一個" + 0.008*"保羅" + 0.007*"耶穌" + 0.007*"沒有" + 0.007*"看見" '
  '+ 0.006*"知道" + 0.006*"神" + 0.006*"事" + 0.005*"面前"'),
  '0.019*"神" + 0.012*"基督" + 0.008*"作" + 0.008*"說" + 0.007*"知道" + 0.006*"耶穌" + '
 '0.006*"沒有" + 0.005*"耶穌基督" + 0.005*"願" + 0.005*"藉"'),
  '0.027*"神" + 0.013*"基督" + 0.007*"心" + 0.007*"沒有" + 0.006*"作" + 0.006*"說" + '
 '0.006*"主" + 0.006*"智慧" + 0.006*"知道" + 0.005*"死"'),
 (4,
  '0.048*"兒子" + 0.016*"說" + 0.009*"約瑟" + 0.008*"約翰" + 0.007*"希律" + 0.006*"小孩子" '
 '+ 0.006*"作" + 0.006*"猶大" + 0.005*"耶穌" + 0.005*"亞伯拉罕"'),
 (5,
  -/
'0.051*"說" + 0.024*"耶穌" + 0.011*"──個" + 0.009*"彼得" + 0.009*"門徒" + 0.008*"神" + '
  '0.007*"沒有" + 0.007*"看見" + 0.007*"喫" + 0.006*"告訴"'),
  '0.013*"說" + 0.008*"神" + 0.007*"主" + 0.007*"不要" + 0.006*"天使" + 0.005*"弟兄們" + '
  '0.005*"事" + 0.005*"知道" + 0.005*"喫" + 0.005*"沒有"'),
  '0.015*"神" + 0.009*"信心" + 0.008*"說" + 0.008*"主" + 0.007*"耶穌基督" + 0.006*"沒有" '
 '+ 0.006*"知道" + 0.006*"心" + 0.005*"僕人" + 0.005*"不能"'),
(8,
 -,
'0.019*"說" + 0.010*"沒有" + 0.008*"先知" + 0.007*"神" + 0.007*"作" + 0.006*"方言" + '
'0.005*"知道" + 0.004*"講道" + 0.004*"乃是" + 0.004*"不能"'),
  .
'0.051*"說" + 0.046*"耶穌" + 0.009*"一個" + 0.008*"沒有" + 0.008*"告訴" + 0.008*"事" + '
  '0.008*"看見" + 0.006*"眾人" + 0.006*"知道" + 0.006*"猶太人"'),
  '0.010*"神" + 0.006*"說" + 0.006*"不可" + 0.005*"就當" + 0.005*"作" + 0.005*"弟兄" + '
  '0.004*"執事" + 0.004*"各人" + 0.004*"世界" + 0.004*"事"'),
 (11,
  '0.020*"基督" + 0.019*"神" + 0.010*"事" + 0.010*"沒有" + 0.009*"律法" + 0.008*"說" + '
 '0.007*"生" + 0.007*"聖靈" + 0.007*"主" + 0.007*"福音"'),
 (12,
  '0.020*"說" + 0.008*"神" + 0.007*"作" + 0.007*"一個" + 0.005*"告訴" + 0.005*"耶穌" + '
 '0.005*"不能" + 0.005*"律法" + 0.005*"沒有" + 0.004*"死"'),
 (13,
  '0.059*"說" + 0.052*"耶穌" + 0.016*"門徒" + 0.009*"沒有" + 0.008*"一個" + 0.007*"看見" '
  '+ 0.006*"約翰" + 0.006*"告訴" + 0.006*"眾人" + 0.005*"神"'),
  '0.011*"賜給" + 0.009*"說" + 0.007*"世界" + 0.007*"沒有" + 0.006*"保羅" + 0.006*"知道" '
  '+ 0.005*"已經" + 0.005*"看見" + 0.005*"婦人" + 0.005*"復活"')]
Model Evaluation Scores:
 Coherence: 0.305645678431827
 Perplexity: -8.102149181052557
 Topic diversity: 0.004782666138195265
 Topic size distribution: 0.013793103448275862
```

```
In [16]: # Show LDA Model Visualization
import pyLDAvis
pyLDAvis.display(lda.vis_data)
```

localhost:8888/nbconvert/html/ NLP/ Presentation/CWordTM CUV.ipynb?download=false

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BERTopic Model

In [17]: # Build a BERTopic Model on the NT Scripture
btm = tm.btm_process(bible, cat=2, chi=True, eval=True)

Loading Bible 'D:\Dev\Anaconda3\lib\site-packages\cwordtm\data\cuv.csv' ... Corpus loaded!

Chinese text preprocessed!

Some weights of the model checkpoint at bert-base-chinese were not used when initializing BertModel: ['cls.predictions.transform.LayerNorm.bias', 'cls.seq_relationship.bias', 'cls.seq_relationship.weight', 'cls.predictions.transform.dense.bias', 'cls.predictions.transform.dense.weight', 'cls.predictions.transform.LayerNorm.weight', 'cls.predictions.bias', 'cls.predictions.decoder.weight']

- This IS expected if you are initializing BertModel from the checkpoint of a model trained on another task or with another architecture (e.g. initializing a BertForSequenceClassification model from a BertForPerTraining model).

- This IS NOT expected if you are initializing BertModel from the checkpoint of a model that you expect to be exactly identical (initializing a BertForSequenceClassification model).

D:\Dev\Anaconda3\lib\site-packages\hdbscan\hdbscan_.py:1170: DeprecationWarning: `alltrue` is deprecated as of NumPy 1.25.0, and will be removed in NumPy 2.0. Please use `all` instead. self._all_finite = is_finite(X)

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Text trained!

Topics from BERTopic Model:

Topic 0: 基督 | 沒有 | 知道 | 律法 | 耶穌 | 耶穌基督 | 聖靈 | 乃是 | 不可 | 福音 Topic 2: 耶穌 | 看見 | 門徒 | 一個 | 沒有 | 告訴 | 聽見 | 天使 | 知道 | 天上 Topic 1: 耶穌 | 保羅 | 一個 | 猶太人 | 門徒 | 沒有 | 彼拉多 | 眾人 | 看見 | 聽見

Model Evaluation Scores: Coherence: 0.3788491469691033

BERTopic Model Visualization:

** No Intertopic Distance Map shown for your text!

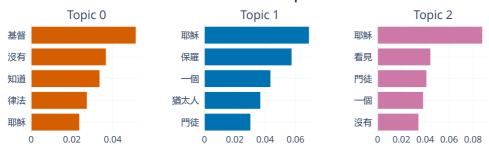
D:\Dev\Anaconda3\lib\site-packages\plotly\io_renderers.py:395: DeprecationWarning:

distutils Version classes are deprecated. Use packaging.version instead.

 $\label{lib} D: \Dev\Anaconda3\lib\site-packages\plotly\io_renderers.py:395: Deprecation\Warning: \Deprecation\Warning: \Deprecati$

distutils Version classes are deprecated. Use packaging.version instead.

Topic Word Scores



D:\Dev\Anaconda3\lib\site-packages\plotly\io_renderers.py:395: DeprecationWarning:

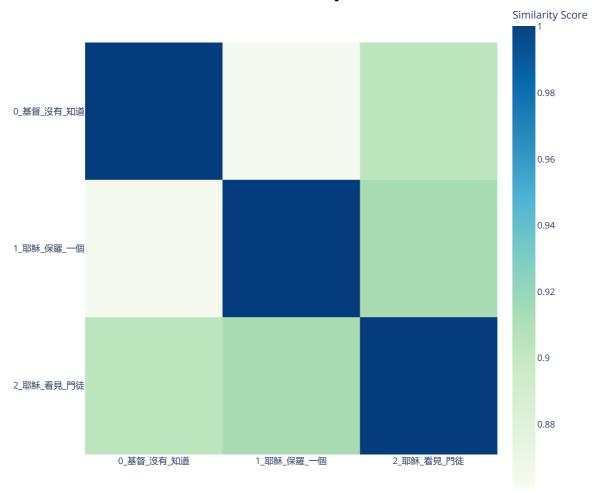
distutils Version classes are deprecated. Use packaging.version instead.

 $\label{lem:devAnaconda3} I ib \site-packages \plotly \io_renderers.py: 395: Deprecation \warming: \property \prop$

 $\hbox{distutils Version classes are deprecated. Use packaging.version instead.}$

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Similarity Matrix



If no visualization is shown,
 you may execute the following commands one-by-one:
 btm.model.visualize_topics()
 btm.model.visualize_barchart()
 btm.model.visualize_heatmap()