In [1]:
```python
import numpy as np
import nltk
import pandas as pd
import sklearn
import re
from sklearn.feature_extraction.text import CountVectorizer
from wordcloud import WordCloud, STOPWORDS
import matplotlib.pyplot as plt
from nltk.tokenize import word_tokenize
from nltk.probability import FreqDist
from nltk.corpus import stopwords
from nltk.stem import PorterStemmer
from nltk.tokenize import sent_tokenize, word_tokenize
from nltk.stem.wordnet import WordNetLemmatizer
from nltk.stem.porter import PorterStemmer
import tensorflow
```
```
2022-11-14 09:09:32.537776: I tensorflow/core/platform/cpu_feature_guard.cc:193] This TensorFlow binary is optimized with oneAPI Deep Neural Network Library (oneDNN) to use the following CPU instructions in performance-critical operations:  AVX2 FMA
To enable them in other operations, rebuild TensorFlow with the appropriate compiler flags.
```

In [2]:
```python
#################################################################
## ANN - CNN - RNN
# Movies Dataset
# https://www.kaggle.com/datasets/columbine/imdb-dataset-sentiment-analysis-in-csv-format
#################################################################
TrainData = pd.read_csv("Train.csv")
print(TrainData.head())

TestData = pd.read_csv("Test.csv")

ValidData = pd.read_csv("Valid.csv")

# Clean Up Data, Tokenize and Vectorize

ReviewsLIST = []  ## from the text column
LabelLIST = []

for nextreview, nextlabel in zip(TrainData["text"], TrainData["label"]):
    ReviewsLIST.append(nextreview)
    LabelLIST.append(nextlabel)
```
```
                                                text  label
0  I grew up (b. 1965) watching and loving the Th...      0
1  When I put this movie in my DVD player, and sa...      0
2  Why do people who do not know what a particula...      0
3  Even though I have great interest in Biblical ...      0
4  Im a die hard Dads Army fan and nothing will e...      1
```

In [3]:
```python
from tqdm import tqdm_notebook as tqdm
# ----------------------------------------------
# Use NLTK's PorterStemmer in a function - Stemming
# ----------------------------------------------
A_STEMMER = PorterStemmer()


def MY_STEMMER(str_input):
    ## Only use letters, no punct, no nums, make lowercase...
    words = re.sub(r"[^A-Za-z\-]", " ", str_input).lower().split()
    words = [A_STEMMER.stem(word) for word in words]
    return words


##########################################
#  Build the labeled dataframe
#  Get the Vocab  - here keeping top 10,000
##########################################

# Vectorize
# Instantiate your CV
MyCountV = CountVectorizer(
    input="content",
    lowercase=True,
    stop_words="english",  # Remove stopwords
    tokenizer=MY_STEMMER,  # Stemming
    max_features=10000  # This can be updated
)

# Use your CV
MyDTM = MyCountV.fit_transform(ReviewsLIST)  # create a sparse matrix
ColumnNames = MyCountV.get_feature_names()  # This is the vocab

# clean up the columns
MyDTM_DF = pd.DataFrame(MyDTM.toarray(), columns=ColumnNames)
# Convert the labels from list to df
Labels_DF = pd.DataFrame(LabelLIST, columns=['LABEL'])

for nextcol in tqdm(MyDTM_DF.columns):
    # The following will remove all columns that contains numbers
    if str.isdigit(nextcol):
        MyDTM_DF = MyDTM_DF.drop([nextcol], axis=1)

    # The following will remove any column with name of 3 or smaller - like "it" or "of" or "pre".
    elif len(str(nextcol)) < 3:
        print(nextcol)
        MyDTM_DF = MyDTM_DF.drop([nextcol], axis=1)

# Save original DF - without the lables
My_Orig_DF = MyDTM_DF
```
```
/Users/xingyuchen/miniconda3/lib/python3.9/site-packages/sklearn/feature_extraction/text.py:404: UserWarning: Your stop_words may be inconsistent with your preprocessing. Tokenizing the stop words generated tokens ['abov', 'afterward', 'alon', 'alreadi', 'alway', 'ani', 'anoth', 'anyon', 'anyth', 'anywher', 'becam', 'becaus', 'becom', 'befor', 'besid', 'cri', 'describ', 'dure', 'els', 'elsewher', 'empti', 'everi', 'everyon', 'everyth', 'everywher', 'fifti', 'formerli', 'forti', 'ha', 'henc', 'hereaft', 'herebi', 'hi', 'howev', 'hundr', 'inde', 'latterli', 'mani', 'meanwhil', 'moreov', 'mostli', 'nobodi', 'noon', 'noth', 'nowher', 'onc', 'onli', 'otherwis', 'ourselv', 'perhap', 'pleas', 'seriou', 'sever', 'sinc', 'sincer', 'sixti', 'someon', 'someth', 'sometim', 'somewher', 'themselv', 'thenc', 'thereaft', 'therebi', 'therefor', 'thi', 'thu', 'togeth', 'twelv', 'twenti', 'veri', 'wa', 'whatev', 'whenc', 'whenev', 'wherea', 'whereaft', 'wherebi', 'wherev', 'whi', 'yourselv'] not in stop_words.
  warnings.warn(
/Users/xingyuchen/miniconda3/lib/python3.9/site-packages/sklearn/utils/deprecation.py:87: FutureWarning: Function get_feature_names is deprecated; get_feature_names is deprecated in 1.0 and will be removed in 1.2. Please use get_feature_names_out instead.
  warnings.warn(msg, category=FutureWarning)
/var/folders/31/yzh9j02x7bxd463c11x0_21h0000gn/T/ipykernel_14704/211745195.py:39: TqdmDeprecationWarning: This function will be removed in tqdm==5.0.0
Please use `tqdm.notebook.tqdm` instead of `tqdm.tqdm_notebook`
  for nextcol in tqdm(MyDTM_DF.columns):
  0%|          | 0/10000 [00:00<?, ?it/s]
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al
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aw
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bo
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```

In [4]:
```python
## Now - let's create a complete and labeled
## dataframe:
dfs = [Labels_DF, MyDTM_DF]
print(dfs)

Final_DF_Labeled = pd.concat(dfs, axis=1, join='inner')
## DF with labels
print(Final_DF_Labeled.iloc[:, 0:2])
print(Final_DF_Labeled.shape)

## Create list of all words
print(Final_DF_Labeled.columns[0])
NumCols = Final_DF_Labeled.shape[1]
print(NumCols)
print(len(list(Final_DF_Labeled.columns)))

top_words = list(Final_DF_Labeled.columns[1:NumCols + 1])
## Exclude the Label
print(top_words[0])
print(top_words[-1])

print(type(top_words))
print(top_words.index("aamir"))  ## index 0 in top_words
print(top_words.index("zucco"))  #  index NumCols - 2 in top_words
```
```
[       LABEL
0          0
1          0
2          0
3          0
4          1
...      ...
39995      1
39996      1
39997      0
39998      1
39999      1

[40000 rows x 1 columns],        ---  --the  -and  -hour  -minut  -someth  -the  -year  -year-old  \
0        0      0     0      0       0        0     0      0          0
1        0      0     0      0       0        0     0      0          0
2        0      0     0      0       0        0     0      0          0
3        0      0     0      0       0        0     0      0          0
4        0      0     0      0       0        0     0      0          0
...    ...    ...   ...    ...     ...      ...   ...    ...        ...
39995    0      0     0      0       0        0     0      0          0
39996    0      0     0      0       0        0     0      0          0
39997    0      0     0      0       0        0     0      0          0
39998    0      0     0      0       0        0     0      0          0
39999    0      0     0      0       0        0     0      0          0

       a-list  ...  zodiac  zoe  zoey  zombi  zone  zoo  zoom  zorro  zucco  \
0           0  ...       0    0     0      0     0    0     0      0      0
1           0  ...       0    0     0      0     0    0     0      0      0
2           0  ...       0    0     0      0     0    0     0      0      0
3           0  ...       0    0     0      0     0    0     0      0      0
4           0  ...       0    0     0      0     0    0     0      0      0
...       ...  ...     ...  ...   ...    ...   ...  ...   ...    ...    ...
39995       0  ...       0    0     0      0     0    0     0      0      0
39996       0  ...       0    0     0      0     0    0     0      0      0
39997       0  ...       0    0     0      0     0    0     0      0      0
39998       0  ...       0    0     0      0     0    0     0      0      0
39999       0  ...       0    0     0      0     0    0     0      0      0

       zucker
0           0
1           0
2           0
3           0
4           0
...       ...
39995       0
39996       0
39997       0
39998       0
39999       0

[40000 rows x 9845 columns]]
       LABEL  ---
0          0    0
1          0    0
2          0    0
3          0    0
4          1    0
...      ...  ...
39995      1    0
39996      1    0
39997      0    0
39998      1    0
39999      1    0

[40000 rows x 2 columns]
(40000, 9846)
LABEL
9846
9846
---
zucker
<class 'list'>
11
9843
```

In [5]:
```python
## Encoding the data
def Encode(review):
    words = review.split()
    # print(words)
    if len(words) > 500:
        words = words[:500]
        # print(words)
    encoding = []
    for word in words:
        try:
            index = top_words.index(word)
        except:
            index = (NumCols - 1)
        encoding.append(index)
    while len(encoding) < 500:
        encoding.append(NumCols)
    return encoding

##-----------------------------------------------------------
## Test the code to assure that it is
## doing what you think it should

result1 = Encode("aaron aamir abbey abbott abilities")
print(result1)
result2 = Encode("york young younger youngest youngsters youth youthful youtube zach zane zany zealand zellweger")
print(result2)
print(len(result2))  ## Will be 500 because we set it that way above
```
```
[12, 11, 15, 18, 9845, 9846, 9846, 9846, 9846, 9846, 9846, 9846, 9846, 9846, 9846, 9846, 9846, 9846, 9846, 9846,
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500
```

In [6]:
```python
##################################
## Now we are ready to encode all of our
## reviews - which are called "text" in
## our dataset.

# Using vocab from above i -  convert reviews (text) into numerical form
# Replacing each word with its corresponding integer index value from the
# vocabulary. Words not in the vocab will
# be assigned  as the max length of the vocab + 1
## ########################################################

# Encode our training and testing datasets
# with same vocab.

print(TestData.head(10))
print(TestData.shape)
print(TrainData.shape)

############### Final Training and Testing data and labels-----------------
training_data = np.array([Encode(review) for review in tqdm(TrainData["text"])])
print(training_data[20])
print(training_data.shape)

testing_data = np.array([Encode(review) for review in tqdm(TestData['text'])])
print(testing_data[20])

validation_data = np.array([Encode(review) for review in tqdm(ValidData['text'])])

print(training_data.shape, testing_data.shape)

## Prepare the labels if they are not already 0 and 1. In our case they are
## so these lines are commented out and just FYI
# train_labels = [1 if label=='positive' else 0 for sentiment in TrainData['label']]
# test_labels = [1 if label=='positive' else 0 for sentiment in TestData['label']]
train_labels = np.array([TrainData['label']])
train_labels = train_labels.T
print(train_labels.shape)
test_labels = np.array([TestData['label']])
test_labels = test_labels.T
print(test_labels.shape)
```
```
                                                text  label
0  I always wrote this series off as being a comp...      0
1  1st watched 12/7/2002 - 3 out of 10(Dir-Steve ...      0
2  This movie was so poorly written and directed ...      0
3  The most interesting thing about Miryang (Secr...      1
4  when i first read about "berlin am meer" i did...      0
5  I saw this film on September 1st, 2005 in Indi...      1
6  I saw a screening of this movie last night. I ...      0
7  William Hurt may not be an American matinee id...      1
8  IT IS A PIECE OF CRAP! not funny at all. durin...      0
9  I'M BOUT IT(1997)<br /><br />Developed & publi...      0
(5000, 2)
(40000, 2)
/var/folders/31/yzh9j02x7bxd463c11x0_21h0000gn/T/ipykernel_14704/1133915472.py:20: TqdmDeprecationWarning: This function will be removed in tqdm==5.0.0
Please use `tqdm.notebook.tqdm` instead of `tqdm.tqdm_notebook`
  training_data = np.array([Encode(review) for review in tqdm(TrainData["text"])])
  0%|          | 0/40000 [00:00<?, ?it/s]
[9845 9845 9845 4007 9845 9845 9845 9845 9387 9845 9845 9845 9845 9845
 9845 9845 9845 9845 9845 4042 9845 9845 9845 9845 9845 9845 9845 9845
 9845 7560 9845 9845 9845 9845 9845  165 9845 9845 9845 4291 9845 9845
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(40000, 500)
/var/folders/31/yzh9j02x7bxd463c11x0_21h0000gn/T/ipykernel_14704/1133915472.py:24: TqdmDeprecationWarning: This function will be removed in tqdm==5.0.0
Please use `tqdm.notebook.tqdm` instead of `tqdm.tqdm_notebook`
  testing_data = np.array([Encode(review) for review in tqdm(TestData['text'])])
  0%|          | 0/5000 [00:00<?, ?it/s]
[9845 9845 9845 9845 9807 9845 5515 9845 9713 9845 9845 9845 9845 9845
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/var/folders/31/yzh9j02x7bxd463c11x0_21h0000gn/T/ipykernel_14704/1133915472.py:27: TqdmDeprecationWarning: This function will be removed in tqdm==5.0.0
Please use `tqdm.notebook.tqdm` instead of `tqdm.tqdm_notebook`
  validation_data = np.array([Encode(review) for review in tqdm(ValidData['text'])])
  0%|          | 0/5000 [00:00<?, ?it/s]
(40000, 500) (5000, 500)
(40000, 1)
(5000, 1)
```

In [32]:
```python
from sklearn.metrics import confusion_matrix
def eval_model(model):
    print("Evaluate model on test data")
    results = model.evaluate(testing_data, test_labels, batch_size=256)
    print("test loss, test acc:", results)

    # Generate a prediction using model.predict()
    # and calculate it's shape:
    print("Generate a prediction")
    prediction = model.predict(testing_data)
    print(prediction)
    prediction[prediction > .5] = 1
    prediction[prediction <= .5] = 0
    print(prediction)
    print(prediction.shape)
    print(confusion_matrix(prediction, test_labels))
```

In [57]:
```python
##############################
## ANN
################################
## Simple Dense NN for sentiment analysis (classification 0 neg, 1 pos)
# First layer: Embedding Layer (Keras Embedding Layer) that will learn embeddings
# for different words .
## RE: ## https://keras.io/api/layers/core_layers/embedding/
## input_dim: Integer. Size of the vocabulary
## input_length: Length of input sequences, when it is constant.
print(NumCols)
input_dim = NumCols + 1
 #https://www.tensorflow.org/api_docs/python/tf/keras/Input
input_data = tensorflow.keras.layers.Input(shape=(500))
 #https://www.tensorflow.org/api_docs/python/tf/keras/layers/Embedding

data = tensorflow.keras.layers.Embedding(input_dim=input_dim, output_dim=64, input_length=500)(input_data)
##input_dim: Integer. Size of the vocabulary, i.e. maximum integer index + 1
## Good tutorial for this concept:
    ## https://medium.com/analytics-vidhya/understanding-embedding-layer-in-keras-bbe3ff1327ce
 #output_dim: Integer. Dimension of the dense embedding.
 # output_dim: This is the size of the vector space in which words will be embedded.
 #It defines the size of the output vectors from this layer for each word.
 # For example, it could be 32 or 100 or even larger.
 #https://machinelearningmastery.com/use-word-embedding-layers-deep-learning-keras/
#  In an embedding, words are represented by dense vectors where a vector represents
#  the projection of the word into a continuous vector space.
# The position of a word within the vector space is learned
# from text and is based on the words that surround the word when it is used.
# The position of a word in the learned vector space is referred to as its embedding.
data = tensorflow.keras.layers.Flatten()(data)
 #Dense layers require inputs as (batch_size, input_size)
data = tensorflow.keras.layers.Dense(16)(data)
data = tensorflow.keras.layers.Activation('relu')(data)
data = tensorflow.keras.layers.Dropout(0.5)(data)

data = tensorflow.keras.layers.Dense(8)(data)
data = tensorflow.keras.layers.Activation('relu')(data)

data = tensorflow.keras.layers.Dropout(0.5)(data)

data = tensorflow.keras.layers.Dense(4)(data)
data = tensorflow.keras.layers.Activation('sigmoid')(data)
data = tensorflow.keras.layers.Dropout(0.5)(data)

data = tensorflow.keras.layers.Dense(1)(data)
output_data = tensorflow.keras.layers.Activation('sigmoid')(data)

model = tensorflow.keras.models.Model(inputs=input_data, outputs=output_data)

model.compile(loss='binary_crossentropy', optimizer='adam', metrics='accuracy')
model.summary()

model.fit(training_data, train_labels, epochs=10, batch_size=256, validation_data=(testing_data, test_labels))

eval_model(model)
```
```
9846
Model: "model_8"
_________________________________________________________________
 Layer (type)                Output Shape              Param #
=================================================================
 input_9 (InputLayer)        [(None, 500)]             0

 embedding_8 (Embedding)     (None, 500, 64)           630208

 flatten_3 (Flatten)         (None, 32000)             0

 dense_24 (Dense)            (None, 16)                512016

 activation_23 (Activation)  (None, 16)                0

 dropout_7 (Dropout)         (None, 16)                0

 dense_25 (Dense)            (None, 8)                 136

 activation_24 (Activation)  (None, 8)                 0

 dropout_8 (Dropout)         (None, 8)                 0

 dense_26 (Dense)            (None, 4)                 36

 activation_25 (Activation)  (None, 4)                 0

 dropout_9 (Dropout)         (None, 4)                 0

 dense_27 (Dense)            (None, 1)                 5

 activation_26 (Activation)  (None, 1)                 0

=================================================================
Total params: 1,142,401
Trainable params: 1,142,401
Non-trainable params: 0
_________________________________________________________________
Epoch 1/10
157/157 [==============================] - 7s 38ms/step - loss: 0.7481 - accuracy: 0.4979 - val_loss: 0.6907 - val_accuracy: 0.5164
Epoch 2/10
157/157 [==============================] - 6s 37ms/step - loss: 0.6977 - accuracy: 0.5443 - val_loss: 0.6080 - val_accuracy: 0.7046
Epoch 3/10
157/157 [==============================] - 6s 39ms/step - loss: 0.6354 - accuracy: 0.6488 - val_loss: 0.5510 - val_accuracy: 0.7642
Epoch 4/10
157/157 [==============================] - 6s 39ms/step - loss: 0.5996 - accuracy: 0.6937 - val_loss: 0.5233 - val_accuracy: 0.7694
Epoch 5/10
157/157 [==============================] - 5s 31ms/step - loss: 0.5771 - accuracy: 0.7165 - val_loss: 0.5142 - val_accuracy: 0.7682
Epoch 6/10
157/157 [==============================] - 5s 31ms/step - loss: 0.5513 - accuracy: 0.7387 - val_loss: 0.4918 - val_accuracy: 0.7924
Epoch 7/10
157/157 [==============================] - 6s 36ms/step - loss: 0.5367 - accuracy: 0.7559 - val_loss: 0.4984 - val_accuracy: 0.7786
Epoch 8/10
157/157 [==============================] - 6s 38ms/step - loss: 0.5204 - accuracy: 0.7668 - val_loss: 0.4918 - val_accuracy: 0.7914
Epoch 9/10
157/157 [==============================] - 6s 41ms/step - loss: 0.5040 - accuracy: 0.7793 - val_loss: 0.5018 - val_accuracy: 0.7708
Epoch 10/10
157/157 [==============================] - 5s 35ms/step - loss: 0.4882 - accuracy: 0.7898 - val_loss: 0.5023 - val_accuracy: 0.7682
Evaluate model on test data
20/20 [==============================] - 0s 12ms/step - loss: 0.5023 - accuracy: 0.7682
test loss, test acc: [0.5023042559623718, 0.7681999802589417]
Generate a prediction
157/157 [==============================] - 0s 3ms/step
[[0.23011152]
 [0.7291296 ]
 [0.22884303]
 ...
 [0.23199056]
 [0.22977066]
 [0.2539859 ]]
[[0.]
 [1.]
 [0.]
 ...
 [0.]
 [0.]
 [0.]]
(5000, 1)
[[2163  827]
 [ 332 1678]]
```

In [34]:
```python
#################################
## RNN
##############################################

input_data = tensorflow.keras.layers.Input(shape=(500))

data = tensorflow.keras.layers.Embedding(input_dim=input_dim, output_dim=32, input_length=500)(input_data)
 #https://www.tensorflow.org/api_docs/python/tf/keras/layers/Bidirectional
data = tensorflow.keras.layers.Bidirectional(tensorflow.keras.layers.SimpleRNN(50))(data)

data = tensorflow.keras.layers.Dense(1)(data)
output_data = tensorflow.keras.layers.Activation('sigmoid')(data)

model = tensorflow.keras.models.Model(inputs=input_data, outputs=output_data)

model.compile(loss='binary_crossentropy', optimizer='adam', metrics='accuracy')
model.summary()

model.fit(training_data, train_labels, epochs=10, batch_size=256, validation_data=(testing_data, test_labels))

eval_model(model)
```
```
Model: "model_5"
_________________________________________________________________
 Layer (type)                Output Shape              Param #
=================================================================
 input_6 (InputLayer)        [(None, 500)]             0

 embedding_5 (Embedding)     (None, 500, 32)           315104

 bidirectional (Bidirectiona  (None, 100)              8300
 l)

 dense_20 (Dense)            (None, 1)                 101

 activation_20 (Activation)  (None, 1)                 0

=================================================================
Total params: 323,505
Trainable params: 323,505
Non-trainable params: 0
_________________________________________________________________
Epoch 1/10
157/157 [==============================] - 50s 310ms/step - loss: 0.6933 - accuracy: 0.5100 - val_loss: 0.6919 - val_accuracy: 0.5234
Epoch 2/10
157/157 [==============================] - 53s 335ms/step - loss: 0.6841 - accuracy: 0.5486 - val_loss: 0.6775 - val_accuracy: 0.5522
Epoch 3/10
157/157 [==============================] - 47s 302ms/step - loss: 0.6768 - accuracy: 0.5800 - val_loss: 0.6713 - val_accuracy: 0.5798
Epoch 4/10
157/157 [==============================] - 48s 307ms/step - loss: 0.6167 - accuracy: 0.6622 - val_loss: 0.6007 - val_accuracy: 0.6672
Epoch 5/10
157/157 [==============================] - 46s 294ms/step - loss: 0.6050 - accuracy: 0.6701 - val_loss: 0.7159 - val_accuracy: 0.5122
Epoch 6/10
157/157 [==============================] - 48s 307ms/step - loss: 0.6698 - accuracy: 0.5835 - val_loss: 0.6669 - val_accuracy: 0.5726
Epoch 7/10
157/157 [==============================] - 49s 310ms/step - loss: 0.6408 - accuracy: 0.6324 - val_loss: 0.7580 - val_accuracy: 0.5316
Epoch 8/10
157/157 [==============================] - 48s 306ms/step - loss: 0.6331 - accuracy: 0.6337 - val_loss: 0.7718 - val_accuracy: 0.5838
Epoch 9/10
157/157 [==============================] - 48s 308ms/step - loss: 0.5725 - accuracy: 0.7113 - val_loss: 0.6359 - val_accuracy: 0.6374
Epoch 10/10
157/157 [==============================] - 48s 306ms/step - loss: 0.6342 - accuracy: 0.6453 - val_loss: 0.5803 - val_accuracy: 0.7280
Evaluate model on test data
20/20 [==============================] - 2s 76ms/step - loss: 0.5803 - accuracy: 0.7280
test loss, test acc: [0.5803137421607971, 0.7279999852180481]
Generate a prediction
157/157 [==============================] - 4s 23ms/step
[[0.44275513]
 [0.57883126]
 [0.21278653]
 ...
 [0.49424046]
 [0.398994  ]
 [0.5429914 ]]
[[0.]
 [1.]
 [0.]
 ...
 [0.]
 [0.]
 [1.]]
(5000, 1)
[[1616  481]
 [ 879 2024]]
```

In [35]:
```python
##########################################
## LSTM
##########################################
input_data = tensorflow.keras.layers.Input(shape=(500))

data = tensorflow.keras.layers.Embedding(input_dim=input_dim, output_dim=32, input_length=500)(input_data)

data = tensorflow.keras.layers.Bidirectional(tensorflow.keras.layers.LSTM(50))(data)

data = tensorflow.keras.layers.Dense(1)(data)
output_data = tensorflow.keras.layers.Activation('sigmoid')(data)

model = tensorflow.keras.models.Model(inputs=input_data, outputs=output_data)

model.compile(loss='binary_crossentropy', optimizer='adam', metrics='accuracy')
model.summary()

model.fit(training_data, train_labels, epochs=10, batch_size=128, validation_data=(testing_data, test_labels))

eval_model(model)
```

```
Model: "model_6"
_________________________________________________________________
 Layer (type)                Output Shape              Param #
=================================================================
 input_7 (InputLayer)        [(None, 500)]             0

 embedding_6 (Embedding)     (None, 500, 32)           315104

 bidirectional_1 (Bidirectio  (None, 100)              33200
 nal)

 dense_21 (Dense)            (None, 1)                 101

 activation_21 (Activation)  (None, 1)                 0

=================================================================
Total params: 348,405
Trainable params: 348,405
Non-trainable params: 0
_________________________________________________________________
Epoch 1/10
313/313 [==============================] - 205s 644ms/step - loss: 0.6599 - accuracy: 0.5953 - val_loss: 0.5907
- val_accuracy: 0.6878
Epoch 2/10
313/313 [==============================] - 200s 639ms/step - loss: 0.5436 - accuracy: 0.7307 - val_loss: 0.5423
- val_accuracy: 0.7254
Epoch 3/10
313/313 [==============================] - 175s 559ms/step - loss: 0.4908 - accuracy: 0.7692 - val_loss: 0.4680
- val_accuracy: 0.7846
Epoch 4/10
313/313 [==============================] - 245s 783ms/step - loss: 0.4417 - accuracy: 0.8043 - val_loss: 0.5005
- val_accuracy: 0.7552
Epoch 5/10
313/313 [==============================] - 222s 708ms/step - loss: 0.4149 - accuracy: 0.8189 - val_loss: 0.4605
- val_accuracy: 0.7898
Epoch 6/10
313/313 [==============================] - 192s 612ms/step - loss: 0.4058 - accuracy: 0.8235 - val_loss: 0.4843
- val_accuracy: 0.7862
Epoch 7/10
313/313 [==============================] - 209s 666ms/step - loss: 0.3969 - accuracy: 0.8285 - val_loss: 0.4484
- val_accuracy: 0.7986
Epoch 8/10
313/313 [==============================] - 870s 3s/step - loss: 0.4000 - accuracy: 0.8244 - val_loss: 0.4490 -
val_accuracy: 0.7964
Epoch 9/10
313/313 [==============================] - 160s 511ms/step - loss: 0.3827 - accuracy: 0.8355 - val_loss: 0.4487
- val_accuracy: 0.8006
Epoch 10/10
313/313 [==============================] - 173s 554ms/step - loss: 0.3745 - accuracy: 0.8386 - val_loss: 0.4618
- val_accuracy: 0.7892
Evaluate model on test data
20/20 [==============================] - 9s 460ms/step - loss: 0.4618 - accuracy: 0.7892
test loss, test acc: [0.46182265877723694, 0.7892000079154968]
Generate a prediction
157/157 [==============================] - 9s 49ms/step
[[0.13675898]
 [0.70808494]
 [0.02171615]
 ...
 [0.03404794]
 [0.01222912]
 [0.53398883]]
[[0.]
 [1.]
 [0.]
 ...
 [0.]
 [0.]
 [1.]]
(5000, 1)
[[1920  479]
 [ 575 2026]]
```

In [36]:

```
########################################
## CNN
########################################
input_data = tensorflow.keras.layers.Input(shape=(500))

data = tensorflow.keras.layers.Embedding(input_dim=input_dim, output_dim=32, input_length=500)(input_data)

data = tensorflow.keras.layers.Conv1D(50, kernel_size=3, activation='relu')(data)
data = tensorflow.keras.layers.MaxPool1D(pool_size=2)(data)

data = tensorflow.keras.layers.Conv1D(40, kernel_size=3, activation='relu')(data)
data = tensorflow.keras.layers.MaxPool1D(pool_size=2)(data)

data = tensorflow.keras.layers.Conv1D(30, kernel_size=3, activation='relu')(data)
data = tensorflow.keras.layers.MaxPool1D(pool_size=2)(data)

data = tensorflow.keras.layers.Conv1D(30, kernel_size=3, activation='relu')(data)
data = tensorflow.keras.layers.MaxPool1D(pool_size=2)(data)

data = tensorflow.keras.layers.Flatten()(data)

data = tensorflow.keras.layers.Dense(20)(data)
data = tensorflow.keras.layers.Dropout(0.5)(data)

data = tensorflow.keras.layers.Dense(1)(data)
output_data = tensorflow.keras.layers.Activation('sigmoid')(data)

model = tensorflow.keras.models.Model(inputs=input_data, outputs=output_data)

model.compile(loss='binary_crossentropy', optimizer='adam', metrics=['accuracy'])
model.summary()

model.fit(training_data, train_labels, epochs=10, batch_size=256, validation_data=(testing_data, test_labels))

eval_model(model)
```

```
Model: "model_7"
_________________________________________________________________
 Layer (type)                Output Shape              Param #
=================================================================
 input_8 (InputLayer)        [(None, 500)]             0

 embedding_7 (Embedding)     (None, 500, 32)           315104

 conv1d (Conv1D)             (None, 498, 50)           4850

 max_pooling1d (MaxPooling1D  (None, 249, 50)          0
 )

 conv1d_1 (Conv1D)           (None, 247, 40)           6040

 max_pooling1d_1 (MaxPooling  (None, 123, 40)          0
 1D)

 conv1d_2 (Conv1D)           (None, 121, 30)           3630

 max_pooling1d_2 (MaxPooling  (None, 60, 30)           0
 1D)

 conv1d_3 (Conv1D)           (None, 58, 30)            2730

 max_pooling1d_3 (MaxPooling  (None, 29, 30)           0
 1D)

 flatten_2 (Flatten)         (None, 870)               0

 dense_22 (Dense)            (None, 20)                17420

 dropout_6 (Dropout)         (None, 20)                0

 dense_23 (Dense)            (None, 1)                 21

 activation_22 (Activation)  (None, 1)                 0

=================================================================
Total params: 349,795
Trainable params: 349,795
Non-trainable params: 0
_________________________________________________________________
Epoch 1/10
157/157 [==============================] - 32s 199ms/step - loss: 0.6674 - accuracy: 0.5586 - val_loss: 0.5109
- val_accuracy: 0.7524
Epoch 2/10
157/157 [==============================] - 30s 192ms/step - loss: 0.4688 - accuracy: 0.7837 - val_loss: 0.4501
- val_accuracy: 0.7960
Epoch 3/10
157/157 [==============================] - 31s 198ms/step - loss: 0.4175 - accuracy: 0.8153 - val_loss: 0.4482
- val_accuracy: 0.8048
Epoch 4/10
157/157 [==============================] - 36s 232ms/step - loss: 0.4020 - accuracy: 0.8237 - val_loss: 0.4723
- val_accuracy: 0.7826
Epoch 5/10
157/157 [==============================] - 36s 228ms/step - loss: 0.3861 - accuracy: 0.8316 - val_loss: 0.4570
- val_accuracy: 0.7946
Epoch 6/10
157/157 [==============================] - 37s 233ms/step - loss: 0.3678 - accuracy: 0.8402 - val_loss: 0.4715
- val_accuracy: 0.7976
Epoch 7/10
157/157 [==============================] - 32s 202ms/step - loss: 0.3533 - accuracy: 0.8497 - val_loss: 0.4856
- val_accuracy: 0.7912
Epoch 8/10
157/157 [==============================] - 31s 194ms/step - loss: 0.3367 - accuracy: 0.8575 - val_loss: 0.5128
- val_accuracy: 0.7796
Epoch 9/10
157/157 [==============================] - 41s 264ms/step - loss: 0.3129 - accuracy: 0.8694 - val_loss: 0.4967
- val_accuracy: 0.7868
Epoch 10/10
157/157 [==============================] - 39s 250ms/step - loss: 0.2843 - accuracy: 0.8834 - val_loss: 0.5695
- val_accuracy: 0.7766
Evaluate model on test data
20/20 [==============================] - 1s 39ms/step - loss: 0.5695 - accuracy: 0.7766
test loss, test acc: [0.5694724917411804, 0.7766000032424927]
Generate a prediction
157/157 [==============================] - 1s 9ms/step
[[6.9599976e-03]
 [4.6985292e-01]
 [1.7813570e-04]
 ...
 [2.9911631e-04]
 [1.2465519e-03]
 [3.7010607e-01]]
[[0.]
 [0.]
 [0.]
 ...
 [0.]
 [0.]
 [0.]]
(5000, 1)
[[2121  743]
 [ 374 1762]]
```

In [44]:

```
from wordcloud import WordCloud
from wordcloud import ImageColorGenerator
from wordcloud import STOPWORDS
import matplotlib.pyplot as plt
import pandas as pd

data = pd.read_csv("Train.csv")
print(data.head())
```

```
                                                text  label
0  I grew up (b. 1965) watching and loving the Th...      0
1  When I put this movie in my DVD player, and sa...      0
2  Why do people who do not know what a particula...      0
3  Even though I have great interest in Biblical ...      0
4  Im a die hard Dads Army fan and nothing will e...      1
```

In [54]:

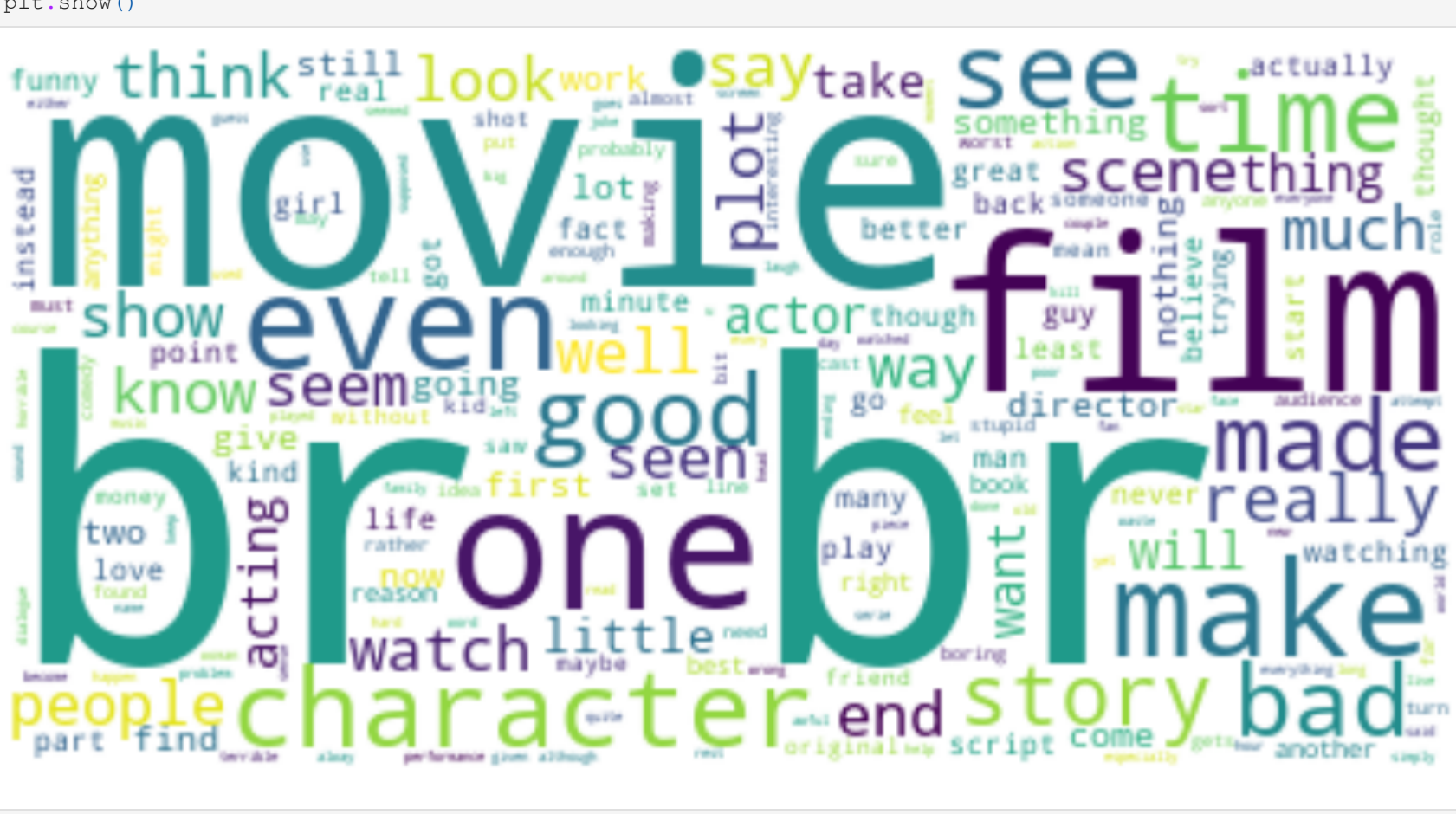
```
data_pos = data[data['label'] == 1]
data_neg = data[data['label'] == 0]
```

In [55]:

```
text = " ".join(i for i in data_pos.text)
stopwords = set(STOPWORDS)
wordcloud = WordCloud(stopwords=stopwords, background_color="white").generate(text)
plt.figure( figsize=(15,10))
plt.imshow(wordcloud, interpolation='bilinear')
plt.axis("off")
plt.show()
```

In [56]:

```
text = " ".join(i for i in data_neg.text)
stopwords = set(STOPWORDS)
wordcloud = WordCloud(stopwords=stopwords, background_color="white").generate(text)
plt.figure( figsize=(15,10))
plt.imshow(wordcloud, interpolation='bilinear')
plt.axis("off")
plt.show()
```



In [58]:

```
# Data gathering via API - URLs and GET
# Cleaning and preparing text DATA
# DTM and Data Frames
# Training and Testing at DT

#########################################
# https://newsapi.org/ for register an API key
#########################################

# Example URL
# https://newsapi.org/v2/everything?
# q=tesla&from=2021-05-20&sortBy=publishedAt&
# apiKey="1df08f5f5fd54b8eb321e7d512acd363"

# What to import
import requests
import re
import pandas as pd
from pandas import DataFrame

## To tokenize and vectorize text type data
from sklearn.feature_extraction.text import CountVectorizer
import numpy as np

# import PIL
# import Pillow
# import wordcloud
from wordcloud import WordCloud, STOPWORDS
import matplotlib.pyplot as plt

from sklearn.model_selection import train_test_split
import random as rd
from sklearn.naive_bayes import MultinomialNB
from sklearn.metrics import confusion_matrix
# from sklearn.naive_bayes import BernoulliNB
from sklearn.tree import DecisionTreeClassifier, plot_tree
from sklearn import tree
import graphviz

from sklearn.decomposition import LatentDirichletAllocation

from sklearn.metrics import silhouette_samples, silhouette_score
import sklearn
from sklearn.cluster import KMeans

from sklearn import preprocessing

import seaborn as sns
from sklearn.metrics.pairwise import euclidean_distances
from sklearn.metrics.pairwise import cosine_similarity
from sklearn.manifold import MDS
from mpl_toolkits.mplot3d import Axes3D
from scipy.cluster.hierarchy import ward, dendrogram

#######################################
##
##  Step 1: Connect to the server
##          Send a query
##          Collect and clean the
##          results
#######################################

####################################################
##In the following loop, we will query the newsapi servers
##for all the topic names in the list
## We will then build a large csv file
## where each article is a row
##
## From there, we will convert this data
## into a labeled dataframe
## so we can train and then test our DT
## model
####################################################

####################################################
## Build the URL and GET the results
## NOTE: At the bottom of this code
## commented out, you will find a second
## method for doing the following. This is FYI.
####################################################

## This is the endpoint - the server and
## location on the server where your data
## will be retrieved from

## TEST FIRST!
## We are about to build this URL:
## https://newsapi.org/v2/everything?apiKey=8f4134 your key here 0f22bqq=bitcoin

topics = ["abortion", "election"]

## topics needs to be a list of strings (words)
## Next, let's build the csv file
## first and add the column names
## Create a new csv file to save the headlines
filename = "NewHeadlines.csv"
MyFILE = open(filename, "w")  # "a"  for append   "r" for read
## with open
### Place the column names in - write to the first row
WriteThis = "LABEL,Date,Source,Title,Headline\n"
MyFILE.write(WriteThis)
MyFILE.close()

## CHeck it! Can you find this file?

#### --------------------> GATHER - CLEAN - CREATE FILE

## RE: documentation and options
## https://newsapi.org/docs/endpoints/everything

endpoint = "https://newsapi.org/v2/everything"

################# enter for loop to collect
################# data on three topics
#######################################

for topic in topics:

    ## Dictionary Structure
    URLPost = {'apiKey': '1df08f5f5fd54b8eb321e7d512acd363',
               'q': topic
    }

    response = requests.get(endpoint, URLPost)
    print(response)
    jsontxt = response.json()
    print(jsontxt)
    ####################################################

    ## Open the file for append
    MyFILE = open(filename, "a")
    LABEL = topic
    for items in jsontxt["articles"]:
        print(items, "\n\n\n")

        #Author=items["author"]
        #Author=str(Author)
        #Author=Author.replace(',', '')

        Source = items["source"]["name"]
        print(Source)

        Date = items["publishedAt"]
        ##clean up the date
        NewDate = Date.split("T")
        Date = NewDate[0]
        print(Date)

        ## CLEAN the Title
        ##----------------------------------------------------------
        ##Replace punctuation with space
        # Accept one or more copies of punctuation
        # plus zero or more copies of a space
        # and replace it with a single space
        Title = items["title"]
        Title = str(Title)
        #print(Title)
        Title = re.sub(r'[,.;@#?!&$\-\']+', ' ', str(Title), flags=re.IGNORECASE)
        Title = re.sub(' +', ' ', str(Title), flags=re.IGNORECASE)
        Title = re.sub(r'\"', ' ', str(Title), flags=re.IGNORECASE)

        # and replace it with a single space
        ## NOTE: Using the "^" on the inside of the [] means
        ## we want to look for any chars NOT a-z or A-Z and replace
        ## them with blank. This removes chars that should not be there.
        Title = re.sub(r'[^a-zA-Z]', " ", str(Title), flags=re.VERBOSE)
        Title = Title.replace(',', '')
        Title = ' '.join(Title.split())
        Title = re.sub("\n|\r", "", Title)
        print(Title)
        ##----------------------------------------------------------

        Headline = items["description"]
        Headline = str(Headline)
        Headline = re.sub(r'[,.;@#?!&$\-\']+', ' ', Headline, flags=re.IGNORECASE)
        Headline = re.sub(' +', ' ', Headline, flags=re.IGNORECASE)
        Headline = re.sub(r'\"', ' ', Headline, flags=re.IGNORECASE)
        Headline = re.sub(r'[^a-zA-Z]', " ", Headline, flags=re.VERBOSE)
        ## Be sure there are no commas in the headlines or it will
        ## write poorly to a csv file....
        Headline = Headline.replace(',', '')
        Headline = ' '.join(Headline.split())
        Headline = re.sub("\n|\r", "", Headline)

        ### AS AN OPTION - remove words of a given length............
        Headline = ' '.join([wd for wd in Headline.split() if len(wd) > 3])

        #print("Author: ", Author, "\n")
        #print("Title: ", Title, "\n")
        #print("Headline News Item: ", Headline, "\n\n")

        #print(Author)
        print(Title)
        print(Headline)

        WriteThis = str(LABEL) + "," + str(Date) + "," + str(Source) + "," + str(Title) + "," + str(Headline) + "\n"
        print(WriteThis)

        MyFILE.write(WriteThis)

    ## CLOSE THE FILE
    MyFILE.close()

################## END for loop

####################################################
##
## Where are we now?
##
## So far, we have created a csv file
## with labeled data. Each row is a news article
##
## - BUT -
## We are not done. We need to choose which
## parts of this data to use to model our decision tree
## and we need to convert the data into a data frame.
##
####################################################

BBC_DF = pd.read_csv(filename, error_bad_lines=False)
print(BBC_DF.head())
# iterating the columns
for col in BBC_DF.columns:
    print(col)

print(BBC_DF["Headline"])

## REMOVE any rows with NaN in them
BBC_DF = BBC_DF.dropna()
print(BBC_DF["Headline"])

### Tokenize and Vectorize the Headlines
## Create the list of headlines
## Keep the labels!

HeadlineLIST = []
LabelLIST = []

for nexthead, nextlabel in zip(BBC_DF["Headline"], BBC_DF["LABEL"]):
    HeadlineLIST.append(nexthead)
    LabelLIST.append(nextlabel)

print("The headline list is:\n")
print(HeadlineLIST)

print("The label list is:\n")
print(LabelLIST)

####################################################
## Remove all words that match the topics.
## For example, if the topics are food and covid
## remove these exact words.
##
## We will need to do this by hand.
NewHeadlineLIST = []

for element in HeadlineLIST:
    print(element)
    print(type(element))
    ## make into list
    AllWords = element.split(" ")
    print(AllWords)

    ## Now remove words that are in your topics
    NewWordsList = []
    for word in AllWords:
        print(word)
        word = word.lower()
        if word in topics:
            print(word)
        else:
            NewWordsList.append(word)

    ##turn back to string
    NewWords = " ".join(NewWordsList)
    ## Place into NewHeadlineLIST
    NewHeadlineLIST.append(NewWords)

##
## Set the     HeadlineLIST to the new one
HeadlineLIST = NewHeadlineLIST
print(HeadlineLIST)
#########################################
##
##  Build the labeled dataframe
##
######################################################

### Vectorize
## Instantiate your CV
MyCountV = CountVectorizer(
    input="content",  ## because we have a csv file
    lowercase=True,
    stop_words="english",
    max_features=50
)

## Use your CV
MyDTM = MyCountV.fit_transform(HeadlineLIST)  # create a sparse matrix
print(type(MyDTM))

ColumnNames = MyCountV.get_feature_names()
# print(type(ColumnNames))

## Build the data frame
MyDTM_DF = pd.DataFrame(MyDTM.toarray(), columns=ColumnNames)

## Convert the labels from list to df
Labels_DF = DataFrame(LabelLIST, columns=['LABEL'])

## Check your new DF and you new Labels df:
print("Labels\n")
print(Labels_DF)
print("News df\n")
print(MyDTM_DF.iloc[:, 0:6])

##Save original DF - without the labels
My_Orig_DF = MyDTM_DF
print(My_Orig_DF)
######################
## AND - just to make sure our dataframe is fair
## let's remove columns called:
## food, bitcoin, and sports (as these are label names)
######################
# MyDTM_DF=MyDTM_DF.drop(topics, axis=1)

## Now - let's create a complete and labeled
## dataframe:
dfs = [Labels_DF, MyDTM_DF]
print(dfs)

Final_News_DF_Labeled = pd.concat(dfs, axis=1, join='inner')
## DF with labels
print(Final_News_DF_Labeled)

#############################################
##
## Create Training and Testing Data
##
## Then model and test the Decision Tree
##
################################################

## Before we start our modeling, let's visualize and
## explore.

##It might be very interesting to see the word clouds
## for each  of the topics.
##--------------------------------------------------------------------------
List_of_WC = []

for mytopic in topics:
    tempdf = Final_News_DF_Labeled[Final_News_DF_Labeled['LABEL'] == mytopic]
    print(tempdf)

    tempdf = tempdf.sum(axis=0, numeric_only=True)
    # print(tempdf)

    # Make var name
    NextVarName = str("wc" + str(mytopic))
    # print( NextVarName)

    ##In the same folder as this code, I have three images
    ## They are called: food.jpg, bitcoin.jpg, and sports.jpg
    # next_image=str(str(mytopic) + ".jpg")
    # print(next_image)

    ## https://amueller.github.io/word_cloud/generated/wordcloud.WordCloud.html

    ###########
    ## Create and store in a list the wordcloud OBJECTS
    #########
    NextVarName = WordCloud(width=1000, height=600, background_color="white",
                            min_word_length=4,  # mask=next_image,
                            max_words=400).generate_from_frequencies(tempdf)

    ## Here, this list holds all three wordclouds I am building
    List_of_WC.append(NextVarName)

##------------------------------------------------------------------
print(List_of_WC)
##########
########## Create the wordclouds
##########
fig = plt.figure(figsize=(25, 25))
# figure, axes = plt.subplots(nrows=2, ncols=2)
NumTopics = len(topics)
for i in range(NumTopics):
    print(i)
    ax = fig.add_subplot(NumTopics, 1, i + 1)
    plt.imshow(List_of_WC[i], interpolation='bilinear')
    plt.axis("off")
    plt.savefig("NewClouds.pdf")
```

o weeks to go until election day, Democrats hopes of defying political history and keeping their narrow majorities in the House and Senate appear to be fading, as many of the partys … [+4861 chars]'}, {'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hgetahun@insider.com (Hannah Getahun)', 'title': 'Proposition 1: Californians will vote to make abortion a constitutional right', 'description': "A yes on California's Proposition 1 will amend the state's constitution to say that the state cannot take away a person's right to abortion or contraception and will not interfere with reproductive freedoms.", 'url': 'https://www.businessinsider.com/results-california-proposition-1-abortion-constitutional-right-2022-11', 'urlToImage': 'https://i.insider.com/6363f16fff27460018ed714d?width=1200&format=jpeg', 'publishedAt': '2022-11-08T00:08:14Z', 'content': 'A "yes" on California\'s Proposition 1 will amend the state\'s constitution to say that the state cannot take away a person\'s right to abortion or contraception and will not interfere with reproductive… [+1705 chars]'}, {'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hgetahun@insider.com (Hannah Getahun)', 'title': 'Proposition 1: Californians will vote to make abortion a constitutional right', 'description': "A yes on California's Proposition 1 will amend the state's constitution to say that the state cannot take away a person's right to abortion or contraception and will not interfere with reproductive freedoms.", 'url': 'https://www.businessinsider.com/california-proposition-1-abortion-constitutional-right-2022', 'urlToImage': 'https://i.insider.com/6363f16fff27460018ed714d?width=1200&format=jpeg', 'publishedAt': '2022-11-03T20:55:04Z', 'content': 'A "yes" on California\'s Proposition 1 will amend the state\'s constitution to say that the state cannot take away a person\'s right to abortion or contraception and will not interfere with reproductive… [+1705 chars]'}, {'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Abortion foes largely lose $2.4 mln appeal over Planned Parenthood videos - Reuters', 'description': 'Anti-abortion group Center for Medical Progress, its founder David Daleiden and others on Friday lost most of their challenge to a $2.4 million judgment entered against them after a jury found they broke the law by secretly recording Planned Parenthood employ…', 'url': 'https://www.reuters.com/legal/litigation/abortion-foes-largely-lose-24-mln-appeal-over-planned-parenthood-videos-2022-10-21/', 'urlToImage': 'https://www.reuters.com/resizer/h8jmTDusIEKakiTB0lgwGPyaQnM=/728x381/smart/filters:quality(80)/cloudfront-us-east-2.images.arcpublishing.com/reuters/IXSG4V36AFLL5EMLVSM3NKBGPY.jpg', 'publishedAt': '2022-10-21T21:22:00Z', 'content': '
\r\nSummary
\r\nLaw firms
\r\nRelated documents
\r\n(Reuters) - Anti-abortion group Center for Medical Progress, its founder David Daleiden and others on Friday lost most of … [+3241 chars]'}, {'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Far-right Independence Day march draws thousands in Warsaw - Reuters', 'description': 'Thousands of people gathered in Warsaw on Friday for an annual march organised by the far-right to mark Independence Day, with a handful carrying white supremacist or anti-gay rights banners and firing off red flares.', 'url': 'https://www.reuters.com/world/europe/far-right-independence-day-march-draws-thousands-warsaw-2022-11-11/', 'urlToImage': 'https://www.reuters.com/resizer/HR7jKyspFtVuBk1UvAOdju4QpXE=/1200x628/smart/filters:quality(80)/cloudfront-us-east-2.images.arcpublishing.com/reuters/ULK4QBIZD5NXFB4T2RY4B4NOQA.jpg', 'publishedAt': '2022-11-11T14:28:00Z', 'content': 'WARSAW, Nov 11 (Reuters) - Thousands of people gathered in Warsaw on Friday for an annual march organised by the far-right to mark Independence Day, with a handful carrying white supremacist or anti-… [+1268 chars]'}, {'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hgetahun@insider.com (Hannah Getahun)', 'title': 'Proposal 5: Vermont will vote to protect reproductive autonomy', 'description': "Vermont citizens will decide if the state's constitution should add language that protects the right to reproductive autonomy", 'url': 'https://www.businessinsider.com/vermont-proposal-5-abortion-pro-choice-life-2022-10', 'urlToImage': 'https://i.insider.com/6363f22fff27460018ed71a8?width=1200&format=jpeg', 'publishedAt': '2022-11-03T20:54:52Z', 'content': 'A "yes" on Vermont\'s Proposal 5, also known as Article 22, will amend the state\'s constitution and add language that protects reproductive freedom, including abortion.\r\nBallot measure details\r\nPropos… [+1529 chars]'}, {'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hgetahun@insider.com (Hannah Getahun)', 'title': 'Proposal 5: Vermont will vote to protect reproductive autonomy', 'description': "Vermont citizens will decide if the state's constitution should add language that protects the right to reproductive autonomy", 'url': 'https://www.businessinsider.com/results-vermont-proposal-5-reproductive-autonomy-2022-11', 'urlToImage': 'https://i.insider.com/6363f22fff27460018ed71a8?width=1200&format=jpeg', 'publishedAt': '2022-11-08T00:08:45Z', 'content': 'A "yes" on Vermont\'s Proposal 5, also known as Article 22, will amend the state\'s constitution and add language that protects reproductive freedom, including abortion.\r\nBallot measure details\r\nPropos… [+1529 chars]'}, {'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Gregory Krieg', 'title': 'Democrats won the Senate after flipping Georgia last year. The state could be pivotal once again', 'description': 'The fight for control of the US Senate could come down to Georgia -- again.', 'url': 'https://www.cnn.com/2022/11/03/politics/georgia-senate-race-2022-midterms-warnock-walker/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221103091104-herschel-walker-and-raphael-warnock.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-11-03T11:02:49Z', 'content': 'The fight for control of the US Senate could come down to Georgia again.\r\nFor the second time in less than two years, the Peach State, which elected two Democratic senators in the last election cycle… [+4168 chars]'}, {'source': {'id': None, 'name': 'NPR'}, 'author': 'Rick Pluta, Michigan Public Radio Network', 'title': 'Democratic Gov. Gretchen Whitmer wins reelection in Michigan', 'description': 'Michigan Gov. Gretchen Whitmer wins race for governor over Republican Tudor Dixon.', 'url': 'https://www.npr.org/2022/11/09/1134200542/michigan-election-governor-midterms-results-whitmer-dixon', 'urlToImage': 'https://media.npr.org/assets/img/2022/11/08/gettyimages-1439881295-1-_wide-e25f5a55e9bcfd5aababb25ec1bb8007cdb723cc-s1400-c100.jpg', 'publishedAt': '2022-11-09T06:26:01Z', 'content': 'Michigan Gov. Gretchen Whitmer speaks during a campaign rally at Michigan State University on Nov. 7, in East Lansing, Mich.\r\nBrandon Bell/Getty Images\r\nDETROIT Michigan Gov. Gretchen Whitmer, a Demo… [+739 chars]'}]}
{'source': {'id': 'the-verge', 'name': 'The Verge'}, 'author': 'Lux Alptraum', 'title': 'The human threat to abortion seekers', 'description': 'The end of Roe v. Wade has reinvigorated fears about data security, but the weakest link for abortion seekers is often other people.', 'url': 'https://www.theverge.com/23385553/abortion-seekers-security-threats-human-factor', 'urlToImage': 'https://cdn.vox-cdn.com/thumbor/v306QQO0km-eNJHACVZ3U0IGUkA=/0x0:3000x2000/1200x628/filters:focal(1500x1000:1501x1001)/cdn.vox-cdn.com/uploads/chorus_asset/file/24077781/5_vincentkilbride_theverge_cybersecurity.jpg', 'publishedAt': '2022-10-15T13:00:00Z', 'content': 'The human threat to abortion seekers\r\nThe human threat to abortion seekers\r\n / Apps and data matter \xa0but people are often a weaker link\r\nIn the years before Roe v. Wade, an anonymous group of Chicago… [+7421 chars]'}

The Verge
2022-10-15
The human threat to abortion seekers
The human threat to abortion seekers
Wade reinvigorated fears about data security weakest link abortion seekers often other people
abortion,2022-10-15,The Verge,The human threat to abortion seekers,Wade reinvigorated fears about data security weakest link abortion seekers often other people

{'source': {'id': 'bbc-news', 'name': 'BBC News'}, 'author': 'https://www.facebook.com/bbcnews', 'title': 'Abortion election results: Vermont first to put abortion rights in constitution', 'description': "Four other states have voted on abortion rights - an issue that is close to the top of voters' priorities.", 'url': 'https://www.bbc.co.uk/news/world-us-canada-63564062', 'urlToImage': 'https://ichef.bbci.co.uk/news/1024/branded_news/10B4A/production/_127562486_gettyimages-1438480161.jpg', 'publishedAt': '2022-11-09T04:23:06Z', 'content': 'Vermont is set to become the first state in the US to formally enshrine the right to an abortion in the constitution, after more 70% voted in favour of the measure, projections say.\r\nCalifornia, Mont… [+1606 chars]'}

BBC News
2022-11-09
Abortion election results Vermont first to put abortion rights in constitution
Abortion election results Vermont first to put abortion rights in constitution
Four other states have voted abortion rights issue that close voters priorities
abortion,2022-11-09,BBC News,Abortion election results Vermont first to put abortion rights in constitution,Four other states have voted abortion rights issue that close voters priorities

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Mary Ziegler', 'title': 'Opinion: The biggest lesson of the 2022 midterm election cycle', 'description': "For the past several weeks, pundits warned that Democrats had peaked too early. True, Americans did not like the Supreme Court's decision this summer to reverse Roe v. Wade and destroy abortion rights. But we were all told that June was a long time ago. Other…", 'url': 'https://www.cnn.com/2022/11/10/opinions/midterm-elections-abortion-rights-ziegler/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221109203251-votantes-elecciones.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-11-10T11:12:28Z', 'content': 'Editors Note: Mary Ziegler is the Martin Luther King Professor of Law at UC Davis and author of the book Dollars for Life: The Anti-Abortion Movement and the Fall of the Republican Establishment. The… [+5744 chars]'}

CNN
2022-11-10
Opinion The biggest lesson of the midterm election cycle
Opinion The biggest lesson of the midterm election cycle
past several weeks pundits warned that Democrats peaked early True Americans like Supreme Court decision this summer reverse Wade destroy abortion rights were told that June long time Other
abortion,2022-11-10,CNN,Opinion The biggest lesson of the midterm election cycle,past several weeks pundits warned that Democrats peaked early True Americans like Supreme Court decision this summer reverse Wade destroy abortion rights were told that June long time Other

{'source': {'id': 'bbc-news', 'name': 'BBC News'}, 'author': 'https://www.facebook.com/bbcnews', 'title': 'US midterms: Why abortion matters in these crucial elections', 'description': "Inflation is voters' top issue, but Democrats hope anger over abortion bans will boost turnout.", 'url': 'https://www.bbc.co.uk/news/world-us-canada-63434895', 'urlToImage': 'https://ichef.bbci.co.uk/news/1024/branded_news/13E1/production/_125798050_hi076912464.jpg', 'publishedAt': '2022-11-06T00:58:18Z', 'content': "I met Susan Van Hoek at a pro-choice women's demonstration in Michigan's capital, Lansing. As she stood there with a placard, wearing her long grey hair loose,

abortion,2022-11-10,Reuters,Biden administration says pregnant migrant youth should have access to abortion Reuters,Biden administration issued directive Thursday saying that pregnant migrant children should sheltered states that allow abortions following Supreme Court ruling that eliminated constitutional right abortion

{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hkang@insider.com (Hannah Kang)', 'title': 'Democratic Rep. Annie Kuster faces off against Republican Bob Burns in New Hampshire's 2nd Congressional District election', 'description': 'Kuster believes the biggest issue in November will be abortion, while her challenger, Bob Burns, says it is inflation.', 'url': 'https://www.businessinsider.com/annie-kuster-bob-burns-new-hampshire-election-2nd-district-house-race-candidates-2022', 'urlToImage': 'https://i.insider.com/63485...44077e8d900199a8a2a?width=1200&format=jpeg', 'publishedAt': '2022-10-21T20:49:22Z', 'content': 'Democratic Rep. Annie Kuster faces off against Republican Bob Burns in New Hampshire's 2nd Congressional District.\r\nNew Hampshire's 2nd Congressional District candidates\r\nKuster, running for her 6th … [+3104 chars]'}

Business Insider
2022-10-21
Democratic Rep Annie Kuster faces off against Republican Bob Burns in New Hampshire s 2nd Congressional District election
Democratic Rep Annie Kuster faces off against Republican Bob Burns in New Hampshire s 2nd Congressional District election
Kuster believes biggest issue November will abortion while challenger Burns says inflation
abortion,2022-10-21,Business Insider,Democratic Rep Annie Kuster faces off against Republican Bob Burns in New Hampshire s 2nd Congressional District election,Kuster believes biggest issue November will abortion while challenger Burns says inflation

{'source': {'id': None, 'name': 'Yahoo Entertainment'}, 'author': 'Susan Rinkunas', 'title': 'As Herschel Walker's Abortion Lies Pile Up, Gloria Allred Has Entered the Chat', 'description': 'A second woman has now accused Herschel Walker of paying for an abortion when they dated. And the saga now involves mega ...', 'url': 'https://news.yahoo.com/herschel-walkers-abortion-lies-pile-193500304.html', 'urlToImage': 'https://media.zenfs.com/en/jezebel_news_500/8815a80cd6c97377fa94eba6e9fad6', 'publishedAt': '2022-10-27T18:35:00Z', 'content': 'Herschel walker denying abortion allegation on Fox News on 10/26/22. Gloria Allred is a press conference\r\nA second woman has now accused another outlining allegation he paid for an abortion at a press conference … [+4498 chars]'}

Yahoo Entertainment
2022-10-27
As Herschel Walker s Abortion Lies Pile Up Gloria Allred Has Entered the Chat
As Herschel Walker s Abortion Lies Pile Up Gloria Allred Has Entered the Chat
second woman accused abortion Georgia Senate nominee Herschel Walker paying abortion when they dated saga involves mega
abortion,2022-10-27,Yahoo Entertainment,As Herschel Walker s Abortion Lies Pile Up Gloria Allred Has Entered the Chat,second woman accused abortion Georgia Senate nominee Herschel Walker paying abortion when they dated saga involves mega

{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Indiana doctor sues attorney general in 10-year-old's abortion case - Reuters.com', 'description': 'An Indiana doctor who performed an abortion on a 10-year-old Ohio rape victim sued Indiana's attorney general on Thursday, demanding an end to investigations seeking medical records about patients for abortions.', 'url': 'https://www.reuters.com/legal/indiana-doctor-sues-attorney-general-10-year-olds-abortion-case-2022-11-03/', 'urlToImage': 'https://www.reuters.com/resizer/owv55Vy8oTq5ud0IWqQO0en_ABM=/1200x628/smart/filters:quality(80)/cloudfront-us-east-2.images.arcpublishing.com/reuters/O4KKOWBD3JPOHO4ECYY2XENQ4Q.jpg', 'publishedAt': '2022-11-03T22:42:00Z', 'content': 'Nov 3 (Reuters) - An Indiana doctor who performed an abortion on a 10-year-old Ohio rape victim sued Indiana's attorney general on Thursday, demanding an end to investigations seeking medical records … [+2483 chars]'}

Reuters
2022-11-03
Indiana doctor sues attorney general in year old s abortion case Reuters com
Indiana doctor sues attorney general in year old s abortion case Reuters com
Indiana doctor performed abortion year old Ohio rape victim sued Indiana attorney general Thursday demanding investigations seeking medical records about patients their abortions
abortion,2022-11-03,Reuters,Indiana doctor sues attorney general in year old s abortion case Reuters com,Indiana doctor performed abortion year old Ohio rape victim sued Indiana attorney general Thursday demanding investigations seeking medical records about patients their abortions

{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Mexico's border state Quintana Roo becomes 11th to allow abortion - Reuters.com', 'description': 'Lawmakers in Mexico's southern border state of Quintana Roo voted on Tuesday to decriminalize abortion, making it the 11th in a string of states to rewrite their laws after the top court ruled it unconstitutional in 2021.', 'url': 'https://www.reuters.com/world/americas/mexicos-border-state-quintana-roo-becomes-11th-allow-abortion-2022-10-26/', 'urlToImage': 'https://www.reuters.com/pf/resources/images/reuters/reuters-default.png?d=117', 'publishedAt': '2022-10-26T18:53:00Z', 'content': 'MEXICO CITY, Oct 26 (Reuters) - Lawmakers in Mexico's southern border state of Quintana Roo voted on Tuesday to decriminalize abortion, making it the 11th in a string of states to rewrite their laws … [+1797 chars]'}

Reuters
2022-10-26
Mexico s border state Quintana Roo becomes th to allow abortion Reuters com
Mexico s border state Quintana Roo becomes th to allow abortion Reuters com
Lawmakers Mexico southern border state Quintana Roo voted Tuesday decriminalize abortion making string states rewrite their laws after ruled unconstitutional
abortion,2022-10-26,Reuters,Mexico s border state Quintana Roo becomes th to allow abortion Reuters com,Lawmakers Mexico southern border state Quintana Roo voted Tuesday decriminalize abortion making string states rewrite their laws after ruled unconstitutional

{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Honduras to legalize morning-after pill for rape victims - Reuters', 'description': 'Honduras will authorize the use of the morning-after pill for rape victims after more than a decade of total restrictions, the country's health minister announced late on Monday, though a complete ban on abortion continues.', 'url': 'https://www.reuters.com/world/americas/honduras-legalize-morning-after-pill-rape-victims-2022-11-01/', 'urlToImage': 'https://www.reuters.com/pf/resources/images/reuters/reuters-default.png?d=118', 'publishedAt': '2022-11-01T17:42:00Z', 'content': 'TEGUCIGALPA, Nov 1 (Reuters) - Honduras will authorize the use of the morning-after pill for rape victims after more than a decade of total restrictions, the country's health minister announced … [+1676 chars]'}

Reuters
2022-11-01
Honduras to legalize morning after pill for rape victims Reuters
Honduras to legalize morning after pill for rape victims Reuters
Honduras will authorize morning after pill rape victims after more than decade total restrictions country health minister announced late Monday though complete abortion continues
abortion,2022-11-01,Reuters,Honduras to legalize morning after pill for rape victims Reuters,Honduras will authorize morning after pill rape victims after more than decade total restrictions country health minister announced late Monday though complete abortion continues

{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Some in White House worry abortion message bungled before midterms - Reuters', 'description': 'Some senior White House officials have been second-guessing their messaging to voters around abortion in recent weeks, concerned that the issue is not resonating as much as they hoped in the run-up to the midterm elections, according to sources familiar with the matter.', 'url': 'https://www.reuters.com/world/us/some-white-house-worry-abortion-message-bungled-before-midterms-2022-11-07/', 'urlToImage': 'https://www.reuters.com/resizer/osZVSp1mONTSguE2IXf1JocaWs=/1200x628/smart/filters:quality(80)/cloudfront-us-east-2.images.arcpublishing.com/reuters/FO4CNTZPOFLJHMAV73UICCYEXE.jpg', 'publishedAt': '2022-11-07T11:11:00Z', 'content': 'WASHINGTON, Nov 7 (Reuters) - Some senior White House officials have been second-guessing their messaging to voters around abortion in recent weeks, sources familiar with the matter said, as forecasts… [+3702 chars]'}

Reuters
2022-11-07
Some in White House worry abortion message bungled before midterms Reuters
Some in White House worry abortion message bungled before midterms Reuters
Some senior White House officials have been second guessing their messaging voters around abortion recent weeks sources familiar with matter said forecasts turned Republicans favor midterm elections
abortion,2022-11-07,Reuters,Some in White House worry abortion message bungled before midterms Reuters,Some senior White House officials have been second guessing their messaging voters around abortion recent weeks sources familiar with matter said forecasts turned Republicans favor midterm elections

{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Standing ovations for conservative U.S. justices at Federalist Society event - Reuters', 'description': 'U.S. Supreme Court Justices Samuel Alito and Amy Coney Barrett received standing ovations from members of the conservative Federalist Society on Thursday at its first annual convention since the court overturned a nationwide right to abortion.', 'url': 'https://www.reuters.com/world/us/standing-ovations-conservative-us-justices-federalist-society-event-2022-11-11/', 'urlToImage': 'https://www.reuters.com/resizer/AvwJqMwRyFdFrxrt-us-east-2.images.arcpublishing.com/reuters/XJWXUHKHZTEXHZLYDZQPOMSCR4E7EE.jpg', 'publishedAt': '2022-11-11T05:14:00Z', 'content': 'WASHINGTON, Nov 10 (Reuters) - U.S. Supreme Court Justices Samuel Alito and Amy Coney Barrett received standing ovations from members of the conservative Federalist Society on Thursday at its first a… [+2177 chars]'}

Reuters
2022-11-11
Standing ovations for conservative U S justices at Federalist Society event Reuters
Standing ovations for conservative U S justices at Federalist Society event Reuters
Supreme Court Justices Samuel Alito Amy Coney Barrett received standing ovations from members conservative Federalist Society Thursday first annual convention since court overturned nationwide right abortion
abortion,2022-11-11,Reuters,Standing ovations for conservative U S justices at Federalist Society event Reuters,Supreme Court Justices Samuel Alito Amy Coney Barrett received standing ovations from members conservative Federalist Society Thursday first annual convention since court overturned nationwide right abortion

{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Supreme Court's Alito says abortion draft leak made justices 'targets' - Reuters', 'description': 'U.S. Supreme Court Justice Samuel Alito on Tuesday denounced the ongoing debate over the institution's legitimacy amid a backlash over its decision on abortion last June, saying such criticism "crosses an important line."', 'url': 'https://www.reuters.com/legal/supreme-courts-alito-says-abortion-draft-leak-made-justices-targets-2022-10-26/', 'urlToImage': 'https://www.reuters.com/resizer/sxWRS5Vx3_igtont-us-east-2.images.arcpublishing.com/reuters/ZELMNDKLQMEBRGWN6EFK5EVFKM.jpg', 'publishedAt': '2022-10-26T01:08:00Z', 'content': 'Oct 25 (Reuters) - U.S. Supreme Court Justice Samuel Alito on Tuesday denounced the ongoing debate over the institution's legitimacy amid a backlash over its decision on abortion last June, saying suc… [+2990 chars]'}

Reuters
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Supreme Court s Alito says abortion draft leak made justices targets Reuters
Supreme Court s Alito says abortion draft leak made justices targets Reuters
Supreme Court Justice Samuel Alito Tuesday denounced ongoing debate over institution legitimacy amid backlash over decision abortion last June saying such criticism crosses important line
abortion,2022-10-26,Reuters,Supreme Court s Alito says abortion draft leak made justices targets Reuters,Supreme Court Justice Samuel Alito Tuesday denounced ongoing debate over institution legitimacy amid backlash over decision abortion last June saying such criticism crosses important line

{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Factbox: State supreme court elections will shape fights over redistricting, abortion - Reuters', 'description': 'The outcome of state supreme court races in next month's midterm elections could have profound consequences for control of the U.S. Congress in the future, as well as abortion rights in several states.', 'url': 'https://www.reuters.com/world/us/state-supreme-court-elections-will-shape-fights-over-redistricting-abortion-2022-11-10/', 'urlToImage': 'https://www.reuters.com/resizer/2lVzVfjRHQ25YLWLZGTqGL3yRZGyz=/1200x628/smart/filters:quality(80)/cloudfront-us-east-2.images.arcpublishing.com/reuters/ZEDRFLKGNBRFJFAJKKNAUMNEA.jpg', 'publishedAt': '2022-11-10T00:38:00Z', 'content': 'Nov 9 (Reuters) - The outcome of state supreme court races in this year's midterm elections could have profound consequences for control of the U.S. Congress in the future, as well as abortion rights … [+3210 chars]'}

Reuters
2022-11-10
Factbox State supreme court elections will shape fights over redistricting abortion Reuters
Factbox State supreme court elections will shape fights over redistricting abortion Reuters
outcome state supreme court races next month midterm elections could have profound consequences control Congress future well abortion rights several states
abortion,2022-11-10,Reuters,Factbox State supreme court elections will shape fights over redistricting abortion Reuters,outcome state supreme court races next month midterm elections could have profound consequences control Congress future well abortion rights several states

{'source': {'id': None, 'name': 'NPR'}, 'author': 'Dustin Jones', 'title': 'Democrat Maggie Hassan keeps Senate seat in New Hampshire, beating GOP's Don Bolduc', 'description': 'Hassan has long been an advocate for abortion rights. Bolduc initially pushed but backed down from Trump's false claim that the 2020 election was stolen.', 'url': 'https://www.npr.org/2022/11/09/1131361458/hassan-bolduc-nh-senate-results', 'urlToImage': 'https://media.npr.org/assets/img/2022/10/24/gettyimages-1243194477_wide.jpg', 'publishedAt': '2022-11-09T06:42:00Z', 'content': 'Incumbent Sen. Maggie Hassan defeated Republican challenger Don Bolduc, who ran on combating inflation and, during the primaries, supported Trump's unfo… [+1859 chars]'}

NPR
2022-11-09
Democrat Maggie Hassan keeps Senate seat in New Hampshire beating GOP s Don Bolduc
Democrat Maggie Hassan keeps Senate seat in New Hampshire beating GOP s Don Bolduc
Hassan long been advocate abortion rights Bolduc initially pushed but backed down from Trump false claim election stolen
abortion,2022-11-09,NPR,Democrat Maggie Hassan keeps Senate seat in New Hampshire beating GOP s Don Bolduc,Hassan long been advocate abortion rights Bolduc initially pushed but backed down from Trump false claim election stolen

{'source': {'id': None, 'name': 'NPR'}, 'author': 'Sarah McCammon', 'title': 'After wins at the ballot box, abortion rights groups want to put this to the people', 'description': 'Victories in several states this year have abortion rights advocates looking at where they can next take their fight directly to voters.', 'url': 'https://www.npr.org/2022/11/10/1135757006/after-wins-at-the-ballot-box-abortion-rights-groups-want-to-put-this-to-the-people', 'urlToImage': 'https://media.npr.org/assets/img/2022/11/10/gettyimages-1439629886_wide.jpg?s=1400&c=100.jpg', 'publishedAt': '2022-11-10T18:11:59Z', 'content': 'Sandra Bucciero and her son Luke canvass for Proposal 3 last weekend in Dearborn, Mich. Voters approved the amendment protecting abortion rights.\r\nJim Bollinger/Getty Images\r\nAbortion … [+6146 chars]'}

NPR
2022-11-10
After wins at the ballot abortion rights groups want to put this to the people
After wins at the ballot abortion rights groups want to put this to the people
Victories several states this year have abortion rights advocates looking where they next take their fight directly voters
abortion,2022-11-10,NPR,After wins at the ballot abortion rights groups want to put this to the people,Victories several states this year have abortion rights advocates looking where they next take their fight directly voters

{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'isavarise@insider.com (Isabella Savarise)', 'title': 'Rep. Alexandria Ocasio-Cortez says the stakes of the midterms are "incredibly high," with abortion access, Social Security, and Medicare on the line', 'description': 'If Republicans take back the House in November, they intend to support a national criminal abortion ban...', 'url': 'https://www.businessinsider.com/rep-alexandria-ocasio-cortez-stakes-midterms-incredibly-high-2022-10', 'urlToImage': 'https://i.insider.com/6354a6cd?width=1200&format=jpeg', 'publishedAt': '2022-10-26T03:53:22Z', 'content': 'On a recent episode of the "Pod Save America" podcast, Rep. Alexandria Ocasio-Cortez stressed just how much is at stake in the upcoming midterm elections.\r\n"The stakes of this midterm are so incredib… [+1383 chars]'}

Business Insider
2022-10-26
Rep Alexandria Ocasio Cortez says the stakes of the midterms are incredibly high with abortion access Social Security and Medicare on the line
Rep Alexandria Ocasio Cortez says the stakes of the midterms are incredibly high with abortion access Social Security and Medicare on the line
Alexandria Ocasio Cortez said Republicans take back the House November they intend support national criminal abortion
abortion,2022-10-26,Business Insider,Rep Alexandria Ocasio Cortez says the stakes of the midterms are incredibly high with abortion access Social Security and Medicare on the line,Alexandria Ocasio Cortez said Republicans take back the House November they intend support national criminal abortion

{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'oseddig@insider.com (Oma Seddiq)', 'title': 'Pennsylvania voters show their support for John Fetterman and Mehmet Oz shortly before the candidates take the debate stage', 'description': 'One voter said she's supporting Oz because Trump endorsed him, while another praised Fetterman's stance on abortion rights and LGBTQ+ issues.', 'url': 'https://www.businessinsider.com/pennsylvania-voters-show-support-fetterman-oz-before-debate-2022-10', 'urlToImage': 'https://i.insider.com/63587461fc29f001a5f7152?width=1200&format=jpeg', 'publishedAt': '2022-10-26T00:02:58Z', 'content': 'Pennsylvania voters on Tuesday evening showed their support for Democratic Lt. Gov. John Fetterman outside a news studio in the state capital, Harrisburg,… [+1876 chars]'}

Business Insider
2022-10-26
Pennsylvania voters show their support for John Fetterman and Mehmet Oz shortly before the candidates take the debate stage
Pennsylvania voters show their support for John Fetterman and Mehmet Oz shortly before the candidates take the debate stage
voter said supports because Trump endorsed while another praised Fetterman stance abortion rights LGBTQ issues
abortion,2022-10-26,Business Insider,Pennsylvania voters show their support for John Fetterman and Mehmet Oz shortly before the candidates take the debate stage,voter said supports because Trump endorsed while another praised Fetterman stance abortion rights LGBTQ issues

{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'wrojas@insider.com (Warren Rojas)', 'title': 'Ohio Republicans focused on winning a battleground Senate race still find things to admire in Tim Ryan just days before the crucial midterm elections', 'description': 'Ohio Republicans may disagree with Democratic Senate hopeful Tim Ryan on issues like abortion, but they dig that he bucks the party line from time to time.', 'url': 'https://www.businessinsider.com/tim-ryan-independent-streak-maga-voters-ohio-senate-2022-11', 'urlToImage': 'https://i.insider.com/6364f61cc816989001894709b?width=1200&format=jpeg', 'publishedAt': '2022-11-04T16:56:43Z', 'content': 'AKRON, Ohio \xa0While they certainly want to keep their Senate seat bright red in the battleground state of Ohio, Republicans are not entirel… [+3407 chars]'}

Business Insider
2022-11-04
Ohio Republicans focused on winning a battleground Senate race still find things to admire in Tim Ryan just days before the crucial midterm elections
Ohio Republicans focused on winning a battleground Senate race still find things to admire in Tim Ryan just days before the crucial midterm elections
Ohio Republicans disagree with Democratic Senate hopeful Tim Ryan issues like abortion they that bucks party from time
abortion,2022-11-04,Business Insider,Ohio Republicans focused on winning a battleground Senate race still find things to admire in Tim Ryan just days before the crucial midterm elections,Ohio Republicans disagree with Democratic Senate hopeful Tim Ryan issues like abortion they that bucks party from time

{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': 'Travis Hartman, Ally J. Levine, Clare Trainor', 'title': 'Charting the midterms - Reuters', 'description': 'The main takeaways of the 2022 midterm election, visualized', 'url': 'https://graphics.reuters.com/USA-ELECTION/MIDTERMS/zgpobwokdvd/', 'urlToImage': 'https://graphics.reuters.com/USA-ELECTION/MIDTERMS/zgpobwokdvd/cdn/images/reuters-graphics.jpg', 'publishedAt': '2022-11-09T21:27:00Z', 'content': 'The main takeaways of the 2022 midterm election, visualized\r\nThe 2022 U.S. midterm election proved stronger than the pattern of almost every election since World War Two, which normally shrinks the fo… [+4092 chars]'}

Reuters
2022-11-09
Charting the midterms Reuters
Charting the midterms Reuters
main takeaways midterm election visualized
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{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'I won't stop, says Polish abortion activist as court hearing adjourned - Reuters', 'description': 'A court on Friday adjourned a hearing on whether a prominent activist broke Polish law by supplying pills to trigger an abortion, as she pledged to continue helping women terminate unwanted pregnancies.', 'url': 'https://www.reuters.com/world/europe/i-wont-stop-says-polish-abortion-activist-court-hearing-adjourned-2022-10-14/', 'urlToImage': 'https://www.reuters.com/pf/resources/images/reuters/reuters-default.png?d=116', 'publishedAt': '2022-10-14T11:12:00Z', 'content': 'WARSAW, Oct 14 (Reuters) - A court on Friday adjourned a hearing on whether a prominent activist broke Polish law by supplying pills to trigger an abortion, as she pledged to continue helping women t… [+2101 chars]'}

Reuters
2022-10-14
I won t stop says Polish abortion activist as court hearing adjourned Reuters
I won t stop says Polish abortion activist as court hearing adjourned Reuters
court Friday adjourned hearing whether prominent activist broke Polish supplying pills trigger abortion pledged continue helping women terminate unwanted pregnancies
abortion,2022-10-14,Reuters,I won t stop says Polish abortion activist as court hearing adjourned Reuters,court Friday adjourned hearing whether prominent activist broke Polish supplying pills trigger abortion pledged continue helping women terminate unwanted pregnancies

{'source': {'id': 'the-guardian', 'name': 'The Guardian'}, 'author': 'Poppy Noor', 'title': ''I couldn't do my job at all': the doctors leaving anti-abortion states', 'description': 'Four months after Roe v Wade was overturned, some providers have left states restricting abortions or changed careers\r\nWith Roe v Wade overturned, abortion is now banned in 13 states and subject to restrictive litigation in more than a dozen states...', 'url': 'https://www.theguardian.com/us-news/2022/oct/26/us-abortion-doctors-anti-abortion-states-leaving-careers', 'urlToImage': 'https://i.guim.co.uk/img/media/...jpg?width=1200&height=630&quality=85&auto=format&fit=crop&overlay-align=bottom%2Cleft&overlay-width=100p&overlay-base64=...', 'publishedAt': '2022-10-26T10:00:07Z', 'content': 'With Roe v Wade overturned, abortion is now banned in 13 states and ... … [+12246 chars]'}

The Guardian
2022-10-26
The doctors leaving anti abortion states I couldn t do my job at all
The doctors leaving anti abortion states I couldn t do my job at all
Four months after Wade overturned some providers have left states restricting abortions changed careers With Wade overturned abortion banned states subject restrictive litigation more than dozen states
abortion,2022-10-26,The Guardian,The doctors leaving anti abortion states I couldn t do my job at all,Four months after Wade overturned some providers have left states restricting abortions changed careers With Wade overturned abortion banned states subject restrictive litigation more than dozen states

{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'cdavis@insider.com (Charles R. Davis)', 'title': 'Mehmet Oz says abortion should be decided between "women, doctors, local political leaders"', 'description': "During Tuesday's debate, Dr. Mehmet Oz said local politicians should be able to prohibit abortion...", 'url': 'https://www.businessinsider.com/oz-leave-abortion-women-doctors-local-political-leaders-2022-10', 'urlToImage': 'https://i.insider.com/63589236bf?width=1200&format=jpeg', 'publishedAt': '2022-10-26T01:21:58Z', 'content': 'In an aside on Tuesday said he would be in the language used by supporters ... Dr. Mehmet Oz ... to terminate a pregnancy is best left to a woman and her doctor… [+2314 chars]'}

Business Insider
2022-10-26
Mehmet Oz says abortion should be decided between women doctors local political leaders
Mehmet Oz says abortion should be decided between women doctors local political leaders
Mehmet Oz said Tuesday debate believes women doctors local political leaders should decide abortion
abortion,2022-10-26,Business Insider,Mehmet Oz says abortion should be decided between women doctors local political leaders,Mehmet Oz said Tuesday debate believes women doctors local political leaders should decide abortion

{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'title': 'Republicans push to kill abortion rights has Democratic women in Pennsylvania rushing to knock on doors and drive people to the polls ahead of the midterm elections', 'description': "Pennsylvania women rushing to knock on doors ahead of the midterm elections ...", 'url': 'https://www.businessinsider.com/pennsylvania-women-voters-rushing-knock-on-doors-midterms-2022-11', 'publishedAt': '2022-11-01', 'content': 'Karen Tosh is waiting to go door-knocking in ... … [+5895 chars]'}

Business Insider
2022-11-01
Republicans push to kill abortion rights has Democratic women in Pennsylvania rushing to knock on doors and drive people to the polls ahead of the midterm elections
Republicans push to kill abortion rights has Democratic women in Pennsylvania rushing to knock on doors and drive people to the polls ahead of the midterm elections
Pennsylvania women rushing knock doors drive people polls ahead midterms feelings about abortion
abortion,2022-11-01,Business Insider,Republicans push to kill abortion rights has Democratic women in Pennsylvania rushing to knock on doors and drive people to the polls ahead of the midterm elections,Pennsylvania women rushing knock doors drive people polls ahead midterms feelings about abortion

{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'esnodgrass@insider.com (Erin Snodgrass)', 'title': 'Samuel Alito assured Ted Kennedy of his respect for the Roe v. Wade precedent years before writing the majority opinion that overturned the landmark case: report', 'description': 'Samuel Alito told the late Sen. Ted Kennedy he respected the precedent...', 'url': 'https://www.businessinsider.com/samuel-alito-ted-kennedy-roe-v-wade-precedent-2022-10', 'publishedAt': '2022-10-25', 'content': 'Justice Samuel Alito respected the precedent ... in November 2005 … [+2931 chars]'}

Business Insider
2022-10-25
Samuel Alito assured Ted Kennedy of his respect for Roe v Wade precedent years before writing the majority opinion that overturned the landmark case report
Samuel Alito assured Ted Kennedy of his respect for Roe v Wade precedent years before writing the majority opinion that overturned the landmark case report
Samuel Alito told late Kennedy he respected precedent Wade years before writing majority opinion that overturned landmark case report
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{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hkang@insider.com (Hannah Kang)', 'title': 'Republican Gov. Brad Little faces off against Democrat Stephen Heidt and a handful of third-party challengers in Idaho's gubernatorial election', 'description': 'Republican Gov. Brad Little faces Democrat Stephen Heidt in Idaho's gubernatorial election.', 'url': 'https://www.businessinsider.com/brad-little-stephen-heidt-idaho-governor-election-2022', 'publishedAt': '2022-11-08', 'content': '... … [+2163 chars]'}

Business Insider
2022-11-08
Republican Gov Brad Little faces off against Democrat Stephen Heidt in Idaho gubernatorial election
Republican Gov Brad Little faces off against Democrat Stephen Heidt in Idaho gubernatorial election
Republican Brad Little faces Democrat Stephen Heidt Idaho gubernatorial election
abortion,2022-11-08,Business Insider,Republican Gov Brad Little faces off against Democrat Stephen Heidt in Idaho gubernatorial election,Republican Brad Little faces Democrat Stephen Heidt Idaho gubernatorial election

{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'asheffey@insider.com (Ayelet Sheffey)', 'title': 'AOC says "it is so out of touch to imply that abortion isn't an economic issue" as the top of voters' minds in the midterms', 'description': 'Abortion rights and inflation are top of voters' minds ...', 'url': 'https://www.businessinsider.com/aoc-abortion-economic-issue-midterms-inflation-2022-11', 'publishedAt': '2022-11-10', 'content': '... in jeopardy a… [+7733 chars]'}

Business Insider
2022-11-10
AOC says it s so out of touch to imply that abortion isn t an economic issue as the top of voters minds in the midterms
AOC says it s so out of touch to imply that abortion isn t an economic issue as the top of voters minds in the midterms
things reproductive rights economic issues closely linked
abortion,2022-11-10,Business Insider,AOC says it s so out of touch to imply that abortion isn t an economic issue as the top of voters minds in the midterms,things reproductive rights economic issues closely linked

{'source': {'id': None, 'name': 'Business Insider'}, 'title': 'The pro-choice movement is jubilant after the midterms turned the anti-abortion tide', 'description': 'Abortion rights advocates were ready ... turned the tide', 'url': 'https://www.businessinsider.com/pro-choice-movement-jubilant-midterms-2022-11', 'publishedAt': '2022-11-13', 'content': '... … [+5823 chars]'}

Business Insider
2022-11-13
The pro choice movement is jubilant after the midterms turned the anti abortion tide
The pro choice movement is jubilant after the midterms turned the anti abortion tide
abortion rights advocates were ready defend choice activists
abortion,2022-11-13,Business Insider,The pro choice movement is jubilant after the midterms turned the anti abortion tide,abortion rights advocates were ready defend choice activists

{'source': {'id': 'bbc-news', 'name': 'BBC News'}, 'author': 'https://www.facebook.com/bbcnews', 'title': 'US midterms: Why a Republican wave never happened', 'description': 'Economic concerns, Biden disapproval - it should have been a Republican wave ...', 'url': 'https://www.bbc.co.uk/news/world-us-canada-63575...', 'publishedAt': '2022-11-09', 'content': '... … [+6609 chars]'}

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US midterms Why a Republican wave never happened
US midterms Why a Republican wave never happened
Economic concerns Biden disapproval rating failed deliver Republican wave
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{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Opinion by Jill Filipovic', 'title': 'Opinion: Heartbreaking Fetterman vs. Oz faceoff', 'description': 'Jill Filipovic writes that Democrat John Fetterman and Republican Mehmet Oz faced off Tuesday evening in the only debate of the ... Pennsylvania Senate race.', 'url': 'https://www.cnn.com/2022/10/26/opinions/fetterman-oz-debate-...', 'publishedAt': '2022-11-09', 'content': 'Jill Filipovic ... … [+3549 chars]'}

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Opinion Heartbreaking Fetterman Oz faceoff
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{'source': {'id': 'time', 'name': 'Time'}, 'author': 'Pattie Reilly', 'title': 'Voters Rejected Montana's Anti-Abortion Referendum. Here's What it Means', 'description': 'Montana voters rejected a measure that would have declared an embryo or fetus a legal person entitled to medical care ... including after a... [+3549 chars]'}

Time
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Voters Rejected Montana s Anti Abortion Referendum Here s What it Means
Voters Rejected Montana s Anti Abortion Referendum Here s What it Means
Montana five states with abortion related ballot measures Tuesday
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{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': 'Matthew Weber', 'title': 'Midterm Polling: It's the economy, stupid - Reuters', 'description': 'Midterm Polling: It's the economy, stupid', 'url': 'https://graphics.reuters.com/USA-ELECTION/ECONOMY-POLL/akvezdbxrpr/', 'urlToImage': 'https://graphics.reuters.com/USA-ELECTION/ECONOMY-POLL/akvezdbxrpr/img/share.png', 'publishedAt': '2022-10-18T15:56:00Z', 'content': 'Midterm Polling\r\nJobs, inflation and partisan politics\r\nThe year 2022 has seen war in Ukraine, a spate of shootings in the United States, a new surge of migrants at the U.S.-Mexico border, and a land… [+2931 chars]'}

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Midterm Polling It s the economy stupid Reuters
Midterm Polling It s the economy stupid Reuters
Midterm Polling economy stupid
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{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'salarshani@businessinsider.com (Sarah Al-Arshani)', 'title': 'Bill Maher says Georgia Senate candidate Herschel Walker is an 'idiot' on 'a scale almost impossible to parody'', 'description': 'Walker has dealt with several scandals since the start of his campaign including allegations of paying for the abortion of a woman he was dating.', 'url': 'https://www.businessinsider.com/bill-maher-says-georgia-senate-candidate-herschel-walker-is-idiot-2022-10', 'urlToImage': 'https://i.insider.com/...?width=1200&format=jpeg', 'publishedAt': '2022-10-15T16:39:31Z', 'content': 'Political commentator Bill Maher took a hit at GOP Senate candidate Herschel Walker calling him an "idiot" on Friday.\xa0\r\nMaher took aim at several false statements made by Walker, who is running for … [+2735 chars]'}

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Bill Maher says Georgia Senate candidate Herschel Walker is an idiot on a scale almost impossible to parody
Bill Maher says Georgia Senate candidate Herschel Walker is an idiot on a scale almost impossible to parody
Walker dealt with several scandals since start campaign including allegations paying abortion woman dating
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{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'bgriffiths@insider.com (Brent D. Griffiths)', 'title': 'Sen. Catherine Cortez Masto faces off against Republican Adam Laxalt in Nevada's closely watched US Senate race', 'description': 'Democratic Sen. Catherine Cortez Masto has sought to portray Republican Adam Laxalt's views on abortion rights as extreme as she seeks to hold onto Nevada seat.', 'url': 'https://www.businessinsider.com/catherine-cortez-masto-adam-laxalt-nevada-senate-election-2022', 'publishedAt': '2022-10-21', 'content': 'Sen. Catherine Cortez Masto is locked in one of the nation's closest-watched Senate races in Nevada against Republican Adam Laxalt, a former state attorney general. … [+2702 chars]'}

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Sen Catherine Cortez Masto faces off against Republican Adam Laxalt in Nevada s closely watched US Senate race
Sen Catherine Cortez Masto faces off against Republican Adam Laxalt in Nevada s closely watched US Senate race
Democratic Catherine Cortez Masto sought portray Republican Adam Laxalt views abortion rights extreme seeks hold onto Nevada seat
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{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'mhall@businessinsider.com (Madison Hall)', 'title': 'Rep. Henry Cuellar, an anti-abortion Democrat, faces off against Republican Cassy Garcia in Texas' 28th House District', 'description': 'Rep. Henry Cuellar, the last Democrat in the House to openly oppose abortion, faces Republican Cassy Garcia in Texas' 28th House District.', 'url': 'https://www.businessinsider.com/henry-cuellar-cassy-garcia-texas-28th-district-house-race-candidates-2022', 'publishedAt': '2022-10-21', 'content': 'Longtime Democratic Rep. Henry Cuellar faces off against Republican Cassy Garcia in Texas' 28th Congressional District.\r\nCuellar is the … [+2335 chars]'}

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Rep Henry Cuellar an anti abortion Democrat faces off against Republican Cassy Garcia in Texas th District election
Rep Henry Cuellar an anti abortion Democrat faces off against Republican Cassy Garcia in Texas th District election
Henry Cuellar last Democrat House openly oppose abortion faces Republican Cassy Garcia Texas House District
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{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hkang@insider.com (Hannah Kang)', 'title': 'Democratic Rep. Susie Lee faces off against Republican April Becker in Nevada's 3rd Congressional District', 'description': 'Rep. Susie Lee has attacked her challenger April Becker for being "pro-life." Becker said she does not support a nationwide abortion ban.', 'url': 'https://www.businessinsider.com/susie-lee-april-becker-nevada-election-3rd-district-house-race-candidates-2022', 'publishedAt': '2022-10-21', 'content': 'Democratic Rep. Susie Lee faces off against Republican April Becker in Nevada's 3rd Congressional District.\r\nLee is the … [+3146 chars]'}

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Democratic Rep Susie Lee faces off against Republican April Becker in Nevada s rd Congressional District election
Democratic Rep Susie Lee faces off against Republican April Becker in Nevada s rd Congressional District election
Susie attacked challenger April Becker being life Becker said does support nationwide abortion
abortion,2022-10-21,Business Insider,Democratic Rep Susie Lee faces off against Republican April Becker in Nevada s rd Congressional District election,Susie attacked challenger April Becker being life Becker said does support nationwide abortion

{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'mloh@businessinsider.com (Matthew Loh)', 'title': 'A man tried to give Herschel Walker a pack of condoms on stage amid the ultra-conservative Senate candidate's abortion scandal', 'description': 'A man tried to give Herschel Walker a pack of condoms at a rally, just weeks after The Daily Beast reported that Walker paid for an abortion after he got her pregnant in 2009.', 'url': 'https://www.businessinsider.com/prankster-herschel-walker-condoms-stage-2022-10', 'publishedAt': '2022-10-21', 'content': 'A man walked up to Herschel Walker onstage in Macon, Georgia, and offered him several packs of condoms.\r\nA video shows Jason Selvig, one half of the comedy duo The… [+2508 chars]'}

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A man tried to give Herschel Walker a pack of condoms on stage amid the ultra conservative Senate candidate s abortion scandal
A man tried to give Herschel Walker a pack of condoms on stage amid the ultra conservative Senate candidate s abortion scandal
stunt comes weeks after woman told Daily Beast that Walker paid have abortion after pregnant
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{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hgetahun@insider.com (Hannah Getahun)', 'title': 'Amendment 2: Kentucky voters could establish that citizens don't have the right to an abortion', 'description': 'Kentuckians will decide if the state constitution should include language that denies the right to an abortion.', 'url': 'https://www.businessinsider.com/amendment-2-kentucky-voters-could-establish-no-right-to-abortion-2022-11', 'publishedAt': '2022-11-03T20:54:23Z', 'content': 'A "yes" on Amendment 2 would add language to the state constitution clarifying that the right to an abortion is not protected … [+1862 chars]'}

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Amendment Kentucky voters could establish that citizens don t have the right to an abortion
Amendment Kentucky voters could establish that citizens don t have the right to an abortion
Kentuckians will decide constitution should include language that denies right abortion
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{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': 'Reuters Fact Check', 'title': 'Fact Check-Fabricated quote attributed to Jill Biden on abortion circulates online - Reuters', 'description': 'Posts claim that first lady Jill Biden said she would rather have an abortion than be pregnant with her husband's child... A spokesperson for the first lady said the claim is false.', 'url': 'https://www.reuters.com/article/factcheck-jillbiden-abortion-idUSL1N31K1MI', 'publishedAt': '2022-10-31T16:55:00Z', 'content': 'Posts claim that first lady Jill Biden said ... A spokesperson … [+1340 chars]'}

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Fact Check Fabricated Jill Biden quote on abortion circulates online Reuters
Fact Check Fabricated Jill Biden quote on abortion circulates online Reuters
Fabricated quote attributed first lady Jill Biden circulating online that said would have abortion spokesperson first lady said
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{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Eli Lilly says some staff want to leave Indiana because of abortion ban: FT - Reuters', 'description': 'Eli Lilly & Co employees have requested transfers from the drugmaker's Indiana headquarters after the state adopted a near-total abortion ban, the Financial Times reported.', 'url': 'https://www.reuters.com/business/healthcare-pharmaceuticals/eli-lilly-says-some-staff-want-leave-indiana-because-abortion-ban-ft-2022-11-06/', 'publishedAt': '2022-11-06', 'content': 'Nov 6 (Reuters) - Some Eli Lilly and Co (LLY.N) employees have requested transfers from the drugmaker's Indiana headquarters ... would ban most abortion… [+1311 chars]'}

Reuters
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Eli Lilly says some staff want to leave Indiana because of abortion ban FT Reuters
Eli Lilly says some staff want to leave Indiana because of abortion ban FT Reuters
Some Lilly employees have requested transfers from drugmaker Indiana headquarters after state adopted near total abortion
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{'source': {'id': None, 'name': 'The Guardian'}, 'author': 'Associated Press', 'title': ''Sulking and moping is not an option': Obama campaigns with Biden ahead of US midterms', 'description': 'Democrats roll out political heavyweights to deliver closing arguments warning that democracy itself is at risk', 'url': 'https://www.theguardian.com/us-news/2022/nov/06/obama-biden-campaign-us-midterms', 'publishedAt': '2022-11-06', 'content': 'The Democratic party's two most popular figures, Barack Obama and Joe Biden, ... over the final weekend of the… [+4846 chars]'}

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Sulking and moping is not an option Obama campaigns with Biden ahead of US midterms
Sulking and moping is not an option Obama campaigns with Biden ahead of US midterms
Democrats roll political heavyweights deliver closing arguments warning that democracy itself risk
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{'source': {'id': None, 'name': 'NPR'}, 'author': 'Ximena Bustillo', 'title': 'Biden says he will push to codify Roe if Democrats keep the House and Senate', 'description': 'The president is calling on Democrats - especially young voters - to hold onto power in Congress.', 'url': 'https://www.npr.org/2022/10/18/1129633950/biden-abortion-codify-roe-v-wade-midterms', 'publishedAt': '2022-10-18', 'content': 'President Joe Biden speaks about abortion access during a Democratic National Committee event at the Howard Theatre in Washington, D.C., on Oct. 18.\r\nEvan Vucci/AP\r\nPresident Joe Biden vowed t… [+3135 chars]'}

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Biden says he will push to codify Roe if Democrats keep the House and Senate
Biden says he will push to codify Roe if Democrats keep the House and Senate
president calling Democrats especially young voters hold onto power Congress
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{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hgetahun@insider.com (Hannah Getahun)', 'title': 'Amendment 2: Kentucky voters could establish that citizens don't have the right to an abortion', 'description': 'Kentuckians will decide if the state constitution should include language that denies the right to an abortion.', 'url': 'https://www.businessinsider.com/amendment-2-kentucky-voters-could-establish-no-right-to-abortion-2022-11', 'publishedAt': '2022-11-08', 'content': 'A "yes" on Amendment 2 would add language to the state constitution clarifying that the right to an abortion is not protected … [+1862 chars]'}

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Amendment Kentucky voters could establish that citizens don t have the right to an abortion
Amendment Kentucky voters could establish that citizens don t have the right to an abortion
Kentuckians will decide constitution should include language that denies right abortion
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{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': None, 'title': 'Opinion roundup: A really bad night for some high profile Trump-backed candidates', 'description': 'While Ron DeSantis won big, some high profile GOP candidates backed by Donald Trump struggled in a midterm election that had been expected to yield a decisive victory for Republicans.', 'url': 'https://www.cnn.com/2022/11/09/opinions/outcome-us-2022-midterm-election-roundup/index.html', 'publishedAt': '2022-11-09T13:32:58Z', 'content': 'CNN Opinion asked contributors for their views on the 2022 midterm elections... [+10171 chars]'}

CNN
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Opinion roundup A really bad night for some high profile Trump backed candidates
Opinion roundup A really bad night for some high profile Trump backed candidates
While DeSantis some high profile candidates backed Donald Trump struggled midterm election that been expected yield decisive victory Republicans
abortion,2022-11-09,CNN,Opinion roundup A really bad night for some high profile Trump backed candidates,While DeSantis some high profile candidates backed Donald Trump struggled midterm election that been expected yield decisive victory Republicans

{'source': {'id': None, 'name': 'NPR'}, 'author': 'Becky Sullivan', 'title': 'The Pentagon will pay for service members to travel for abortions', 'description': 'The new policy and others come from a new memo from Secretary of Defense Lloyd Austin aimed at addressing concerns among service members about abortion access after the overturning of Roe v. Wade.', 'url': 'https://www.npr.org/2022/10/20/1130313691/pentagon-abortion-travel', 'publishedAt': '2022-10-20', 'content': 'Military members ... banned, including Fort Hood in Texas … [+2647 chars]'}

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The Pentagon will pay for service members to travel for abortions
The Pentagon will pay for service members to travel for abortions
policy others come from memo from Secretary Defense Lloyd Austin aimed addressing concerns among service members about abortion access after overturning Wade
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{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hgetahun@insider.com (Hannah Getahun)', 'title': 'Proposal 3: Michigan voters will decide on a constitutional right to abortion', 'description': 'Michiganders will decide if the constitution should include language that protects the right to make healthcare decisions about pregnancy.', 'url': 'https://www.businessinsider.com/michigan-proposal-3-constitutional-right-to-abortion-2022-11', 'publishedAt': '2022-11-08', 'content': 'A "yes" on Proposal 3 would amend the Michigan state constitution to add an individual right to reproductive freedom… [+1975 chars]'}

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Proposal Michigan voters will decide on a constitutional right to abortion
Proposal Michigan voters will decide on a constitutional right to abortion
Michiganders will decide constitution should include language that protects right make healthcare decisions about pregnancy
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{'source': {'id': None, 'name': 'Boing Boing'}, 'author': 'Carla Sinclair', 'title': 'MAGA man's logic malfunctions when asked "if abortion is murder"', 'description': 'When it comes to MAGA folk, trying to have a logical conversation with them will get you nowhere. But that doesn't stop Jason Selvig of the Good Liars from trying.', 'url': 'https://boingboing.net/2022/11/03/maga-mans-logic-malfunctions-when-asked-if-abortion-is-murder.html', 'publishedAt': '2022-11-03T18:10:17Z', 'content': 'When it comes to MAGA folk, trying to have a logical conversation with them will get you nowhere. But that doesn't stop Jason Selvig of the Good Liars from trying. \r\nLike when he repeatedly asked a M… [+386 chars]'}

Boing Boing

2022-11-03
MAGA man s logic malfunctions when asked if abortion is murder
MAGA man s logic malfunctions when asked if abortion is murder
Liars from trying Like when repeatedly asked MAGA be malfunctions when asked if abortion is murder,When comes MAGA folk trying have logical conversation with them will realize MAGA bele abortion,2022-11-03,Boing Boing,MAGA man s logic malfunctions when asked if abortion is murder,When comes MAGA folk trying have logical conversation with them will realize them who repeatedly asked MAGA below said abortion

{'source': {'id': None, 'name': 'NPR'}, 'author': 'Selena Simmons-Duffin', 'title': "At 18 weeks pregnant, she lost her baby. ...", 'description': "About halfway into her pregnancy, Karla found out her fetus had a severe genetic anomaly. As ... North Carolina's 20-week abortion limit.", 'url': 'https://www.npr.org/sections/health-shots/2022/10/27/1...', 'urlToImage': 'https://media.npr.org/assets/img/2022/10/27/karla...', 'publishedAt': '2022-10-27T16:38:35Z', 'content': 'Karla Renée was 18 weeks into her pregnancy when she and her husband Sam learned that the fetus had a severe genetic anomaly that could lead to severe physical and mental disabilities. They were fac… [+16008 chars]'}

NPR
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At weeks pregnant she faced an immense decision with just days to make it
At weeks pregnant she faced an immense decision with just days to make it
About halfway into pregnancy Karla found fetus severe genetic anomaly that could lead to severe physical and mental disabilities
North Carolina week abortion limit
abortion,2022-10-27,NPR,At weeks pregnant she faced an immense decision with just days to make it,About halfway into pregnancy Karla found fetus severe genetic anomaly grappled with uncertain prognosis against North Carolina week abortion limit

{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hgetahun@insider.com (Hannah Getahun)', 'title': 'Proposal 3: Michigan voters will decide on a constitutional right to abortion', 'description': "Michiganders will now decide if the constitution should protect their right to make healthcare decisions about pregnancy.", 'url': 'https://www.businessinsider.com/michigan-proposal-3-constitutional-right-to-reproductive-care-2022', 'urlToImage': 'https://i.insider.com/6363f2e8c4d846bf6cb69a31?width=1200&format=jpeg', 'publishedAt': '2022-11-03T20:54:36Z', 'content': "A \"yes\" on Michigan's Proposal 3 would amend the state's constitution to add an individual right to reproductive freedom, including abortion.\r\nBallot measure details\r\nProposal 3, also known as th… [+1975 chars]"}

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Proposal Michigan voters will decide on a constitutional right to abortion
Proposal Michigan voters will decide on a constitutional right to abortion
Michiganders will now decide if constitution should protect their right make healthcare decisions about pregnancy
abortion,2022-11-03,Business Insider,Proposal Michigan voters will decide on a constitutional right to abortion,Michiganders will decide constitution should language protect right make healthcare decisions about pregnancy

{'source': {'id': None, 'name': 'The Guardian'}, 'author': 'Presented by Michael Safi with Oliver Laughland; produced by Jo Glanville, Lucy Hough and Axel Kacoutié; executive producer Homa Khaleeli', 'title': 'Culture wars and abortion and conspiracy theories: what the midterms tell us about the US – podcast', 'description': 'Florida used to be seen as a swing state but in recent years it has turned further and further to the right. How come? Ahead of the US midterm elections, Oliver Laughland travelled around Florida to find out what c…', 'url': 'https://www.theguardian.com/news/audio/2022/nov/03/culture-wars-and-abortion-and-conspiracy-theories-what-the-midterms-tell-us-about-the-us-podcast', 'urlToImage': 'https://i.guim.co.uk/img/media/...?width=1200&height=630&quality=85&auto=format&fit=crop&overlay-align=bottom%2Cleft&overlay-width=100p&overlay-base64=...', 'publishedAt': '2022-11-03T03:00:33Z', 'content': 'Ahead of the US midterm elections at really mattered to the people getting ready to vote. ... Michael Safi how he travelled to Disney World… [+705 chars]'}

The Guardian
2022-11-01
Culture wars abortion and conspiracy theories what the midterms tell us about the US podcast
Culture wars abortion and conspiracy theories what the midterms tell us about the US podcast
Florida used seen swing state recent years turned further and further right How come Ahead midterm elections Oliver Laughland travelled around Florida find what
abortion,2022-11-01,The Guardian,Culture wars abortion and conspiracy theories what the midterms tell us about the US podcast,Florida used seen swing state recent years turned further right midterms elections Oliver Laughland travelled around Florida find what

{'source': {'id': None, 'name': 'The Guardian'}, 'author': 'Rebecca Solnit', 'title': 'Abortion is a bread-and-butter economic issue. We need to treat it that way', 'description': 'Parenthood, criminality or death: these are now the all-too-expensive options for many women in the US. Being a criminal is also expensive, whether you lose economic opportunities to avoid apprehension or spe…', 'url': 'https://www.theguardian.com/world/2022/nov/03/abortion-women-inequality-dobbs-supreme-court', 'urlToImage': 'https://i.guim.co.uk/img/media/...', 'publishedAt': '2022-11-03T10:31:25Z', 'content': 'Being a parent is expensive. Being a criminal is also expensive, whether you lose economic opportunities to avoid apprehension or spend money on your defense if apprehended or go to prison and lose e… [+7773 chars]'}

The Guardian
2022-11-03
Abortion is a bread and butter economic issue We need to treat it that way
Abortion is a bread and butter economic issue We need to treat it that way
Parenthood criminality death these expensive options many women
Being criminal also expensive whether lose economic opportunities avoid apprehension
abortion,2022-11-03,The Guardian,Abortion is a bread and butter economic issue We need to treat it that way,Parenthood criminality death these expensive options many women Being criminal also expensive whether lose economic opportunities avoid apprehension spend

{'source': {'id': None, 'name': 'The Guardian'}, 'author': 'Joan E Greve in Washington', 'title': 'Democrats on the defensive as economy becomes primary concern over abortion', 'description': 'Polls indicate tide shifting toward Republicans with high inflation rates and gas prices working in their favorWith less than two weeks to go until the midterm elections, Democrats' hopes of defying political history and keeping their narrow majorities in the House and Sen…', 'url': 'https://www.theguardian.com/us-news/2022/oct/28/democrats-defensive-republicans-economy-abortion-midterms', 'urlToImage': 'https://i.guim.co.uk/img/media/073f8dd54feedb0c342bee51765044...', 'publishedAt': '2022-10-28T09:00:23Z', 'content': 'With less than two weeks to go until election day, Democrats' hopes of defying political history and keeping their narrow majorities in the House and Senate appear to be fading, as many of the partys … [+4861 chars]'}

The Guardian
2022-10-28
Democrats on the defensive as economy becomes primary concern over abortion
Democrats on the defensive as economy becomes primary concern over abortion
Polls indicate tide shifting toward Republicans with high inflation rates gas prices working their favorWith less than two weeks until midterm elections Democrats hopes defying political history keeping their narrow majorities House
abortion,2022-10-28,The Guardian,Democrats on the defensive as economy becomes primary concern over abortion,Polls indicate tide shifting toward Republicans with high inflation rates prices working their favorWith less than two weeks until elections Democrats hopes defying political history keeping their narrow majorities House Senate

{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hgetahun@insider.com (Hannah Getahun)', 'title': 'Proposition 1: Californians will vote to make abortion a constitutional right', 'description': "A yes on California's Proposition 1 will amend the state's constitution to say that the state cannot take away a person's right to abortion or contraception and will not interfere with reproductive freedom.", 'url': 'https://www.businessinsider.com/california-proposition-1-right-to-abortion-constitutional-right-2022-11', 'urlToImage': 'https://i.insider.com/6363f16fff27460018ed714d?width=1200&format=jpeg', 'publishedAt': '2022-11-08T00:04:14Z', 'content': 'A "yes" on California\'s Proposition 1 will amend the state\'s constitution to say that the state cannot take away a person\'s right to abortion or contracep… [+1705 chars]'}

Business Insider
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Proposition Californians will vote to make abortion a constitutional right
Proposition Californians will vote to make abortion a constitutional right
California Proposition will amend state constitution say that state cannot take away person right abortion contraception will interfere with reproductive freedom
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{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hgetahun@insider.com (Hannah Getahun)', 'title': 'Proposition 1: Californians will vote to make abortion a constitutional right', 'description': "A yes on California's Proposition 1 will amend the state's constitution to say that the state cannot take away a person's right to abortion or contraception and will not interfere with reproductive freedom.", 'url': 'https://www.businessinsider.com/california-proposition-1-right-to-abortion-constitutional-right-2022', 'urlToImage': 'https://i.insider.com/6363f16fff27460018ed714d?width=1200&format=jpeg', 'publishedAt': '2022-11-03T20:51:29Z', 'content': 'A "yes" on California\'s Proposition 1 will amend the state\'s constitution to say that the state cannot take away a person\'s right to abortion or contraception and will not interfere with reproductive… [+1705 chars]'}

Business Insider
2022-11-03
Proposition Californians will vote to make abortion a constitutional right
Proposition Californians will vote to make abortion a constitutional right
California Proposition will amend state constitution say that state cannot take away person right abortion contraception will interfere with reproductive freedom
abortion,2022-11-03,Business Insider,Proposition Californians will vote to make abortion a constitutional right,California Proposition will amend state constitution state cannot take away person right abortion contraception will interfere with reproductive freedom

{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Abortion foes largely lose $2.4 mln appeal over Planned Parenthood videos - Reuters', 'description': 'Anti-abortion group Center for Medical Progress and its founder David Daleiden and others on Friday largely lost their challenge to a $2.4 million judgment awarded to Planned Parenthood after a jury found they broke the law by secretly recording Planned Parenthood employ…', 'url': 'https://www.reuters.com/legal/litigation/abortion-foes-largely-lose-24-mln-appeal-over-planned-parenthood-videos-2022-10-21/', 'urlToImage': 'https://www.reuters.com/resizer/...', 'publishedAt': '2022-10-21T21:20:02Z', 'content': '(Reuters) - Anti-abortion group Center for Medical Progress, its founder David Daleiden and others on Friday lost most of … [+3241 chars]'}

Reuters
2022-10-21
Abortion foes largely lose mln appeal over Planned Parenthood videos Reuters
Abortion foes largely lose mln appeal over Planned Parenthood videos Reuters
Anti abortion group Center Medical Progress founder David Daleiden others Friday largely lost their challenge million judgment awarded Planned Parenthood after jury found they broke secretly recording Planned Parenthood employ
abortion,2022-10-21,Reuters,Abortion foes largely lose mln appeal over Planned Parenthood videos Reuters,Anti abortion group Center Medical Progress founder David Daleiden others Friday largely lost their challenge million judgment awarded Planned Parenthood after jury found they broke secretly recording Planned Parenthood employ

{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Far-right Independence Day march draws thousands in Warsaw - Reuters', 'description': 'Thousands of people gathered in Warsaw on Friday for an annual march organised by the far-right to mark Independence Day, with a handful carrying white supremacist or anti-abortion banners and firing flares into the air.', 'url': 'https://www.reuters.com/world/europe/far-right-independence-day-march-draws-thousands-warsaw-2022-11-11/', 'urlToImage': 'https://www.reuters.com/resizer/...', 'publishedAt': '2022-11-11T16:28:00Z', 'content': 'WARSAW, Nov 11 (Reuters) - Thousands of people gathered in Warsaw on Friday for an annual march organised by the far-right to mark Independence Day, with a handful carrying white supremacist or anti… [+1268 chars]'}

Reuters
2022-11-11
Far right Independence Day march draws thousands in Warsaw Reuters
Far right Independence Day march draws thousands in Warsaw Reuters
Thousands people gathered Warsaw Friday annual march organised right mark Independence with handful carrying white supremacist anti abortion banners firing flares
abortion,2022-11-11,Reuters,Far right Independence Day march draws thousands in Warsaw Reuters,Thousands people gathered Warsaw Friday annual march organised right mark Independence with handful carrying white supremacist anti abortion banners firing flares

{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hgetahun@insider.com (Hannah Getahun)', 'title': 'Proposal 5: Vermont will vote to protect reproductive autonomy', 'description': "Vermont citizens will decide if the state's constitution should add language that protects the right to reproductive autonomy.", 'url': 'https://www.businessinsider.com/vermont-proposal-5-abortion-pro-choice-2022', 'urlToImage': 'https://i.insider.com/6363f22fff27460018ed71a8?width=1200&format=jpeg', 'publishedAt': '2022-11-03T20:54:52Z', 'content': "A \"yes\" on Vermont's Proposal 5, also known as Article 22, will amend the state's constitution to include a right to personal reproductive freedom, including abortion.\r\nBallot measure details\r\nPropos… [+1529 chars]"}

Business Insider
2022-11-03
Proposal Vermont will vote to protect reproductive autonomy
Proposal Vermont will vote to protect reproductive autonomy
Vermont citizens will decide state constitution should add language that protects right reproductive autonomy
abortion,2022-11-03,Business Insider,Proposal Vermont will vote to protect reproductive autonomy,Vermont citizens will decide state constitution should add language that protects right reproductive autonomy

{'source': {'id': 'business-insider', 'name': 'Business Insider'}, 'author': 'hgetahun@insider.com (Hannah Getahun)', 'title': 'Proposal 5: Vermont will vote to protect reproductive autonomy', 'description': "Vermont citizens will decide if the state's constitution should add language that protects the right to reproductive autonomy.", 'url': 'https://www.businessinsider.com/vermont-proposal-5-abortion-pro-choice-2022-11', 'urlToImage': 'https://i.insider.com/6363f22fff27460018ed71a8?width=1200&format=jpeg', 'publishedAt': '2022-11-08T00:02:05Z', 'content': "A \"yes\" on Vermont's Proposal 5, also known as Article 22, will amend the state's constitution to include a right to personal reproductive freedom, including abortion.\r\nBallot measure details\r\nPropos… [+1529 chars]"}

Business Insider
2022-11-08
Proposal Vermont will vote to protect reproductive autonomy
Proposal Vermont will vote to protect reproductive autonomy
Vermont citizens will decide state constitution should add language that protects right reproductive autonomy
abortion,2022-11-08,Business Insider,Proposal Vermont will vote to protect reproductive autonomy,Vermont citizens will decide state constitution should add language that protects right reproductive autonomy

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Gregory Krieg', 'title': 'Democrats won the Senate after flipping Georgia last year. The state could be pivotal once again', 'description': 'The fight for control of the US Senate could come down to Georgia -- again.', 'url': 'https://www.cnn.com/2022/11/03/politics/georgia-senate-race-what-matters/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221103094104-herschel-walker-and-raphael-warnock.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-11-03T11:02:49Z', 'content': 'The fight for control of the US Senate could come down to Georgia -- again.\r\nFor the second time in less than two years, the Peach State, which elected two Democratic senators in the last election cycl… [+4168 chars]'}

CNN
2022-11-03
Democrats won the Senate after flipping Georgia last year The state could be pivotal once again
Democrats won the Senate after flipping Georgia last year The state could be pivotal once again
fight control Senate could come down Georgia again
abortion,2022-11-03,CNN,Democrats won the Senate after flipping Georgia last year The state could be pivotal once again,fight control Senate could come down Georgia again

{'source': {'id': None, 'name': 'NPR'}, 'author': 'Rick Pluta, Michigan Public Radio Network', 'title': 'Democratic Gov. Gretchen Whitmer wins reelection in Michigan', 'description': 'Democratic Gov. Gretchen Whitmer wins race for governor over Republican Tudor Dixon.', 'url': 'https://www.npr.org/2022/11/09/1134000340/michigan-election-results-whitmer-dixon', 'urlToImage': 'https://media.npr.org/assets/img/2022/11/09/ap22313...', 'publishedAt': '2022-11-09T05:...', 'content': 'Michigan Gov. Gretchen Whitmer speaks during a campaign rally at Michigan State University on Nov. 7, in East Lansing, Mich.\r\n\r\nBill Pugliano/Getty Images\r\nDETROIT Michigan Gov. Gretchen Whitmer… [+739 chars]'}

NPR
2022-11-09
Democratic Gov Gretchen Whitmer wins reelection in Michigan
Democratic Gov Gretchen Whitmer wins reelection in Michigan
Democratic Gretchen Whitmer wins race governor over Republican Tudor Dixon
abortion,2022-11-09,NPR,Democratic Gov Gretchen Whitmer wins reelection in Michigan,Democratic Gretchen Whitmer wins race governor over Republican Tudor Dixon

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pearing to show election workers moving ballots after poll deadline on Election Day in Detroit are not proof of fraud' Reuters', 'description': 'Social media users are falsely claiming that images of individuals transporting ballots after 8 pm on Election Day prove that there was election fraud in Detroit.', 'url': 'https://www.reuters.com/article/factcheck-detroit-late-ballots-idUSL1N32T02Z', 'urlToImage': 'https://s1.reutersmedia.net/resources_r2/images/default.png?w=800', 'publishedAt': '2022-11-10T21:52:57Z', 'content': 'Social media users are falsely claiming that images of individuals transporting ballots to an election site in Detroit after 8 pm on Election Day prove that there was election fraud in Detroit.\r\nOne … [+4272 chars]'}

Reuters
2022-11-11
Fact Check Images appearing to show election workers moving ballots after poll deadline on Election Day in Detroit are not proof of fraud Reuters
Fact Check Images appearing to show election workers moving ballots after poll deadline on Election Day in Detroit are not proof of fraud Reuters
Social media users falsely claiming that images individuals transporting ballots election site Detroit after 8 pm on Election Day prove that there election fraud Detroit
election,2022-11-11,Reuters,Fact Check Images appearing to show election workers moving ballots after poll deadline on Election Day in Detroit are not proof of fraud Reuters,Social media users falsely claiming that images individuals transporting ballots election site Detroit after 8 pm on Election Day prove that there election fraud Detroit

{'source': {'id': None, 'name': 'Ctvnews.ca'}, 'author': None, 'title': 'Cynthia Lai, Toronto councillor, dies | CTV News - CTV News Toronto', 'description': ' Cynthia Lai, Toronto councillor, dies CTV News\u00a0CTV News Scarborough city councillor dies days before election\u00a0CBC.ca ', 'url': 'https://toronto.ctvnews.ca/toronto-city-councillor-cynthia-lai-dies-days-before-election-1.6110993', 'urlToImage': 'https://www.ctvnews.ca/content/dam/ctvnews/en/images/2022/10/21/cynthia-lai-1-6120025-1666390642540.jpg', 'publishedAt': '2022-10-21T21:55:00Z', 'content': 'Toronto city councillor Cynthia Lai has died.\r\nHer campaign manager, Hratch Aynedjian, confirmed the death of the Ward 23 Scarborough North councillor on Friday afternoon.\r\nLai died in hospital and w… [+3402 chars]'}

Ctvnews.ca
2022-10-21
Cynthia Lai Toronto councillor dies CTV News CTV News Toronto
Cynthia Lai Toronto councillor dies CTV News CTV News Toronto
Cynthia Lai Toronto councillor dies News News Toronto Scarborough city councillor dies days before municipal election Toronto
election,2022-10-21,Ctvnews.ca,Cynthia Lai Toronto councillor dies CTV News CTV News Toronto,Cynthia Lai Toronto councillor dies News News Toronto Scarborough city councillor dies days before municipal election Toronto

{'source': {'id': 'the-guardian', 'name': 'The Guardian'}, 'author': 'Andrew Downie in São Paulo', 'title': 'YouTube and Facebook letting Brazil election disinformation spread, NGO says', 'description': 'Global Witness produced – and submitted – purposely misleading ads that were all approved by YouTube, and half by FacebookYouTube and Facebook are allowing disinformation about Brazil's election campaign to spread', 'url': 'https://www.theguardian.com/world/2022/oct/20/brazil-election-disinformation-youtube-facebook', 'urlToImage': 'https://i.guim.co.uk/img/media/...?width=1200&height=630&quality=85&auto=format&fit=crop&overlay-align=bottom%2Cleft&overlay-width=100p&overlay-base64=L2ltZy9zdGF0aWMvb3ZlcmxheXMvdGctZGVmYXVsdC5wbmc&enable=upscale&s=...', 'publishedAt': '2022-10-20T09:30:50Z', 'content': 'YouTube and Facebook are allowing disinformation to be spread about Brazil's election campaign, adding to concerns about the integrity of the vote, according to an independent report in an already polarised and violent electoral … [+4111 chars]'}

The Guardian
2022-10-20
YouTube and Facebook letting Brazil election disinformation spread NGO says
YouTube and Facebook letting Brazil election disinformation spread NGO says
Global Witness produced submitted purposely misleading that were approved YouTube half FacebookYouTube Facebook allowing disinformation about Brazil election campaign spread
election,2022-10-20,The Guardian,YouTube and Facebook letting Brazil election disinformation spread NGO says,Global Witness produced submitted purposely misleading that were approved YouTube half FacebookYouTube Facebook allowing disinformation about Brazil election campaign spread

{'source': {'id': None, 'name': 'The Guardian'}, 'author': 'Heather Stewart', 'title': 'Keir Starmer renews call for immediate general election', 'description': 'Labour leader says Tories lack 'basic patriotic duty to keep Britain from further turmoil' follow it live
Keir Starmer has renewed his call for an immediate general election, accusi…', 'url': 'https://www.theguardian.com/politics/2022/oct/20/keir-starmer-renews-call-for-immediate-general-election', 'urlToImage': 'https://i.guim.co.uk/img/media/...?width=1200&height=630&quality=85&auto=format&fit=crop&overlay-align=bottom%2Cleft&overlay-width=100p&overlay-base64=...&enable=upscale&s=...', 'publishedAt': '2022-10-20T09:23:04Z', 'content': 'Keir Starmer has renewed his call for an immediate general election, accusing Liz Truss's government of being too mired in pathetic squabbles to govern the UK.\r\nThe Labour leader said the Conservativ… [+2425 chars]'}

The Guardian
2022-10-20
Keir Starmer renews call for immediate general election
Keir Starmer renews call for immediate general election
Labour leader says Tories lack basic patriotic duty keep Britain from further turmoil follow live Keir Starmer renewed call immediate general election accusi
election,2022-10-20,The Guardian,Keir Starmer renews call for immediate general election,Labour leader says Tories lack basic patriotic duty keep Britain from further turmoil follow live Keir Starmer renewed call immediate general election accusi

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Stephen Collinson', 'title': 'Analysis: Takeaways from a grim weekend for Republicans as they learn they won't win the Senate', 'description': 'It was a disappointing weekend for Republicans in the election that won't end.', 'url': 'https://www.cnn.com/2022/11/14/politics/takeaways-grim-weekend-republicans/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221113202340-01-senate-mccarthy-...jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-11-14T05:15:51Z', 'content': 'It was a disappointing weekend for Republicans in the election that won't end.\r\nDemocrats kept the Senate for two more years after holding off a Republican comeback six days after the election. Democrats … [+10830 chars]'}

CNN
2022-11-14
Analysis Takeaways from a grim weekend for Republicans as they learn they won t win the Senate
Analysis Takeaways from a grim weekend for Republicans as they learn they won t win the Senate
disappointing weekend Republicans election that won t end
election,2022-11-14,CNN,Analysis Takeaways from a grim weekend for Republicans as they learn they won t win the Senate,disappointing weekend Republicans election that won t end

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Hadas Gold', 'title': 'Israel Prime Minister Yair Lapid congratulates Benjamin Netanyahu on election victory', 'description': 'Israeli Prime Minister Yair Lapid has congratulated Benjamin Netanyahu, the winner of Israel's elections, the prime minister's office announced Thursday.', 'url': 'https://www.cnn.com/2022/11/03/middleeast/israel-election-results-netanyahu-intl/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221103154801-02-israel-election-benjamin-netanyahu-110222.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-11-03T15:55:34Z', 'content': 'Israeli Prime Minister Yair Lapid has congratulated Benjamin Netanyahu, the winner of Israel's elections, the prime minister's office announced Thursday, just under 48 hours after polls closed.\r\nW… [+503 chars]'}

CNN
2022-11-03
Israel Prime Minister Yair Lapid congratulates Benjamin Netanyahu on election victory
Israel Prime Minister Yair Lapid congratulates Benjamin Netanyahu on election victory
Israeli Prime Minister Yair Lapid congratulated Benjamin Netanyahu winner Israel elections prime minister office announced Thursday just under hours after polls closed
election,2022-11-03,CNN,Israel Prime Minister Yair Lapid congratulates Benjamin Netanyahu on election victory,Israeli Prime Minister Yair Lapid congratulated Benjamin Netanyahu winner Israel elections prime minister office announced Thursday just under hours after polls closed

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Donie O'Sullivan', 'title': 'Analysis: A glitch in Maricopa County is gift to election deniers', 'description': 'Much can grow naturally in the barren desert landscape of Arizona's Maricopa County, but given its pivotal role in shaping national politics, it's fertile ground for conspiracy theories to take root.', 'url': 'https://www.cnn.com/2022/11/09/politics/election-deniers-maricopa-county-arizona-midterms/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221109144434-maricopa-ballot-tabulation-1109.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-11-10T00:05:17Z', 'content': 'Much can grow naturally in the barren desert landscape of Arizonas Maricopa County, but given its pivotal role in shaping national politics, its fertile ground for conspiracy theories to take roo… [+5019 chars]'}

CNN
2022-11-10
Analysis A glitch in Maricopa County is a gift to election deniers
Analysis A glitch in Maricopa County is a gift to election deniers
Much grow naturally barren desert landscape Arizona Maricopa County given pivotal role shaping national politics fertile ground conspiracy theories take root
election,2022-11-10,CNN,Analysis A glitch in Maricopa County is a gift to election deniers,Much grow naturally barren desert landscape Arizona Maricopa County given pivotal role shaping national politics fertile ground conspiracy theories take root

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Gregory Krieg', 'title': 'Three takeaways from the second Georgia gubernatorial debate', 'description': 'Georgia Gov. Brian Kemp and Democratic nominee Stacey Abrams faced off in their second and final gubernatorial debate on Sunday night, with a little more than a week to go before voting ends.', 'url': 'https://www.cnn.com/2022/10/31/politics/georgia-debate-takeaways/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221030221016-georgia-debate-103022.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-10-31T01:04:19Z', 'content': 'Georgia Gov. Brian Kemp and Democratic nominee Stacey Abrams faced off in their second and final gubernatorial debate on Sunday night, with a little more than a week to go before voting ends.\r\n… [+9103 chars]'}

CNN
2022-10-31
Three takeaways from the second Georgia gubernatorial debate
Three takeaways from the second Georgia gubernatorial debate
Georgia Republican Brian Kemp Democratic nominee Stacey Abrams faced their second final gubernatorial debate Sunday night with little more than week before voting ends
election,2022-10-31,CNN,Three takeaways from the second Georgia gubernatorial debate,Georgia Republican Brian Kemp Democratic nominee Stacey Abrams faced their second final gubernatorial debate Sunday night with little more than week before voting ends

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Shawna Mizelle, Jeff Zeleny', 'title': 'Cheney endorses Virginia Democratic Rep. Abigail Spanberger', 'description': 'Wyoming Republican Rep. Liz Cheney endorsed Virginia Democratic Rep. Abigail Spanberger on Saturday, weighing in on another highly competitive House race in the final days of the midterm election campaign.', 'url': 'https://www.cnn.com/2022/11/05/politics/liz-cheney-endorses-abigail-spanberger/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/211021070535-cheney-spanberger-split.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-11-05T15:30:50Z', 'content': 'Wyoming Republican Rep. Liz Cheney endorsed Virginia Democratic Rep. Abigail Spanberger on Saturday, weighing in on another highly competitive House race in the final days of the midterm election cam… [+1920 chars]'}

CNN
2022-11-05
Cheney endorses Virginia Democratic Rep Abigail Spanberger
Cheney endorses Virginia Democratic Rep Abigail Spanberger
Wyoming Republican Cheney endorsed Virginia Democratic Abigail Spanberger Saturday weighing another highly competitive House race final days midterm election campaign
election,2022-11-05,CNN,Cheney endorses Virginia Democratic Rep Abigail Spanberger,Wyoming Republican Cheney endorsed Virginia Democratic Abigail Spanberger Saturday weighing another highly competitive House race final days midterm election campaign

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Jennifer Gray', 'title': 'Budding hurricane, snow and record heat could impact voters tomorrow', 'description': 'This Election Day, all types of weather including rain, snow, heat and even tropical storm impacts are possible -- depending on what region of the country you live in.', 'url': 'https://www.cnn.com/2022/11/07/weather/election-day-weather-forecast-wxn/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221107090337-weather-election-day-card.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-11-07T16:27:56Z', 'content': 'Editors Note: A version of this article originally appeared in the weekly weather newsletter, the CNN Weather Brief, which is released every Monday. You can sign up here to receive them every week an… [+5896 chars]'}

CNN
2022-11-07
Budding hurricane snow and record heat could impact voters tomorrow
Budding hurricane snow and record heat could impact voters tomorrow
This Election types weather including rain snow heat even tropical storm impacts possible depending what region country live
election,2022-11-07,CNN,Budding hurricane snow and record heat could impact voters tomorrow,This Election types weather including rain snow heat even tropical storm impacts possible depending what region country live

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': None, 'title': 'Opinion roundup: A really bad night for some high-profile Trump-backed candidates', 'description': 'Nearly two years after Republicans lost the White House and then the Senate majority, in an election that had been marked by Donald Trump struggled in a midterm election that had been expected to yield a decisive victory for Republicans.', 'url': 'https://www.cnn.com/2022/11/09/opinions/opinion-roundup-midterm-elections/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221109015610-59-us-midterms-1109-pennsylvania-fetterman.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-11-09T21:56:16Z', 'content': 'Editor's Note: CNN Opinion contributors share their thoughts on some of the 2022 midterm elections. The views expressed in this commentary are their own.\r\nFrida Ghitis: Ron DeSantis … [+10171 chars]'}

CNN
2022-11-09
Opinion roundup A really bad night for some high profile Trump backed candidates
Opinion roundup A really bad night for some high profile Trump backed candidates
While DeSantis some high profile candidates backed Donald Trump struggled midterm election that been expected yield decisive victory Republicans
election,2022-11-09,CNN,Opinion roundup A really bad night for some high profile Trump backed candidates,While DeSantis some high profile candidates backed Donald Trump struggled midterm election that been expected yield decisive victory Republicans

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Frida Ghitis', 'title': 'Opinion: A disastrous day for Donald Trump', 'description': 'The results of the 2022 midterm elections are not fully tallied and the crucial question -- who will control Congress? -- has not been answered. But we can draw some initial conclusions, writes Frida Ghitis.', 'url': 'https://www.cnn.com/2022/11/09/opinions/trump-midterm-elections-results-ghitis/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221109044540-donald-trump-file-1108-restricted.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-11-09T21:15:41Z', 'content': 'Editor's Note: Frida Ghitis, (@fridaghitis) a former CNN producer and correspondent, is a world affairs columnist. She is a weekly opinion contributor to CNN, a contributing columnist … [+6332 chars]'}

CNN
2022-11-09
Opinion A disastrous day for Donald Trump
Opinion A disastrous day for Donald Trump
results midterm elections have been fully tallied crucial question will control Congress been answered draw some initial conclusions writes Frida Ghitis
election,2022-11-09,CNN,Opinion A disastrous day for Donald Trump,results midterm elections have been fully tallied crucial question will control Congress been answered draw some initial conclusions writes Frida Ghitis

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Matt Egan', 'title': 'Wall Street is bracing for midterm results. But Thursday's inflation report may be a bigger deal', 'description': 'Wall Street is waiting for the results of the world, but traders say this week's inflation report may prove to be far more consequential to markets.', 'url': 'https://www.cnn.com/2022/11/08/business/wall-street-midterms-inflation/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221108124431-us-markets-washington-1108.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-11-08T18:41:28Z', 'content': 'Wall Street is waiting for the results of the midterm elections like the rest of the world, but traders say this week's inflation report may prove to be far more consequential to markets.\r\nObviousl… [+2195 chars]'}

CNN
2022-11-08
Wall Street is bracing for midterm results But Thursday s inflation report may be a bigger deal
Wall Street is bracing for midterm results But Thursday s inflation report may be a bigger deal
Wall Street waiting results Tuesday midterm election world traders this week inflation report prove more consequential markets
election,2022-11-08,CNN,Wall Street is bracing for midterm results But Thursday s inflation report may be a bigger deal,Wall Street waiting results Tuesday midterm election world traders this week inflation report prove more consequential markets

{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Israel election: What could happen – Reuters.com', 'description': 'Israelis vote in their fifth election in under four years in a tight race that pits centrist Prime Minister Yair Lapid against former premier Benjamin Netanyahu.', 'url': 'https://www.reuters.com/world/middle-east/israel-election-what-could-happen-2022-11-01/', 'urlToImage': 'https://www.reuters.com/resizer/h9QQp...=/1200x628/smart/filters:quality(80)/cloudfront-us-east-2.images.arcpublishing.com/reuters/...jpg', 'publishedAt': '2022-11-01T12:27:00Z', 'content': 'JERUSALEM, Nov 1 (Reuters) - Israelis vote in their fifth election in four years on Tuesday in a tight race that pits centrist Prime Minister Yair Lapid against former premier Benjamin Netanyah… [+3298 chars]'}

Reuters
2022-11-01
Israel election What could happen Reuters com
Israel election What could happen Reuters com
Israelis brief world middle east netanyahu bids comeback right israelis vote again election cycle four years tight race that pits centrist Prime
election,2022-11-01,Reuters,Israel election What could happen Reuters com,Israelis brief world middle east netanyahu bids comeback right israelis vote again election cycle four years tight race that pits centrist Prime

{'source': {'id': 'the-verge', 'name': 'The Verge'}, 'author': 'Makena Kelly', 'title': 'Why can't pollsters reach Gen Z?', 'description': 'Polling has evolved over the last decade to catch up with the rise of social media platforms like Instagram, but experts are struggling...', 'url': 'https://www.theverge.com/2022/11/12/23453798/midterms-election-polls-gen-z-...', 'urlToImage': 'https://cdn.vox-cdn.com/thumbor/...=/0x0:7563x5042/1200x628/filters:focal(3782x2521:3783x2522)/cdn.vox-cdn.com/uploads/chorus_asset/file/24188765/1264571842.jpg', 'publishedAt': '2022-11-12T16:00:00Z', 'content': 'Why can't pollsters reach Gen Z?\r\nTraditional wisdom and poor polling methods fail to reach young people. What needs to change?\r\nRepubli… [+5759 chars]'}

The Verge
2022-11-12
Why can t pollsters reach Gen Z
Why can t pollsters reach Gen Z
Polling evolved over last decade catch with rise social media platforms like Facebook Instagram experts suggest firms haven gone enough
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{'source': {'id': 'bbc-news', 'name': 'BBC News'}, 'author': 'https://www.facebook.com/bbcnews', 'title': 'Abortion rights in constitution: Vermont first to put abortion rights in constitution', 'description': 'Four other states have voted on abortion rights - an issue that is close to the top of voters' priorities.', 'url': 'https://www.bbc.co.uk/news/world-us-canada-63564062', 'urlToImage': 'https://ichef.bbci.co.uk/news/1024/branded_news/10B4/production/_127564846_getty-images-1438486161.jpg', 'publishedAt': '2022-11-09T04:23:06Z', 'content': 'Vermont has become the first state in the US to formally enshrine the right to abortion in the constitution, with more than 70% voted in favour of the measure, projections say.\r\nCalifornia, Mont… [+1606 chars]'}

BBC News
2022-11-09
Abortion rights in constitution Vermont first to put abortion rights in constitution
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Four other states have voted abortion rights issue that close voters priorities
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{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Fredreka Schouten', 'title': 'How to navigate intimidation and other obstacles to voting', 'description': 'In Wisconsin and Pennsylvania, legal clashes have broken out over whether to count absentee ballots with missing information. In Georgia, conservative activists have continued pursuing efforts to purge people from the voter rolls.', 'url': 'https://www.cnn.com/2022/11/01/politics/voter-intimidation-midterms/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221029152302-arizona-ballot-drop-box.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-11-01T16:00:50Z', 'content': 'In Wisconsin and Pennsylvania, legal clashes have broken out over whether to count absentee ballots with missing information. In Georgia, conservative activists have continued pursuing efforts to purge people from the voter rolls… [+10376 chars]'}

CNN
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How to navigate intimidation and other obstacles to voting
How to navigate intimidation and other obstacles to voting
Wisconsin Pennsylvania legal clashes have broken over whether count absentee ballots with missing information Georgia conservative activists have continued pursue efforts purge people voter rolls
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{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Analysis: Lula, Bolsonaro and market look to cure Brazil's economic hangover - Reuters', 'description': 'Candidates in Brazil's presidential runoff election on Sunday are promising to ease the financial strain of Brazil's economy...', 'url': 'https://www.reuters.com/markets/us/lula-bolsonaro-market-look-cure-brazil-economic-hangover-2022-10-27/', 'urlToImage': 'https://www.reuters.com/resizer/...=/1200x628/smart/filters:quality(80)/cloudfront-us-east-2.images.arcpublishing.com/reuters/...jpg', 'publishedAt': '2022-10-27T10:11:22Z', 'content': 'SAO PAULO, Oct 27 (Reuters) - Both candidates in Brazil's presidential runoff election this month have offered relief to voters struggling with inflation and hurting economic growth.\r\nBut ... [+4063 chars]'}

Reuters
2022-10-27
Analysis Lula Bolsonaro and market look to cure Brazil economic hangover Reuters
Analysis Lula Bolsonaro and market look to cure Brazil economic hangover Reuters
Both candidates Brazil presidential runoff election this month have offered relief unpaid debts weighing family finances hurting economic growth
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{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Factbox: How will the contest to replace Liz Truss as UK prime minister work? - Reuters', 'description': 'Britain's ruling Conservative Party will choose a new leader, and therefore the country's next prime minister, within a week.', 'url': 'https://www.reuters.com/world/uk/how-will-contest-replace-liz-truss-uk-prime-minister-work-2022-10-20/', 'urlToImage': 'https://www.reuters.com/resizer/...=/1200x628/smart/filters:quality(80)/cloudfront-us-east-2.images.arcpublishing.com/reuters/...jpg', 'publishedAt': '2022-10-20T15:31:00Z', 'content': 'LONDON, Oct 20 (Reuters) - Britain's Liz Truss resigned as Conservative Party leader and prime minister to be completed next week.\r\n ... [+2922 chars]'}

Reuters
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Factbox How will the contest to replace Liz Truss as UK prime minister work Reuters
Factbox How will the contest to replace Liz Truss as UK prime minister work Reuters
Britain ruling Conservative Party leader will choose leader therefore country next prime minister complete next week
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{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': 'Reuters Editorial', 'title': 'Economy and insecurity drive Nigeria's brain drain - Reuters', 'description': 'Young educated workers are leaving Nigeria amid high inflation and a "brain drain" ahead of next year's presidential election. Angela Ukomadu has more.', 'url': 'https://www.reuters.com/video/watch/idOV367101022022RP1', 'urlToImage': 'https://static.reuters.com/resources/r/?d=20221018&i=OV367101022022RP1&w=1280&r=OV367101022022RP1-o.jpg&t=2', 'publishedAt': '2022-10-18T12:42:10Z', 'content': 'Posted \r\nYoung and educated workers are leaving Nigeria amid high inflation and a plunging naira, creating a "brain drain" ahead of next year's presidential election. Angela Ukomadu has more.'}

Reuters
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Economy and insecurity drive Nigeria s brain drain Reuters
Economy and insecurity drive Nigeria s brain drain Reuters
Young educated workers leaving Nigeria amid high inflation plunging naira creating brain drain ahead next year presidential election Angela Ukomadu more
election,2022-10-18,Reuters,Economy and insecurity drive Nigeria s brain drain Reuters,Young educated workers leaving Nigeria amid high inflation plunging naira creating brain drain ahead next year presidential election Angela Ukomadu more

{'source': {'id': None, 'name': 'Ctvnews.ca'}, 'author': None, 'title': 'Surrey election: Doug McCallum not ready to concede | CTV News - CTV News Vancouver', 'description': ' Surrey election: Doug McCallum not ready to concede CTV News Vancouver Surrey's Brenda Locke accepting defeat ... CTV News ', 'url': 'https://bc.ctvnews.ca/surrey-election-doug-mccallum-not-ready-to-concede-...', 'urlToImage': 'https://www.ctvnews.ca/content/dam/ctvnews/en/images/...', 'publishedAt': '2022-10-16T00:44:00Z', 'content': 'The incumbent mayor of B.C.'s second-largest city, after coming within 1,000 votes of victory in the initial count.\r\nDoug McCallum's Safe Surrey Coalition ya… [+834 chars]'}

Ctvnews.ca
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Surrey election Doug McCallum not ready to concede CTV News CTV News Vancouver
Surrey election Doug McCallum not ready to concede CTV News CTV News Vancouver
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{'source': {'id': None, 'name': 'Gizmodo.com'}, 'author': 'Gizmodo', 'title': 'Homeland Security Admits It Tried to Manufacture Fake Terrorists for Trump', 'description': 'A failed operation that surveilled hundreds, if not thousands, of U.S. protesters in what was a sweeping, power-hungry effort before the 2020 election... ', 'url': 'https://gizmodo.com/dhs-trump-homeland-security-...', 'urlToImage': 'https://i.kinja-img.com/gawker-media/image/upload/c_fill,f_auto,fl_progressive,g_center,h_675,pg_1,q_80,w_1200/...jpg', 'publishedAt': '2022-10-05T11:40:50Z', 'content': 'The Department of Homeland Security launched documents show was a sweeping, power-hungry effort before the election, ... [+12406 chars]'}

Gizmodo.com
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Homeland Security Admits It Tried to Manufacture Fake Terrorists for Trump
Homeland Security Admits It Tried to Manufacture Fake Terrorists for Trump
failed operation that surveilled hundreds thousands protesters documents show sweeping power hungry effort before election
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{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Fact Check-Why a mostly red PA election map showing a Trump win does not prove election fraud - Reuters', 'description': 'Maps with election results showing a majority of counties in Pennsylvania that voted predominantly red as proof of voter fraud, contrary to official results...', 'url': 'https://www.reuters.com/article/factcheck-pa-election-idUSL1N32T0000', 'urlToImage': 'https://s1.reutersmedia.net/resources_r2/images/default.png?w=800', 'publishedAt': '2022-11-10T11:51:00Z', 'content': 'Maps with election results showing a majority of counties in Pennsylvania that look predominantly red (representing Republican) as proof that Trump won the state are not proof of election fraud, contrary to… [+231 chars]'}

Reuters
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Fact Check Why a mostly red PA election map showing a Trump win does not prove election fraud Reuters
Fact Check Why a mostly red PA election map showing a Trump win does not prove election fraud Reuters
Maps with election results showing majority counties Pennsylvania that look predominantly represented Republican proof state election fraud contrary official results
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{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Election denier in Michigan loses bid to run in vote to run 2024 vote in state - Reuters', 'description': 'Tuesday's midterm elections shattered hopes of Republicans who backed former President Donald Trump's false claims that he won the 2020 election...', 'url': 'https://www.reuters.com/world/us/election-denier-michigan-loses-bid-run-vote-2022-11-09/', 'urlToImage': 'https://www.reuters.com/resizer/...=/1200x628/smart/filters:quality(80)/cloudfront-us-east-2.images.arcpublishing.com/reuters/...jpg', 'publishedAt': '2022-11-09T06:31:00Z', 'content': '(Reuters) - Voters in the key battleground state of Michigan rejected Republican candidates for statewide office who backed Trump... [+1971 chars]'}

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Election denier in Michigan loses bid to run in vote to run 2024 vote in state Reuters
Election denier in Michigan loses bid to run 2024 vote in state Reuters
Tuesday midterm elections shattered hopes Republicans backed former President Donald Trump false claims election denier in Michigan Tuesday
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{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Analysis: Ron DeSantis' big election night shakes White House field - Reuters', 'description': 'Florida Governor Ron DeSantis arguably had the best night of anyone in Election Day, trouncing his Democratic opponent on his way to re-election and cementing himself as a …', 'url': 'https://www.reuters.com/world/us/ron-desantis-big-election-night-shakes-white-house-field-2022-11-09/', 'urlToImage': 'https://www.reuters.com/resizer/...jpg', 'publishedAt': '2022-11-09T08:03:00Z', 'content': 'WASHINGTON, Nov 9 (Reuters) - Florida Governor Ron DeSantis arguably had the best night of anyone on Election Day, trouncing his Democratic opponent on his way to re-election and cementing himself a… [+6290 chars]'}

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Analysis Ron DeSantis big election night shakes White House field Reuters
Analysis Ron DeSantis big election night shakes White House field Reuters
Florida Governor Ron DeSantis arguably best night anyone Election trouncing Democratic opponent re election cementing himself
election,2022-11-09,Reuters,Analysis Ron DeSantis big election night shakes White House field Reuters,Florida Governor Ron DeSantis arguably best night anyone Election trouncing Democratic opponent re election cementing himself

{'source': {'id': 'engadget', 'name': 'Engadget'}, 'author': 'Harry Enten', 'title': 'Analysis: A Republican wave in the House is still quite possible', 'description': 'The race for control of the US Senate has dominated news coverage of late, and for good reason. But there are plenty of competitive House races...', 'url': 'https://www.cnn.com/2022/10/27/politics/republican-wave-house-midterms/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221027104542-capitol-0927.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-10-27T12:34:00Z', 'content': 'The race for control of the US Senate has dominated news coverage of late, and for good reason. It's likely that the ... [+5422 chars]'}

CNN
2022-10-27
Analysis A Republican wave in the House is still quite possible
Analysis A Republican wave in the House is still quite possible
race control Senate dominated news coverage midterms that surprising polls plenty competitive House races that will determine which party wins majority
election,2022-10-27,CNN,Analysis A Republican wave in the House is still quite possible,race control Senate dominated news coverage midterms that surprising polls plenty competitive House races that will determine which party wins majority

{'source': {'id': 'bbc-news', 'name': 'BBC News'}, 'author': 'https://www.facebook.com/bbcnews', 'title': 'US midterm elections: Abortion will decide how I vote - here's why', 'description': 'Paxton and Melanie have very different views on whether abortion should be banned or protected in the US.', 'url': 'https://www.bbc.co.uk/news/world-us-canada-63435169', 'urlToImage': 'https://ichef.bbci.co.uk/news/1024/branded_news/1262A/production/_127460357_p0d1cvpx.jpg', 'publishedAt': '2022-11-01T22:39:06Z', 'content': 'When Paxton Smith and Melanie Salazar vote in the US midterm election next week, abortion will be the most important issue for both - but for very different reasons. \r\nThe Supreme Court's decision … [+280 chars]'}

BBC News
2022-11-01
US midterm elections Abortion will decide how I vote here s why
US midterm elections Abortion will decide how I vote here s why
Paxton Melanie have very different views whether abortion should banned protected
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{'source': {'id': 'engadget', 'name': 'Engadget'}, 'author': 'Andrew Tarantola', 'title': 'Texas AG sues Google over its facial data collection practices', 'description': 'The office of Texas State Attorney General Ken Paxton announced Thursday that it has filed a lawsuit against Google over the company's alleged "capture and use of biometric data from "millions of Texans without properly obtaining th...', 'url': 'https://www.engadget.com/texas-attorney-general-sues-google-facial-recognition-practices-161942788.html', 'urlToImage': 'https://s.yimg.com/os/creatr-uploaded-images/2022-09/98e07ce0-2ae6-11ed-bfef-4161b1406f90', 'publishedAt': '2022-10-20T20:19:42Z', 'content': 'The office of Texas State Attorney General Ken Paxton announced on Thursday that it has filed a lawsuit against Google over the company's alleged years-long practices to capture and use of biometric … [+1676 chars]'}

Engadget
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Texas AG sues Google over its facial data collection practices
Texas AG sues Google over its facial data collection practices
office Texas State Attorney General Paxton announced Thursday that filed lawsuit against Google over company alleged years long practices capture biometric data from millions Texans
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{'source': {'id': 'engadget', 'name': 'Engadget'}, 'author': 'Jon Fingas', 'title': 'Facebook groups now include Reels and more anti-misinformation tools', 'description': 'Facebook is giving Groups a tune-up with new features focused on content and discussions. Like it or not, Reels are coming to Groups — members share vacation recaps and other videos using the seemingly omnipresent format. Y...', 'url': 'https://www.engadget.com/facebook-groups-reels-anti-misinformation-tools-162033187.html', 'urlToImage': 'https://s.yimg.com/os/creatr-uploaded-images/2022-10/540d9320-508d-11ed-bdfe-647021adb5d4', 'publishedAt': '2022-10-20T16:20:33Z', 'content': 'Facebook is giving Groups a tune-up with new features, not to mention tools to ensure healthy discussions. Like it or not, Reels are coming to Groups members can share how-to guides, vacation recaps … [+1496 chars]'}

Engadget
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Facebook groups now include Reels and more anti misinformation tools
Facebook groups now include Reels and more anti misinformation tools
Facebook giving Groups tune with features focused content discussions like Reels coming Groups members share vacation recaps other videos using seemingly omnipresent format
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{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': 'Travis Hartman, Ally J. Levine, Claire Trainor', 'title': 'Charting the midterms - Reuters', 'description': 'The main takeaways from the 2022 U.S. midterm election, visualized.', 'url': 'https://graphics.reuters.com/USA-ELECTION/MIDTERMS/zgpobwokdvd/', 'urlToImage': 'https://graphics.reuters.com/USA-ELECTION/MIDTERMS/zgpobwokdvd/cdn/images/reuters-graphics.jpg', 'publishedAt': '2022-11-09T22:27:00Z', 'content': 'The main takeaways of the 2022 U.S. midterm election, visualized\r\nThe 2022 U.S. midterm election results strayed from the pattern of almost every midterm since World War Two, which normally shrinks the fo… [+2482 chars]'}

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Charting the midterms Reuters
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{'source': {'id': 'bbc-news', 'name': 'BBC News'}, 'author': 'https://www.facebook.com/bbcnews', 'title': 'US midterms: Record turnout as early voting starts in Georgia', 'description': 'Early voting tops 131,000 on the first day of voting in Georgia, state home some closely watched races ahead of November's midterms.', 'url': 'https://www.bbc.co.uk/news/world-us-canada-63318461', 'urlToImage': 'https://ichef.bbci.co.uk/news/1024/branded_news/...jpg', 'publishedAt': '2022-10-18T19:15:31Z', 'content': 'A record number of voters turned out in the US state of Georgia on the first day of early voting, for the midterm elections.\r\nAlmost double the nu… [+2275 chars]'}

BBC News
2022-10-18
US midterms Record turnout as early voting starts in Georgia
US midterms Record turnout as early voting starts in Georgia
state home some most closely watched races ahead November midterms
election,2022-10-18,BBC News,US midterms Record turnout as early voting starts in Georgia,state home some most closely watched races ahead November midterms

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Ariel Edwards-Levy, Tami Luhby', 'title': 'Exit polls: What voters are thinking as America goes to the polls', 'description': 'Voters in this year's midterm elections are broadly unhappy with the state of the nation and hold largely negative views of President Joe Biden, according to the preliminary national results of the exit poll.', 'url': 'https://www.cnn.com/2022/11/08/politics/exit-polls-midterm-election-results/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221108145031-01-denver-voting-110822.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-11-09T02:06:37Z', 'content': 'Voters in this year's midterm elections are broadly unhappy with the state of the nation and hold largely negative views of President Joe Biden, according to the preliminary national results of the exit poll conducted for CNN and other news networks by Edison... [+3922 chars]'}

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Exit polls What voters are thinking as America goes to the polls
Exit polls What voters are thinking as America goes to the polls
Voters this year midterm elections broadly unhappy with state nation hold largely negative views President Biden according preliminary national results exit poll conducted other news networks Edison
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{'source': {'id': None, 'name': 'The Guardian'}, 'author': 'Maya Yang', 'title': 'Trump signed statement alleging voter fraud knowing it was false, judge says', 'description': 'Document part of lawsuit challenging results of election in Georgia had numbers he knew were false, federal judge said Wednesday', 'url': 'https://www.theguardian.com/us-news/2022/oct/19/trump-voter-fraud-statement-judge', 'urlToImage': 'https://i.guim.co.uk/img/media/...?width=1200&height=630&quality=85&auto=format&fit=crop&overlay-align=bottom%2Cleft&overlay-width=100p&overlay-base64=...&enable=upscale&s=...', 'publishedAt': '2022-10-20T00:00:51Z', 'content': 'Donald Trump signed a legal document alleging voter fraud in the 2020 election in Georgia despite being told the numbers underpinning the case were false, a federal judge said on Wednesday.\r\nThe disclosure was… [+3408 chars]'}

The Guardian
2022-10-20
Trump signed statement alleging voter fraud knowing it was false judge says
Trump signed statement alleging voter fraud knowing it was false judge says
Document part lawsuit challenging results election Georgia had numbers knew were false federal judge said Wednesday
election,2022-10-20,The Guardian,Trump signed statement alleging voter fraud knowing it was false judge says,Document part lawsuit challenging results election Georgia had numbers knew were false federal judge said Wednesday

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Domenico Montanaro', 'title': 'A day after Election Day, here's where things stand', 'description': 'We're two days out from the Senate, and control of the Senate remains unclear. Arizona and Nevada … Here's what we know — and what we don't know — about some key races.', 'url': 'https://www.npr.org/2022/11/09/1135469070/house-senate-results', 'urlToImage': 'https://media.npr.org/assets/img/2022/11/09/ap22313716919100.jpg', 'publishedAt': '2022-11-10T02:32:35Z', 'content': 'Workers count ballots at the Maricopa County Tabulation and Election Center in Phoenix, Nov. 1, 2022.\r\nMatt York/AP\r\nAs … [+3142 chars]'}

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A day after Election Day here s where things stand
A day after Election Day here s where things stand
post Election phase election season with House Senate unknown
election,2022-11-10,NPR,A day after Election Day here s where things stand,post Election phase election season with House Senate unknown

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Jeremy Herb', 'title': 'What to know as states keep counting ballots and key races are too close to call', 'description': 'The races to determine control of the Senate in Arizona and Nevada have yet to be called as both states have tens of thousands of ballots that have yet to be processed.', 'url': 'https://www.cnn.com/2022/11/10/politics/what-to-know-vote-counting-arizona-nevada/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221109134611-maricopa-county.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-11-10T16:38:39Z', 'content': 'Key races to determine control of the Senate in Arizona and Nevada have yet to be called as both states have tens of thousands of ballots that have yet to be processed.\r\nStill … [+5596 chars]'}

CNN
2022-11-10
What to know as states keep counting with key races hanging in the balance
What to know as states keep counting with key races hanging in the balance
races determine control Senate Arizona Nevada have called both states have thousands ballots that have processed
election,2022-11-10,CNN,What to know as states keep counting with key races hanging in the balance,races determine control Senate Arizona Nevada have called both states have thousands ballots that have processed

{'source': {'id': None, 'name': 'NPR'}, 'author': 'NPR Staff', 'title': 'Live: 2022 election updates and results', 'description': 'Now: 8. It was the final voting day of the 2022 election, but results are still coming in. Keep up with the latest. Follow NPR's live coverage.', 'url': 'https://www.npr.org/live-updates/midterm-election-results-2022-11-09', 'urlToImage': 'https://media.npr.org/...jpg', 'publishedAt': '2022-11-09T11:00:16Z', 'content': 'Now: 8 the balance of power in the U.S. House, where Republicans seem set to continue their trend of shifting control away from a first-term president's party in midterm elect… [+652 chars]'}

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Live election updates and results
Live election updates and results
final voting election results still coming Senate House balance
election,2022-11-09,NPR,Live election updates and results,final voting election results still coming Senate House balance

{'source': {'id': 'cnn', 'name': 'CNN'}, 'author': 'Shawna Mizelle', 'title': 'Pence on whether he'd vote for Trump in 2024: 'There might be somebody else I'd prefer more'', 'description': 'Former Vice President Mike Pence said he would be open to vote for Trump in a potential 2024 race ...', 'url': 'https://www.cnn.com/2022/10/20/politics/mike-pence-vote-trump-2024/index.html', 'urlToImage': 'https://media.cnn.com/api/v1/images/stellar/prod/221020122435-01-mike-pence-1019.jpg?c=16x9&q=w_800,c_fill', 'publishedAt': '2022-10-20T14:24:00Z', 'content': 'Former Vice President Mike Pence on Wednesday declined to say whether he would vote for his former boss, Donald Trump in ... [+2246 chars]'}

CNN
2022-10-20
Pence on whether he d vote for Trump in There might be somebody else I d prefer more
Pence on whether he d vote for Trump in There might be somebody else I d prefer more
Former Vice President Pence Wednesday declined whether would vote former President Donald Trump secured presidential nomination
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{'source': {'id': None, 'name': 'NPR'}, 'author': 'Hansi Lo Wang', 'title': 'Why mail voting laws may slow the count in some key swing states', 'description': 'In some swing states, like Pennsylvania, it may be slower to report election results because of laws that don't allow officials to start preparing mail ballots for counting until Election Day.', 'url': 'https://www.npr.org/2022/11/08/1134235552/pennsylvania-wisconsin-michigan-mail-ballots-counting', 'urlToImage': 'https://media.npr.org/assets/img/2022/11/07/gettyimages-...jpg', 'publishedAt': '2022-11-08T10:00:38Z', 'content': 'Mail-in ballots sit in a processing room at the Allegheny County Election Division... [+2733 chars]'}

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Why mail voting laws may slow the count in some key swing states
Why mail voting laws may slow the count in some key swing states
Some states like Pennsylvania slower report election results because laws that allow officials start preparing mail ballots counting until Election
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{'source': {'id': None, 'name': 'NPR'}, 'author': 'Domenico Montanaro', 'title': 'Your election night guide hour by hour', 'description': 'It all comes down to this. After months of campaigning, here is what to watch, hour by hour, on election night.', 'url': 'https://www.npr.org/2022/11/08/1134653452/election-night-guide', 'urlToImage': 'https://media.npr.org/assets/img/2022/11/07/...jpg', 'publishedAt': '2022-11-08T10:00:03Z', 'content': 'Voters cast their ballots at a polling site ... \r\nThe results of the election... [+12666 chars]'}

NPR
2022-11-08
Your election night guide hour by hour
Your election night guide hour by hour
comes down this After months campaigning down Election Night here what watch hour by hour
election,2022-11-08,NPR,Your election night guide hour by hour,comes down this After months campaigning down Election Night here what watch hour by hour

{'source': {'id': None, 'name': 'NPR'}, 'author': 'Dustin Jones', 'title': 'Listen: 2022 Election Night Special Coverage', 'description': 'Millions have already voted and results are coming in. Listen to NPR election night special coverage.', 'url': 'https://www.npr.org/2022/11/08/1134801075/npr-election-night-special-coverage-2022', 'urlToImage': 'https://media.npr.org/...jpg', 'publishedAt': '2022-11-09T00:00:47Z', 'content': 'Voting ends Tuesday in an election that will decide who controls the House and the Senate... [+1811 chars]'}

NPR
2022-11-09
Listen Election Night Special Coverage
Listen Election Night Special Coverage
Millions have already voted results coming Listen election night analysis
election,2022-11-09,NPR,Listen Election Night Special Coverage,Millions have already voted results coming Listen election night analysis

{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Frustrated Nigerians flee abroad in punishing pre-election brain drain - Reuters', 'description': 'Nnamdi Nwaogu, a 44-year-old IT worker, has packed his bags... years of economic ... ', 'url': 'https://www.reuters.com/world/africa/frustrated-nigerians-flee-abroad-punishing-pre-election-brain-drain-2022-10-18/', 'urlToImage': 'https://www.reuters.com/resizer/...=/1200x628/smart/filters:quality(80)/cloudfront-us-east-2.images.arcpublishing.com/reuters/...jpg', 'publishedAt': '2022-10-18T10:28:00Z', 'content': 'LAGOS, Oct 18 (Reuters) - Nnamdi Nwaogu, a 44-year-old IT worker, has packed his bags. Nigeria's frenetic commercial capital, galloping inflation and a plunging naira have pummeled his sala… [+2739 chars]'}

Reuters
2022-10-18
Frustrated Nigerians flee abroad in punishing pre election brain drain Reuters
Frustrated Nigerians flee abroad in punishing pre election brain drain Reuters
Nnamdi Nwaogu year worker packed bags Lagos Nigeria frenetic commercial capital galloping inflation plunging naira have pummeled salary
election,2022-10-18,Reuters,Frustrated Nigerians flee abroad in punishing pre election brain drain Reuters,Nnamdi Nwaogu year worker packed bags Lagos Nigeria frenetic commercial capital galloping inflation plunging naira have pummeled salary

{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Election disruptions loom as social media giants likely to resist Turkey's new law - Reuters', 'description': 'Social media companies are unlikely to fully abide by Turkey's new law requiring them to share user data with authorities, analysts say...', 'url': 'https://www.reuters.com/technology/election-disruptions-loom-social-media-giants-likely-resist-turkeys-new-law-2022-10-21/', 'urlToImage': 'https://www.reuters.com/resizer/...=/1200x628/smart/filters:quality(80)/cloudfront-us-east-2.images.arcpublishing.com/reuters/...jpg', 'publishedAt': '2022-10-21T14:00:00Z', 'content': 'ISTANBUL, Oct 21 (Reuters) - Social media companies are unlikely to fully abide by Turkey's new law requiring them to remove "disinformation" content and share user data with authorities, analysts … [+5301 chars]'}

Reuters
2022-10-21
Election disruptions loom as social media giants likely to resist Turkey new law Reuters
Election disruptions loom as social media giants likely to resist Turkey new law Reuters
Social media companies unlikely fully abide Turkey likely requiring them share user data with authorities raising spectre possible platform disruptions before elections next year
election,2022-10-21,Reuters,Election disruptions loom as social media giants likely to resist Turkey new law Reuters,Social media companies unlikely fully abide Turkey likely requiring them share user data with authorities raising spectre possible platform disruptions before elections next year

{'source': {'id': 'reuters', 'name': 'Reuters'}, 'author': None, 'title': 'Fact Check-No evidence of widespread ballot 'harvesting' ahead of the U.S. midterm elections - Reuters', 'description': 'There is no evidence to support claims made by social media users that there was a nationwide effort to "harvest ballots" ahead of the U.S. midterm elections in November...', 'url': 'https://www.reuters.com/article/factcheck-ballot-harvesting-idUSL1N31Q1X1', 'urlToImage': 'https://s1.reutersmedia.net/resources_r2/images/default.png?w=800', 'publishedAt': '2022-10-20T17:30:15Z', 'content': 'There is no evidence to support claims made by social media users that there is a nationwide effort to harvest ballots ahead of the 2022 U.S. midterm elections … [+6787 chars]'}

Reuters
2022-10-20
Fact Check No evidence of widespread ballot harvesting ahead of the U S midterm elections

```
     abortions  ahead  biden  close  constitution  control  country  court  \
0            0      0      0      0             0        0        0      0
1            0      0      0      0             1        0        0      0
2            0      0      0      0             0        0        0      1
3            0      0      0      0             0        0        0      0
4            0      0      0      0             0        0        0      0
..         ...    ...    ...    ...           ...      ...      ...    ...
195          0      0      1      0             0        0        0      0
196          0      0      0      0             0        0        0      0
197          0      0      0      0             0        0        0      1
198          0      0      0      0             0        0        0      0
199          0      0      0      0             0        0        0      0

     democratic  democrats  ...  trump  tuesday  vote  voters  voting  weeks  \
0             0          0  ...      0        0     0       0       0      0
1             0          0  ...      0        0     0       1       0      0
2             0          0  ...      0        0     0       0       0      1
3             0          1  ...      0        0     0       1       0      0
4             0          1  ...      0        0     0       0       0      0
..          ...        ...  ...    ...      ...   ...     ...     ...    ...
195           0          0  ...      0        0     0       0       0      0
196           0          0  ...      0        0     0       0       0      0
197           0          0  ...      1        1     0       0       0      0
198           1          1  ...      0        0     0       1       0      0
199           0          0  ...      0        0     0       0       1      0

     women  world  year  years
0        0      0     0      0
1        0      0     0      0
2        0      0     0      0
3        0      0     0      0
4        0      0     0      0
..     ...    ...   ...    ...
195      0      0     0      0
196      0      1     0      0
197      0      0     0      1
198      0      0     0      0
199      0      0     0      0

[200 rows x 50 columns]
```

In [63]:
```
print(Labels_DF)
```
```
        LABEL
0    abortion
1    abortion
2    abortion
3    abortion
4    abortion
..        ...
195  election
196  election
197  election
198  election
199  election

[200 rows x 1 columns]
```

In [68]:
```
training_data = My_Orig_DF
```

In [67]:
```
train_labels = pd.factorize(Labels_DF['LABEL'])[0]
train_labels
```
Out[67]:
```
array([0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0,
       0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0,
       0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0,
       0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0,
       0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1,
       1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1,
       1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1,
       1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1,
       1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1,
       1, 1])
```

In [69]:
```
NumCols = Final_News_DF_Labeled.shape[1]
print(NumCols)
```
```
51
```

```
######################################################
## ANN
######################################################
## Simple Dense NN for sentiment analysis (classification 0 neg, 1 pos)
# First layer: Embedding Layer (Keras Embedding Layer) that will learn embeddings
# for different words .
## RE: ## https://keras.io/api/layers/core_layers/embedding/
## input_dim: Integer. Size of the vocabulary
## input_length: Length of input sequences, when it is constant.
print(NumCols)
input_dim = NumCols + 1
 #https://www.tensorflow.org/api_docs/python/tf/keras/Input
input_data = tensorflow.keras.layers.Input(shape=(50))
 #https://www.tensorflow.org/api_docs/python/tf/keras/layers/Embedding

data = tensorflow.keras.layers.Embedding(input_dim=input_dim, output_dim=18, input_length=50)(input_data)
##input_dim: Integer. Size of the vocabulary, i.e. maximum integer index + 1
## Good tutorial for this concept:
   ## https://medium.com/analytics-vidhya/understanding-embedding-layer-in-keras-bbe3ff1327ce
 #output_dim: Integer. Dimension of the dense embedding.
 # output_dim: This is the size of the vector space in which words will be embedded.
 #It defines the size of the output vectors from this layer for each word.
 # For example, it could be 32 or 100 or even larger.
 #https://machinelearningmastery.com/use-word-embedding-layers-deep-learning-keras/
 #  In an embedding, words are represented by dense vectors where a vector represents
 # the projection of the word into a continuous vector space.
 # The position of a word within the vector space is learned
 # from text and is based on the words that surround the word when it is used.
 # The position of a word in the learned vector space is referred to as its embedding.
data = tensorflow.keras.layers.Flatten()(data)
 #Dense layers require inputs as (batch_size, input_size)
data = tensorflow.keras.layers.Dense(16)(data)
data = tensorflow.keras.layers.Activation('relu')(data)
data = tensorflow.keras.layers.Dropout(0.5)(data)

data = tensorflow.keras.layers.Dense(8)(data)
data = tensorflow.keras.layers.Activation('relu')(data)

data = tensorflow.keras.layers.Dropout(0.5)(data)

data = tensorflow.keras.layers.Dense(4)(data)
data = tensorflow.keras.layers.Activation('sigmoid')(data)
data = tensorflow.keras.layers.Dropout(0.5)(data)

data = tensorflow.keras.layers.Dense(1)(data)
output_data = tensorflow.keras.layers.Activation('sigmoid')(data)

model = tensorflow.keras.models.Model(inputs=input_data, outputs=output_data)

model.compile(loss='binary_crossentropy', optimizer='adam', metrics=['accuracy'])
model.summary()

model.fit(training_data, train_labels, epochs=10)
```
```
51
Model: "model_22"
_________________________________________________________________
 Layer (type)                Output Shape              Param #
=================================================================
 input_23 (InputLayer)       [(None, 50)]              0

 embedding_22 (Embedding)    (None, 50, 18)            936

 flatten_11 (Flatten)        (None, 900)               0

 dense_57 (Dense)            (None, 16)                14416

 activation_54 (Activation)  (None, 16)                0

 dropout_26 (Dropout)        (None, 16)                0

 dense_58 (Dense)            (None, 8)                 136

 activation_55 (Activation)  (None, 8)                 0

 dropout_27 (Dropout)        (None, 8)                 0

 dense_59 (Dense)            (None, 4)                 36

 activation_56 (Activation)  (None, 4)                 0

 dropout_28 (Dropout)        (None, 4)                 0

 dense_60 (Dense)            (None, 1)                 5

 activation_57 (Activation)  (None, 1)                 0

=================================================================
Total params: 15,529
Trainable params: 15,529
Non-trainable params: 0
_________________________________________________________________
Epoch 1/10
7/7 [==============================] - 1s 3ms/step - loss: 0.7705 - accuracy: 0.4700
Epoch 2/10
7/7 [==============================] - 0s 3ms/step - loss: 0.7294 - accuracy: 0.5100
Epoch 3/10
7/7 [==============================] - 0s 3ms/step - loss: 0.7409 - accuracy: 0.5050
Epoch 4/10
7/7 [==============================] - 0s 3ms/step - loss: 0.7267 - accuracy: 0.4950
Epoch 5/10
7/7 [==============================] - 0s 3ms/step - loss: 0.7293 - accuracy: 0.4700
Epoch 6/10
7/7 [==============================] - 0s 13ms/step - loss: 0.7045 - accuracy: 0.4950
Epoch 7/10
7/7 [==============================] - 0s 4ms/step - loss: 0.7041 - accuracy: 0.5500
Epoch 8/10
7/7 [==============================] - 0s 3ms/step - loss: 0.7203 - accuracy: 0.5500
Epoch 9/10
7/7 [==============================] - 0s 4ms/step - loss: 0.7042 - accuracy: 0.5250
Epoch 10/10
7/7 [==============================] - 0s 3ms/step - loss: 0.7347 - accuracy: 0.5050
```
Out[83]:
```
<keras.callbacks.History at 0x7fc5b6ab92e0>
```

In [84]:
```
######################################################
## RNN
######################################################

input_data = tensorflow.keras.layers.Input(shape=(50))

data = tensorflow.keras.layers.Embedding(input_dim=input_dim, output_dim=32, input_length=50)(input_data)
 #https://www.tensorflow.org/api_docs/python/tf/keras/layers/Bidirectional
data = tensorflow.keras.layers.Bidirectional(tensorflow.keras.layers.SimpleRNN(50))(data)

data = tensorflow.keras.layers.Dense(1)(data)
output_data = tensorflow.keras.layers.Activation('sigmoid')(data)

model = tensorflow.keras.models.Model(inputs=input_data, outputs=output_data)

model.compile(loss='binary_crossentropy', optimizer='adam', metrics=['accuracy'])
model.summary()

model.fit(training_data, train_labels, epochs=10)
```
```
Model: "model_23"
_________________________________________________________________
 Layer (type)                Output Shape              Param #
=================================================================
 input_24 (InputLayer)       [(None, 50)]              0

 embedding_23 (Embedding)    (None, 50, 32)            1664

 bidirectional_8 (Bidirectio  (None, 100)              8300
 nal)

 dense_61 (Dense)            (None, 1)                 101

 activation_58 (Activation)  (None, 1)                 0

=================================================================
Total params: 10,065
Trainable params: 10,065
Non-trainable params: 0
_________________________________________________________________
Epoch 1/10
7/7 [==============================] - 2s 16ms/step - loss: 0.6934 - accuracy: 0.5250
Epoch 2/10
7/7 [==============================] - 0s 18ms/step - loss: 0.6715 - accuracy: 0.5600
Epoch 3/10
7/7 [==============================] - 0s 19ms/step - loss: 0.6361 - accuracy: 0.6250
Epoch 4/10
7/7 [==============================] - 0s 16ms/step - loss: 0.5854 - accuracy: 0.7250
Epoch 5/10
7/7 [==============================] - 0s 20ms/step - loss: 0.5741 - accuracy: 0.7100
Epoch 6/10
7/7 [==============================] - 0s 19ms/step - loss: 0.5590 - accuracy: 0.7300
Epoch 7/10
7/7 [==============================] - 0s 18ms/step - loss: 0.5539 - accuracy: 0.7200
Epoch 8/10
7/7 [==============================] - 0s 22ms/step - loss: 0.5349 - accuracy: 0.7650
Epoch 9/10
7/7 [==============================] - 0s 15ms/step - loss: 0.5010 - accuracy: 0.7550
Epoch 10/10
7/7 [==============================] - 0s 19ms/step - loss: 0.5301 - accuracy: 0.7300
```
Out[84]:
```
<keras.callbacks.History at 0x7fc5b6f46130>
```

In [85]:
```
################################################
## LSTM
################################################
input_data = tensorflow.keras.layers.Input(shape=(50))

data = tensorflow.keras.layers.Embedding(input_dim=input_dim, output_dim=32, input_length=50)(input_data)

data = tensorflow.keras.layers.Bidirectional(tensorflow.keras.layers.LSTM(50))(data)

data = tensorflow.keras.layers.Dense(1)(data)
output_data = tensorflow.keras.layers.Activation('sigmoid')(data)

model = tensorflow.keras.models.Model(inputs=input_data, outputs=output_data)

model.compile(loss='binary_crossentropy', optimizer='adam', metrics=['accuracy'])
model.summary()

model.fit(training_data, train_labels, epochs=10)
```
```
Model: "model_24"
_________________________________________________________________
 Layer (type)                Output Shape              Param #
=================================================================
 input_25 (InputLayer)       [(None, 50)]              0

 embedding_24 (Embedding)    (None, 50, 32)            1664

 bidirectional_9 (Bidirectio  (None, 100)              33200
 nal)

 dense_62 (Dense)            (None, 1)                 101

 activation_59 (Activation)  (None, 1)                 0

=================================================================
Total params: 34,965
Trainable params: 34,965
Non-trainable params: 0
_________________________________________________________________
Epoch 1/10
7/7 [==============================] - 3s 23ms/step - loss: 0.6942 - accuracy: 0.4900
Epoch 2/10
7/7 [==============================] - 0s 28ms/step - loss: 0.6933 - accuracy: 0.4900
Epoch 3/10
7/7 [==============================] - 0s 29ms/step - loss: 0.6936 - accuracy: 0.4800
Epoch 4/10
7/7 [==============================] - 0s 28ms/step - loss: 0.6929 - accuracy: 0.5000
Epoch 5/10
7/7 [==============================] - 0s 27ms/step - loss: 0.6931 - accuracy: 0.4550
Epoch 6/10
7/7 [==============================] - 0s 31ms/step - loss: 0.6936 - accuracy: 0.5000
Epoch 7/10
7/7 [==============================] - 0s 27ms/step - loss: 0.6925 - accuracy: 0.5000
Epoch 8/10
7/7 [==============================] - 0s 30ms/step - loss: 0.6927 - accuracy: 0.5150
Epoch 9/10
7/7 [==============================] - 0s 29ms/step - loss: 0.6925 - accuracy: 0.5550
Epoch 10/10
7/7 [==============================] - 0s 28ms/step - loss: 0.6923 - accuracy: 0.5400
```
Out[85]:
```
<keras.callbacks.History at 0x7fc610bcd610>
```

In [86]:
```
##########################################
## CNN
##########################################
input_data = tensorflow.keras.layers.Input(shape=(50))

data = tensorflow.keras.layers.Embedding(input_dim=input_dim, output_dim=32, input_length=50)(input_data)

data = tensorflow.keras.layers.Conv1D(50, kernel_size=3, activation='relu')(data)
data = tensorflow.keras.layers.MaxPool1D(pool_size=2)(data)

data = tensorflow.keras.layers.Conv1D(40, kernel_size=3, activation='relu')(data)
data = tensorflow.keras.layers.MaxPool1D(pool_size=2)(data)

data = tensorflow.keras.layers.Conv1D(30, kernel_size=3, activation='relu')(data)
data = tensorflow.keras.layers.MaxPool1D(pool_size=2)(data)

data = tensorflow.keras.layers.Conv1D(30, kernel_size=3, activation='relu')(data)
data = tensorflow.keras.layers.MaxPool1D(pool_size=2)(data)

data = tensorflow.keras.layers.Flatten()(data)

data = tensorflow.keras.layers.Dense(20)(data)
data = tensorflow.keras.layers.Dropout(0.5)(data)

data = tensorflow.keras.layers.Dense(1)(data)
output_data = tensorflow.keras.layers.Activation('sigmoid')(data)

model = tensorflow.keras.models.Model(inputs=input_data, outputs=output_data)

model.compile(loss='binary_crossentropy', optimizer='adam', metrics=['accuracy'])
model.summary()

model.fit(training_data, train_labels, epochs=10)
```
```
Model: "model_25"
_________________________________________________________________
 Layer (type)                Output Shape              Param #
=================================================================
 input_26 (InputLayer)       [(None, 50)]              0

 embedding_25 (Embedding)    (None, 50, 32)            1664

 conv1d_12 (Conv1D)          (None, 48, 50)            4850

 max_pooling1d_12 (MaxPoolin  (None, 24, 50)           0
 g1D)

 conv1d_13 (Conv1D)          (None, 22, 40)            6040

 max_pooling1d_13 (MaxPoolin  (None, 11, 40)           0
 g1D)

 conv1d_14 (Conv1D)          (None, 9, 30)             3630

 max_pooling1d_14 (MaxPoolin  (None, 4, 30)            0
 g1D)

 conv1d_15 (Conv1D)          (None, 2, 30)             2730

 max_pooling1d_15 (MaxPoolin  (None, 1, 30)            0
 g1D)

 flatten_12 (Flatten)        (None, 30)                0

 dense_63 (Dense)            (None, 20)                620

 dropout_29 (Dropout)        (None, 20)                0

 dense_64 (Dense)            (None, 1)                 21

 activation_60 (Activation)  (None, 1)                 0

=================================================================
Total params: 19,555
Trainable params: 19,555
Non-trainable params: 0
_________________________________________________________________
Epoch 1/10
7/7 [==============================] - 1s 8ms/step - loss: 0.6935 - accuracy: 0.4700
Epoch 2/10
7/7 [==============================] - 0s 10ms/step - loss: 0.6926 - accuracy: 0.5150
Epoch 3/10
7/7 [==============================] - 0s 9ms/step - loss: 0.6926 - accuracy: 0.5150
Epoch 4/10
7/7 [==============================] - 0s 9ms/step - loss: 0.6939 - accuracy: 0.5150
Epoch 5/10
7/7 [==============================] - 0s 8ms/step - loss: 0.6923 - accuracy: 0.4900
Epoch 6/10
7/7 [==============================] - 0s 8ms/step - loss: 0.6913 - accuracy: 0.4900
Epoch 7/10
7/7 [==============================] - 0s 6ms/step - loss: 0.6900 - accuracy: 0.5100
Epoch 8/10
7/7 [==============================] - 0s 14ms/step - loss: 0.6888 - accuracy: 0.5000
Epoch 9/10
7/7 [==============================] - 0s 7ms/step - loss: 0.6859 - accuracy: 0.5200
Epoch 10/10
7/7 [==============================] - 0s 6ms/step - loss: 0.6786 - accuracy: 0.5150
```
Out[86]:
```
<keras.callbacks.History at 0x7fc5d4ee8ac0>
```