```
In [0]: Lunzin attention zin
        Archive: attention.zip
          inflating: attention.py
In [0]: import warnings
        warnings.filterwarnings("ignore")
        import pandas as pd
        import matplotlib
        matplotlib.use(u'nbAgg')
        import matplotlib.pyplot as plt
        import seaborn as sns
        import numpy as np
        import pickle
        from sklearn import preprocessing
        from sklearn.model_selection import RandomizedSearchCV
        from sklearn.metrics import log_loss
        from sklearn.metrics import confusion matrix
        from sklearn.model selection import train test split
        %matplotlib inline
        from nltk.corpus import stopwords
        from gensim.scripts.glove2word2vec import glove2word2vec
        from tensorflow.keras.callbacks import EarlyStopping
        from tensorflow.keras.layers import Dropout, MaxPooling1D, Conv1D, Dense, LSTM, Drop
        from keras.preprocessing.text import Tokenizer
        from keras.preprocessing.sequence import pad sequences
        from tensorflow.keras.models import Model
        from attention import AttentionLayer
        from keras import backend as K
        from datetime import datetime
        from tensorflow import keras
```

Using TensorFlow backend.

## In [0]: from google.colab import drive drive mount('/content/drive')

Go to this URL in a browser: https://accounts.google.com/o/oauth2/auth?client\_id=947318989803-6bn6qk8qdgf4n4g3pfee6491hc0brc4i.apps.googleusercontent.com&re direct\_uri=urn%3aietf%3awg%3aoauth%3a2.0%3aoob&response\_type=code&scope=email% 20https%3a%2f%2fwww.googleapis.com%2fauth%2fdrive%20https%3a%2f%2fwww.googleapis.com%2fauth%2fdrive.ph otos.readonly%20https%3a%2f%2fwww.googleapis.com%2fauth%2fdrive.ph otos.readonly%20https%3a%2f%2fwww.googleapis.com%2fauth%2fpeopleapi.readonly (https://accounts.google.com/o/oauth2/auth?client\_id=947318989803-6bn6qk8qdgf4 n4g3pfee6491hc0brc4i.apps.googleusercontent.com&redirect\_uri=urn%3aietf%3awg%3 aoauth%3a2.0%3aoob&response\_type=code&scope=email%20https%3a%2f%2fwww.googleapis.com%2fauth%2fdcs.test%20https%3a%2f%2fwww.googleapis.com%2fauth%2fdrive%20 https%3a%2f%2fwww.googleapis.com%2fauth%2fdrive.photos.readonly%20https%3a%2f%2fwww.googleapis.com%2fauth%2fdrive.photos.readonly%20https%3a%2f%2fwww.googleapis.com%2fauth%2fpeopleapi.readonly)

```
Enter your authorization code:
.....
Mounted at /content/drive
```

```
In [0]: Unin install ftfv
             Collecting ftfy
                Downloading https://files.pythonhosted.org/packages/ec/d8/5e877ac5e827eaa41a
             7ea8c0dc1d3042e05d7e337604dc2aedb854e7b500/ftfy-5.7.tar.gz (https://files.pyth
             onhosted.org/packages/ec/d8/5e877ac5e827eaa41a7ea8c0dc1d3042e05d7e337604dc2aed
             b854e7b500/ftfy-5.7.tar.gz) (58kB)
                                                                      | 61kB 4.8MB/s eta 0:00:011
             Requirement already satisfied: wcwidth in /usr/local/lib/python3.6/dist-packag
             es (from ftfy) (0.1.9)
             Building wheels for collected packages: ftfy
                Building wheel for ftfy (setup.py) ... done
                Created wheel for ftfy: filename=ftfy-5.7-cp36-none-any.whl size=44593 sha25
             6=35a2c77a50de87df517e4eb3be30e85e3ff5b58fcd9c6c209a7d84f491634bdf
                Stored in directory: /root/.cache/pip/wheels/8e/da/59/6c8925d571aacade638a0f
             515960c21c0887af1bfe31908fbf
             Successfully built ftfy
             Installing collected packages: ftfy
             Successfully installed ftfy-5.7
In [0]: ne="Zozibini Tunzi from South Africa has been crowned Miss Universe 2019 at the
In [0]: df=nd DataFrame()
In [0]: df = df annend({'news': nel innore index=True})
In [0]:
             import ftfy
             from tqdm import tqdm_notebook
             news = []
             for i in tqdm notebook(df.news):
                   title = ftfy.fix text(i)
                   news annend(title)
             HBox(children=(FloatProgress(value=0.0, max=1.0), HTML(value='')))
In [0]: stopwords= ['i', 'me', 'my', 'myself', 'we', 'our', 'ours', 'ourselves', 'you'
   "you'll", "you'd", 'your', 'yours', 'yourself', 'yourselves', 'he'
   'she', "she's", 'her', 'hers', 'herself', 'it', "it's", 'its',
   'theirs', 'themselves', 'what', 'which', 'who', 'whom', 'this',
   'am', 'is', 'are', 'was', 'were', 'be', 'been', 'being', 'have', 'had', 'as',
   'did', 'doing', 'a', 'an', 'the', 'and', 'but', 'if', 'or', 'because'
   'at', 'by', 'for', 'with', 'about', 'against', 'between', 'into'
   'above', 'below', 'to', 'from', 'up', 'down', 'in', 'out', 'on',
   'then', 'once', 'here', 'there', 'when', 'where', 'why', 'how',
   'most', 'other', 'some', 'such', 'only', 'own', 'same', 'so', 'than'
   's' 't' 'can' 'will' 'just' 'would']
```

```
In [0]:
          import re
          def decontracted(phrase):
            # specific
            phrase = re.sub(r"won't", "will not", phrase)
            phrase = re.sub(r"can\'t", "can not", phrase)
            # general
            phrase = re.sub(r"n\'t", " not", phrase)
            phrase = re.sub(r ii\ t , iiot , pin ase)
phrase = re.sub(r"\'re", " are", phrase)
phrase = re.sub(r"\'s", " is", phrase)
phrase = re.sub(r"\'d", " would", phrase)
            phrase = re.sub(r"\'ll", " would", phrase)
phrase = re.sub(r"\'l", " will", phrase)
phrase = re.sub(r"\'t", " not", phrase)
phrase = re.sub(r"\'ve", " have", phrase)
phrase = re.sub(r"\'m", " am", phrase)
return phrase
            return phrase
          from tadm import tadm notebook
          preprocessed2 = []
          # tqdm is for printing the status bar
          for sentance in tqdm_notebook(df['news'].values):
            sent = decontracted(sentance)
            sent = sent.replace('\\r', ' ')
sent = sent.replace('\\"', ' ')
sent = sent.replace('\\"', ' ')
            sent = re.sub('[^A-Za-z0-9]+', ' ', sent)
          # https://gist.github.com/sebleier/554280
            sent = ' '.join(e for e in sent.split() if e.lower() not in stopwords)
            preprocessed2.append(sent.lower().strip())
          df[ nows 1 1-nranracesed2
          HBox(children=(FloatProgress(value=0.0, max=1.0), HTML(value='')))
In [0]: from keras.preprocessing.text import Tokenizer
          from keras preprocessing sequence import had sequences
In [0]: | s=Tokenizer()
          h-Tokenizer()
In [0]: import pickle
          with open('/content/drive/My Drive/2 word index.pickle', 'rb') as handle:
              s.word_index = pickle.load(handle)
          with open('/content/drive/My Drive/2_word_index_h.pickle', 'rb') as handle:
              h.word index = pickle.load(handle)
In [0]: with open('/content/drive/My Drive/2_index_word.pickle', 'rb') as handle:
               s.index_word = pickle.load(handle)
          with open('/content/drive/My Drive/2_index_word_h.pickle', 'rb') as handle:
               h index word = nickle load(handle)
In [0]:
In [0]: Y tast-df['nows'] values
In [0]: vocab_size = len(s.word_index) + 1 # for index zero we have to add +1
          encoded_docs_test = s.texts_to_sequences(X_test)
          max length = 70
          nadded docs test = nad sequences(encoded docs test _maxlen=max length _nadding=
In [0]: |y_vocab_size = len(h.word_index) + 1
```

```
In [0]: !wget --header="Host: storage.googleapis.com" --header="User-Agent: Mozilla/5.0
        --2020-05-31 03:48:11-- https://storage.googleapis.com/kaggle-data-sets/21360
        9%2F464671%2Fbundle%2Farchive.zip?GoogleAccessId=qcp-kaggle-com@kaggle-161607.
        iam.gserviceaccount.com&Expires=1591012919&Signature=kB84eyomS%2BeCmatiYxl9E7
        o%2BVGPkC4sawDoq%2Bpiml2PTNq0X8wI7PFAt2cqKrDWG0vmuqhbxd60w5ZSg%2FmMF0qVg8cJVVu
        Fi06cFhm3qHkXjNIyCXsNJE4Y0dzoasnJ7rELXN99CbnGJmtatKVR4QHH%2Fp9Tut10t%2Bsa%2FaS
        VYl0vc8I%2FS89NYG1nbsrJRJx4Yx9dAYPMqDTvvo0RUI5USacVMuVEb1SWiNYZv%2FYr%2B1DiJ2Z
        hJOqr3NUe6v1DcP1qx2qBjAAq3AoB08jJKNCMtQ9N48LJA9J82jdF%2BZcq%2BNhBxoM0XsD%2Bv%2
        BVOwaZ%2FbCwIfP8VFauXjew7TA31%2FMysiEA%3D%3D (https://storage.googleapis.com/k
        aggle-data-sets/213609%2F464671%2Fbundle%2Farchive.zip?GoogleAccessId=gcp-kagg
        le-com@kaggle-161607.iam.gserviceaccount.com&Expires=1591012919&Signature=kB84
        eyomS%2BeCmatiYxl9E7o%2BVGPkC4sawDog%2Bpiml2PTNg0X8wI7PFAt2cqKrDWG0vmuqhbxd60w
        5ZSg%2FmMF0qVg8cJVVuFi06cFhm3qHkXjNIyCXsNJE4Y0dzoasnJ7rELXN99CbnGJmtatKVR4QHH%
        2Fp9Tut10t%2Bsa%2FaSVYl0yc8I%2FS89NYG1nbsrJRJx4Yx9dAYPMqDTvvo0RUI5USacVMuVEb1S
        WjNYZv%2FYr%2B1DjJ2ZhJ0gr3NUe6v1DcP1qx2gBjAAq3AoB08jJKNCMtQ9N48LJA9J82jdF%2BZc
        g%2BNhBxoMOXsD%2Bv%2BVOwaZ%2FbCwIfP8VFauXjew7TA31%2FMysiEA%3D%3D)
        Resolving storage.googleapis.com (storage.googleapis.com)... 108.177.126.128,
        2a00:1450:4013:c08::80
        Connecting to storage.googleapis.com (storage.googleapis.com)|108.177.126.12
        81:443... connected.
        HTTP request sent, awaiting response... 200 OK
        Length: 1928408067 (1.8G) [application/zip]
        Saving to: '213609_464671_bundle_archive.zip'
        213609 464671 bundl 100%[============]
                                                         1.80G 70.6MB/s
                                                                             in 28s
        2020-05-31 03:48:40 (65.2 MB/s) - '213609 464671 bundle archive.zip' saved [19
        28408067/19284080671
In [0]: Lunzin /content/213600 464671 hundle archive zin
        Archive: /content/213609_464671_bundle_archive.zip
          inflating: glove.42B.300d.txt
In [0]: from numpy import asarray
        from tqdm import tqdm notebook
        embeddings_index = dict()
        f = open('glove.42B.300d.txt')
        for line in tqdm notebook(f):
          values = line.split()
          word = values[0]
          coefs = asarray(values[1:], dtype='float32')
          embeddings index[word] = coefs
        HBox(children=(FloatProgress(value=1.0, bar_style='info', max=1.0), HTML(value
        ='')))
In [0]: from numpy import zeros
        input matrix = zeros((vocab size, 300))
        for word, i in tqdm_notebook(s.word_index.items()):
          embedding_vector = embeddings_index.get(word)
          if embedding vector is not None:
            innut matrix[i] = embedding vector
        HBox(children=(FloatProgress(value=0.0, max=104898.0), HTML(value='')))
```

```
In [0]:
           from numpy import zeros
           decoder_matrix = zeros((y_vocab_size, 300))
           for word, i in tqdm_notebook(h.word_index.items()):
             embedding vector = embeddings index.get(word)
             if embedding vector is not None:
               decoder matrix[i] = embedding vector
           HBox(children=(FloatProgress(value=0.0, max=44542.0), HTML(value='')))
  In [0]: from tensorflow.keras.models import model_from_json
           json_file = open('/content/drive/My Drive/model_gen_h.json', 'r')
           loaded_model_json = json_file.read()
           ison file.close()
           loaded_model = model_from_json(loaded_model_json, {'AttentionLayer': AttentionL
           loaded_model.load_weights("/content/drive/My Drive/model_gen_h.h5")
           print("Loaded model from disk")
           WARNING:tensorflow:Layer lstm will not use cuDNN kernel since it doesn't meet
           the cuDNN kernel criteria. It will use generic GPU kernel as fallback when run
           ning on GPU
           WARNING:tensorflow:Layer lstm will not use cuDNN kernel since it doesn't meet
           the cuDNN kernel criteria. It will use generic GPU kernel as fallback when run
           ning on GPU
           WARNING:tensorflow:Layer lstm will not use cuDNN kernel since it doesn't meet
           the cuDNN kernel criteria. It will use generic GPU kernel as fallback when run
           ning on GPU
           Loaded model from disk
           news word index=s.index word
  In [0]:
           headlines word index=h.index word
           tarnet headlines word index=h word index
  In [0]: lencoder input = loaded model input[0]
  In [0]: state h=loaded model.layers[5].output
           state c=loaded model.layers[6].output
  In [0]: encoder out f h out f cell out h out h cell out - loaded model layers[3] outp
  In [0]: encoder model = Model (inputs=encoder input outputs=[encoder out state h state
  In [0]: from tensorflow.keras.utils import plot model
           nlot model (encoder model to file='model nna'
                                                              chow change=True)
Out[102]:
                                                       input:
                                                             [(?, 70)]
                                       input_1: InputLayer
                                                             [(?, 70)]
                                                      output:
                                                               (?, 70)
                                                       input:
                                    embedding: Embedding
                                                       output:
                                                             (?, 70, 300)
                                                input:
                                                                   (?, 70, 300)
                  bidirectional(lstm): Bidirectional(LSTM)
                                                      [(?, 70, 600), (?, 300), (?, 300), (?, 300), (?, 300)]
                                               output:
                                      [(?, 300), (?, 300)]
                                                                           input:
                                                                                  [(?, 300), (?, 300)]
                               input:
            concatenate: Concatenate
                                                      concatenate_1: Concatenate
                                         (?, 600)
                                                                                     (?, 600)
                               output:
                                                                           output:
```

```
In [0]:
              decoder_input_h = Input(shape=(600,))
               decoder_input_c = Input(shape=(600,))
               decoder_hidden_state = Input(shape=(70,600))
               decoder input = loaded model.layers[2].output
               dec emb2 = loaded model.layers[4].output
              decoder_outputs2, state_h2, state_c2 = loaded_model.layers[7](dec_emb2,initial_
attn_out_inf, attn_states_inf = loaded_model.layers[8]([decoder_hidden_state,de
               decoder inf concat = loaded model.layers[9]([decoder outputs2,attn out inf])
               decoder outputs2 = loaded model.layers[10](decoder inf concat)
               decoder model = Model(
                    [decoder input] + [decoder hidden state, decoder input h, decoder input c],[
               plot model(decoder model, to file='model.png', show shapes=True)
Out[176]:
                                        input: [(?, ?)]
                       input_2: InputLayer
                                       output: [(?, ?)]
                                         input:
                                                 (?, ?)
                                                                             input: [(?, 600)]
                                                                                                                input: [(?, 600)]
                   embedding_1: Embedding
                                                           input_28: InputLayer
                                                                                              input_29: InputLayer
                                               (?, ?, 300)
                                                                                   [(?, 600)]
                                                                                                                       [(?, 600)]
                                                                            output:
                                                                                                                output:
                                        output:
                                        [(?, 70, 600)]
                                                                         [(?, ?, 300), (?, 600), (?, 600)]
                input_30: InputLayer
                                                      lstm 1: LSTM
                                 output:
                                        [(?, 70, 600)]
                                                                   output:
                                                                         [(?, ?, 600), (?, 600), (?, 600)]
                                              input:
                                                    [(?, 70, 600), (?, ?, 600)]
                      attention_layer: AttentionLayer
                                                     ((?, ?, 600), (?, ?, 70))
                                             output:
                                                           input:
                                                                 [(?, ?, 600), (?, ?, 600)]
                                      concat_layer: Concatenate
                                                                      (?, ?, 1200)
                                                           output:
                                                                             (?, ?, 1200)
                                                                       input:
                                  time_distributed(dense): TimeDistributed(Dense)
                                                                      output: (?, ?, 44543)
```

```
In [0]:
          #https://machinelearningmastery.com/encoder-decoder-attention-sequence-to-seque
          #https://towardsdatascience.com/light-on-math-ml-attention-with-keras-dc8dbc1fa
          def decode sequence(input seq):
              # Encode the input as state vectors.
              e out, e h, e c = encoder model.predict(input seq)
              # Generate empty target sequence of length 1.
              seq = np.zeros((1,1))
              # Populate the first word of target sequence with the start word.
              seq[0, 0] = target headlines word index['ssttaarrtt']
              stop_condition = False
              decoded sentence = '
              while not stop condition:
                  output, h, c = decoder model.predict([seq] + [e out, e h, e c])
                  token_index = np.argmax(output[0, -1, :])
                  try:
                    token = headlines_word_index[token_index]
                    if(token!='eenndd'):
                      decoded_sentence += ' '+token
                  # Exit condition: either hit max length or find stop word.
                    if (token == 'eenndd' or len(decoded sentence.split()) >= (20-1)):
                      stop condition = True
                  except:
                  # Update the target sequence (of length 1).
                  seq = np.zeros((1,1))
                  seq[0, 0] = token index
                  # Update internal states
                  e_h, e_c = h, c
              return decoded sentence
 In [0]: | def headlines(input_seq):
              s=' '
              for i in input_seq:
                  if((i!=0 and i!=target_headlines_word_index['ssttaarrtt']) and i!=targe
                      s=s+headlines_word_index[i]+'
              return s
          def news(input_seq):
              s=' '
              for i in input_seq:
                  if(i!=0):
                      s=s+news_word_index[i]+' '
              return s
 In [0]: decode sequence(nadded docs test[0] reshape(1 70))
Out[181]: ' south africa zozibini tunzi crowned miss universe 2019'
 In [0]:
```