



In [ ]: ▶

```

1  #*****
2  #
3  #           Project : Language Translation from English to French
4  #
5  #*****
6  # Helper Functions
7
8  import os
9  import pickle
10 import copy
11 import numpy as np
12 import tensorflow as tf
13
14 # Codes set for Padding, End of Sentence, Unknown word and Go for Starting the new Sentence
15 CODES = {'<PAD>': 0, '<EOS>': 1, '<UNK>': 2, '<GO>': 3 }
16
17
18 # Loading the Data from the File
19 def load_data(path):
20     """
21     Load Dataset from File
22     """
23     input_file = os.path.join(path)
24     with open(input_file, 'r', encoding='utf-8') as f:
25         data = f.read()
26
27
28     return data
29
30
31 # Function to Load the Data from the Source Language File , Target Language File,
32 # Preprocessing the Data by making it lowercase, and converting it to numeric
33 # Saving the Data in Preprocess File
34 def preprocess_and_save_data(source_path, target_path, text_to_ids):
35     """
36     Preprocess Text Data. Save to file.
37     """
38     # Preprocess
39     source_text = load_data(source_path)
40     target_text = load_data(target_path)
41     print('-'*80, "\n Loading the data from files \n")

```

```
42
43     source_text = source_text.lower()
44     target_text = target_text.lower()
45
46     source_vocab_to_int, source_int_to_vocab = create_lookup_tables(source_text)
47     target_vocab_to_int, target_int_to_vocab = create_lookup_tables(target_text)
48
49     print("Creating the Lookup for Source and Target Files\n")
50
51     source_text, target_text = text_to_ids(source_text, target_text, source_vocab_to_int, target_vocab_to_int)
52
53     # Save Data
54     pickle.dump((
55         (source_text, target_text),
56         (source_vocab_to_int, target_vocab_to_int),
57         (source_int_to_vocab, target_int_to_vocab)), open('preprocess.p', 'wb'))
58
59
60     def load_preprocess():
61         """
62         Load the Preprocessed Training data and return them in batches of <batch_size> or less
63         """
64         return pickle.load(open('preprocess.p', mode='rb'))
65
66
67     def create_lookup_tables(text):
68         """
69         Create lookup tables for vocabulary
70         """
71         vocab = set(text.split())
72         vocab_to_int = copy.copy(CODES)
73
74
75         for v_i, v in enumerate(vocab, len(CODES)):
76             vocab_to_int[v] = v_i
77
78         int_to_vocab = {v_i: v for v, v_i in vocab_to_int.items()}
79
80         return vocab_to_int, int_to_vocab
81
82
83     def save_params(params):
```

```
84     """
85     Save parameters to file
86     """
87     pickle.dump(params, open('params.p', 'wb'))
88
89
90 def load_params():
91     """
92     Load parameters from file
93     """
94     return pickle.load(open('params.p', mode='rb'))
95
96
97 def batch_data(source, target, batch_size):
98     """
99     Batch source and target together
100    """
101    for batch_i in range(0, len(source)//batch_size):
102        start_i = batch_i * batch_size
103        source_batch = source[start_i:start_i + batch_size]
104        target_batch = target[start_i:start_i + batch_size]
105        yield np.array(pad_sentence_batch(source_batch)), np.array(pad_sentence_batch(target_batch))
106
107
108 def pad_sentence_batch(sentence_batch):
109     """
110     Pad sentence with <PAD> id
111     """
112     max_sentence = max([len(sentence) for sentence in sentence_batch])
113     return [sentence + [CODES['<PAD>']] * (max_sentence - len(sentence))
114             for sentence in sentence_batch]
115
116
117
```

```
In [ ]: 1 # Load data, from the Source File (english) and the Target file (French)
2
3 source_path = 'data/small_vocab_en.txt'
4 target_path = 'data/small_vocab_fr.txt'
5 source_text = load_data(source_path)
6 target_text = load_data(target_path)
```

## Explore the Data

Play around with `view_sentence_range` to view different parts of the data.

```
In [ ]: 1 view_sentence_range = (0, 7)
2
3 import numpy as np
4
5 print('Dataset Stats')
6 print('Roughly the number of unique words: {}'.format(len({word: None for word in source_text.split()})))
7
8 sentences = source_text.split('\n')
9 word_counts = [len(sentence.split()) for sentence in sentences]
10
11 print('Number of sentences: {}'.format(len(sentences)))
12 print('Average number of words in a sentence: {}'.format(np.average(word_counts)))
13
14 print()
15 print('English sentences {} to {}'.format(*view_sentence_range))
16 print('\n'.join(source_text.split('\n')[view_sentence_range[0]:view_sentence_range[1]]))
17 print()
18 print('French sentences {} to {}'.format(*view_sentence_range))
19 print('\n'.join(target_text.split('\n')[view_sentence_range[0]:view_sentence_range[1]]))
```

## Solution

# Implement Preprocessing Function

## Text to Word Ids

As you did with other RNNs, you must turn the text into a number so the computer can understand it. In the function `text_to_ids()`, you'll turn `source_text` and `target_text` from words to ids. However, you need to add the `<EOS>` word id at the end of each sentence from `target_text`. This will help the neural network predict when the sentence should end.

You can get the `<EOS>` word id by doing:

```
target_vocab_to_int['<EOS>']
```

You can get other word ids using `source_vocab_to_int` and `target_vocab_to_int`.

```

In [ ]: 1 # Defining the Function to convert the Text in the source and target files into Id
        2 # In this function , for each line in the file , we replace the word with integer
        3
        4 def text_to_ids(source_text, target_text, source_vocab_to_int, target_vocab_to_int):
        5     """
        6     Convert source and target text to proper word ids
        7     :param source_text: String that contains all the source text.
        8     :param target_text: String that contains all the target text.
        9     :param source_vocab_to_int: Dictionary to go from the source words to an id
       10     :param target_vocab_to_int: Dictionary to go from the target words to an id
       11     :return: A tuple of lists (source_id_text, target_id_text)
       12     """
       13     # List for Source Text sentences. This will be 2 D List
       14     source_id_text = []
       15     for i, line in enumerate(source_text.split('\n')):
       16         source_id_text.append([])
       17         for word in line.split():
       18             source_id_text[i].append(source_vocab_to_int[word])
       19     print(" The Number of Lines in Source File : ",(i+1))
       20
       21     # adding the EOS word id after each target Sentence
       22     target_id_text = []
       23     for i, line in enumerate(target_text.split('\n')):
       24         target_id_text.append([])
       25         for word in line.split():
       26             target_id_text[i].append(target_vocab_to_int[word])
       27         target_id_text[i].append(target_vocab_to_int['<EOS>'])
       28
       29     print(" The Number of Lines in Target File : ",(i+1))
       30     print(" Replacing the Words with Integers in the Files\n")
       31     return (source_id_text, target_id_text)
       32
       33
       34

```

## Preprocess all the data and save it

Running the code cell below will preprocess all the data and save it to file.

```
In [ ]: 1 # Perprocessing the Data from the source and target files and storing the numeric version
        2 # to file with parameters
        3 preprocess_and_save_data(source_path,target_path,text_to_ids)
```

```
In [ ]: 1 # Loading the numeric version of source and output file from the preprocessed the file
        2
        3 import numpy as np
        4
        5
        6 (source_int_text, target_int_text), (source_vocab_to_int, target_vocab_to_int), _ = load_preprocess()
```

```
In [ ]: 1 # the Unique words in Source and Target Files
        2 print(" The Unique Words in Source and Target Files \n",'-'*80)
        3 print(len(source_vocab_to_int))
        4 print(len(target_vocab_to_int))
        5
        6 # The total sentences in Source and Target Files
        7 print(" The sentences in Source and Target Files \n",'-'*80)
        8 print(len(source_int_text))
        9 print(len(target_int_text))
```

## Build the Neural Network

You'll build the components necessary to build a Sequence-to-Sequence model by implementing the following functions below:

- model\_inputs
- process\_decoding\_input
- encoding\_layer
- decoding\_layer\_train
- decoding\_layer\_infer
- decoding\_layer
- seq2seq\_model



## Input

Implement the `model_inputs()` function to create TF Placeholders for the Neural Network. It should create the following placeholders:

- Input text placeholder named "input" using the TF Placeholder name parameter with rank 2.
- Targets placeholder with rank 2.
- Learning rate placeholder with rank 0.
- Keep probability placeholder named "keep\_prob" using the TF Placeholder name parameter with rank 0.

**As Tensorflow version 1.12 needs more variables , Returning the placeholders in the following the tuple (Input, Targets, Learning Rate, Keep Probability, Target Seq Length, max Target Length, Source Sequence Length )**

```
In [ ]: 1 # Defining a function to create Placeholders for Input,Output
2 # and other hyperparameters(learning rate, Keep Probability)
3 # Also The APIs with 1.12 version of tensorflow , needs additional parameters like
4 # target_sequence_length, max_target_length and source_sequence_length , hence creating Placeholders
5 # for them
6
7 def model_inputs():
8     """
9     Create TF Placeholders for input, targets, learning rate,keep Probability
10    return: Tuple (input, targets, learning rate, keep probability,target_sequence_length
11    max_target_len,source_sequence_length)
12    """
13    # Placeholder for inputs,targets,learning rate and Keep probability
14    inputs = tf.placeholder(tf.int32, shape=[None,None], name= "input")
15    targets = tf.placeholder(tf.int32, shape=[None,None], name= "targets")
16    learn_rate = tf.placeholder(tf.float32, name= "learning_rate")
17    keep_prob = tf.placeholder(tf.float32, name= "keep_prob")
18
19
20    target_seq_lenth = tf.placeholder(tf.int32, shape=[None], name= "target_sequence_length")
21    max_target_len = tf.reduce_max(target_seq_lenth, name= 'max_target_len')
22    source_seq_length = tf.placeholder(tf.int32, shape=[None], name= "source_sequence_length")
23
24    return (inputs, targets, learn_rate, keep_prob,target_seq_lenth,max_target_len,source_seq_length)
25
```

## Process Decoding Input

Implement `process_decoding_input` using TensorFlow to remove the last word id from each batch in `target_data` and concat the GO ID to the beginning of each batch.

```
In [ ]: 1 # function to process the Decoding Input , where in the last eOS word is removed
        2 # and GO Id is added at the beginning of the sentence
        3
        4 def process_decoding_input(target_data, target_vocab_to_int, batch_size):
        5     """
        6     Preprocessing the target data for encoding
        7     :param target_data: Target Placeholder
        8     :param target_vocab_to_int: Dictionary to go from the target words to an id
        9     :param batch_size: Batch Size
       10     :return: Preprocessed target data
       11     """
       12     # Create a constant tensor with the 'go id'.
       13
       14     go_id = tf.constant(target_vocab_to_int['<GO>'], shape=(batch_size,1), dtype=tf.int32)
       15
       16     # Concatenate the vector (without the last word id <EOS> ) with the go ids vector
       17     processed_input = tf.concat([go_id,target_data[:,-1]],1)
       18
       19     return processed_input
```

## Encoding

Implement `encoding_layer()` to create a Encoder RNN layer using `tf.nn.dynamic_rnn()`.  
([https://www.tensorflow.org/api\\_docs/python/tf/nn/dynamic\\_rnn](https://www.tensorflow.org/api_docs/python/tf/nn/dynamic_rnn)).

```

In [ ]: 1 # Function to create an Encoder RNN
2
3 def encoding_layer(rnn_inputs, rnn_size, num_layers, keep_prob,
4                   source_vocab_size,
5                   encoding_embedding_size):
6     """
7     Create encoding layer
8     :param rnn_inputs: Inputs for the RNN
9     :param rnn_size: RNN Size
10    :param num_layers: Number of layers
11    :param keep_prob: Dropout keep probability
12    :param source_vocab_size: vocabulary size of source data
13    :param encoding_embedding_size: embedding size of source data
14    """
15    # function to Build the lstm cell based on the size, and then wrap in dropout
16    def build_cell(rnn_size, keep_prob):
17        lstm = tf.contrib.rnn.LSTMCell(rnn_size)
18        lstm_drop = tf.contrib.rnn.DropoutWrapper(lstm, output_keep_prob=keep_prob)
19        return lstm_drop
20
21    # Stack the LSTM cells to create a stacked lstm
22    stacked_lstm = tf.contrib.rnn.MultiRNNCell([build_cell(rnn_size, keep_prob) for _ in range(num_layers)])
23
24    # Create embedding layer.
25    embed_encoder = tf.contrib.layers.embed_sequence(rnn_inputs, vocab_size = source_vocab_size, embed_dim = encoding_embedding_size)
26
27    # calling the dynamic RNN
28    # If we don't have an initial zero state, provide a dtype.
29    output, state = tf.nn.dynamic_rnn(stacked_lstm, embed_encoder, dtype=tf.float32)
30    return (output, state)

```

## Decoding - Training

Create training logits using `tf.contrib.seq2seq.simple_decoder_fn_train()`.

([https://www.tensorflow.org/api\\_docs/python/tf/contrib/seq2seq/simple\\_decoder\\_fn\\_train](https://www.tensorflow.org/api_docs/python/tf/contrib/seq2seq/simple_decoder_fn_train)) and `tf.contrib.seq2seq.dynamic_rnn_decoder()`.

([https://www.tensorflow.org/api\\_docs/python/tf/contrib/seq2seq/dynamic\\_rnn\\_decoder](https://www.tensorflow.org/api_docs/python/tf/contrib/seq2seq/dynamic_rnn_decoder)). Apply the `output_fn` to the

`tf.contrib.seq2seq.dynamic_rnn_decoder()`. ([https://www.tensorflow.org/api\\_docs/python/tf/contrib/seq2seq/dynamic\\_rnn\\_decoder](https://www.tensorflow.org/api_docs/python/tf/contrib/seq2seq/dynamic_rnn_decoder)) outputs.

**Please note :This API's were available with version 1.0 , but with the tensorflow version 1.12 , these API's have been changed and hence new API's implemented instead**

```
In [ ]: 1 # creating a Decoding Function
2 # Please Note : The simple_Decoder_fn_train function was in 1.0 TF version , but has been replaced
3 # by BasicDecoder, so hence used here
4
5 def decoding_layer_train(encoder_state, dec_cell, dec_embed_input,
6                           target_sequence_length, max_summary_length,
7                           output_fn, keep_prob):
8     """
9     Create a decoding layer for training
10    :param encoder_state: Encoder State
11    :param dec_cell: Decoder RNN Cell
12    :param dec_embed_input: Decoder embedded input
13    :param target_sequence_length: The lengths of each sequence in the target batch
14    :param max_summary_length: The length of the longest sequence in the batch
15    :param output_fn: Function to apply the output fn
16    :param keep_prob: Dropout keep probability
17    :return: BasicDecoderOutput containing training logits and sample_id
18    """
19    # TODO: Implement Function
20    trainig_helper = tf.contrib.seq2seq.TrainingHelper(dec_embed_input, target_sequence_length)
21    basic_decoder = tf.contrib.seq2seq.BasicDecoder(dec_cell, trainig_helper, encoder_state, output_fn)
22    train_logits, _, _ = tf.contrib.seq2seq.dynamic_decode(basic_decoder, maximum_iterations=max_summary_length)
23    return train_logits
24
25
```

## Decoding - Inference

Create inference logits using `tf.contrib.seq2seq.simple_decoder_fn_inference()`.

([https://www.tensorflow.org/api\\_docs/python/tf/contrib/seq2seq/simple\\_decoder\\_fn\\_inference](https://www.tensorflow.org/api_docs/python/tf/contrib/seq2seq/simple_decoder_fn_inference)) and

`tf.contrib.seq2seq.dynamic_rnn_decoder()`. ([https://www.tensorflow.org/api\\_docs/python/tf/contrib/seq2seq/dynamic\\_rnn\\_decoder](https://www.tensorflow.org/api_docs/python/tf/contrib/seq2seq/dynamic_rnn_decoder)).

**Please Note : The above API's not available with version 1.12 , so instead latest API's used for this code**

```

In [ ]: 1 # function to create Decoding Inference
2
3 def decoding_layer_infer(encoder_state, dec_cell, dec_embeddings, start_of_sequence_id,
4                           end_of_sequence_id, max_target_sequence_length,
5                           vocab_size, output_layer, batch_size, keep_prob):
6     """
7     Create a decoding layer for inference
8     :param encoder_state: Encoder state
9     :param dec_cell: Decoder RNN Cell
10    :param dec_embeddings: Decoder embeddings
11    :param start_of_sequence_id: GO ID
12    :param end_of_sequence_id: EOS Id
13    :param max_target_sequence_length: Maximum length of target sequences
14    :param vocab_size: Size of decoder/target vocabulary
15    :param decoding_scope: TensorFlow Variable Scope for decoding
16    :param output_layer: Function to apply the output layer
17    :param batch_size: Batch size
18    :param keep_prob: Dropout keep probability
19    :return: BasicDecoderOutput containing inference logits and sample_id
20    """
21    # Convert the start_ids to be a vector with batch size (the go id repeated batch size times)
22    start_ids = tf.tile([start_of_sequence_id], [batch_size])
23    # Create the embedding helper.
24    embedding_helper = tf.contrib.seq2seq.GreedyEmbeddingHelper(dec_embeddings, start_ids, end_of_sequence_id)
25    basic_decoder = tf.contrib.seq2seq.BasicDecoder(dec_cell, embedding_helper, encoder_state, output_layer)
26    Inference_logits, _, _ = tf.contrib.seq2seq.dynamic_decode(basic_decoder, maximum_iterations=max_target_seque
27
28    return Inference_logits
29

```

## Build the Decoding Layer

Implement `decoding_layer()` to create a Decoder RNN layer.

- Create RNN cell for decoding using `rnn_size` and `num_layers`.
- Create the output fuction using `lambda` (<https://docs.python.org/3/tutorial/controlflow.html#lambda-expressions>) to transform it's input, logits, to class logits.

- Use the your `decoding_layer_train(encoder_state, dec_cell, dec_embed_input, sequence_length, decoding_scope, output_fn, keep_prob)` function to get the training logits.
- Use your `decoding_layer_infer(encoder_state, dec_cell, dec_embeddings, start_of_sequence_id, end_of_sequence_id, maximum_length, vocab_size, decoding_scope, output_fn, keep_prob)` function to get the inference logits.

Note: You'll need to use `tf.variable_scope` ([https://www.tensorflow.org/api\\_docs/python/tf/variable\\_scope](https://www.tensorflow.org/api_docs/python/tf/variable_scope)) to share variables between training and inference.

Please note: new API's used as the above API's available with tensorflow version 1.0 , hence following new steps

- Created a RNN MultiCell with `rnn_size` and `num_layers`.
- Used Decoding Lookup Tables to get back the Decoded embedded input
- Used `Decoding_layer_train` to get training logits
- Used `DEcoding_layer_infer` to get Inference Logits
- Used `scope.reuse_Variables()` to reuse the variables between trainign and inference

In [ ]: ▶

```

1  # To Implement the Decoding Layer to create Decoder RNN Layer
2  from tensorflow.python.layers.core import Dense
3
4  def decoding_layer(dec_input, encoder_state,
5                    target_sequence_length, max_target_sequence_length,
6                    rnn_size,
7                    num_layers, target_vocab_to_int, target_vocab_size,
8                    batch_size, keep_prob, decoding_embedding_size):
9      """
10     Create decoding layer
11     :param dec_input: Decoder input
12     :param encoder_state: Encoder state
13     :param target_sequence_length: The lengths of each sequence in the target batch
14     :param max_target_sequence_length: Maximum length of target sequences
15     :param rnn_size: RNN Size
16     :param num_layers: Number of layers
17     :param target_vocab_to_int: Dictionary to go from the target words to an id
18     :param target_vocab_size: Size of target vocabulary
19     :param batch_size: The size of the batch
20     :param keep_prob: Dropout keep probability
21     :param decoding_embedding_size: Decoding embedding size
22     :return: Tuple of (Training BasicDecoderOutput, Inference BasicDecoderOutput)
23     """
24     # Using the same process as in the encoding layer.
25     def build_cell(rnn_size, keep_prob):
26         lstm = tf.contrib.rnn.LSTMCell(rnn_size)
27         lstm_drop = tf.contrib.rnn.DropoutWrapper(lstm, output_keep_prob=keep_prob)
28         return lstm_drop
29
30     # Stack them all
31     stacked_lstm = tf.contrib.rnn.MultiRNNCell([build_cell(rnn_size, keep_prob) for _ in range(num_layers)])
32
33     dec_embeddings = tf.Variable(tf.random_uniform([target_vocab_size, decoding_embedding_size]))
34     dec_embed_input = tf.nn.embedding_lookup(dec_embeddings, dec_input)
35
36     dense_layer = Dense(target_vocab_size,
37                        kernel_initializer = tf.truncated_normal_initializer(mean = 0.0, stddev=0.1))
38
39     with tf.variable_scope("decode") as scope:
40         tr_decoder_output = decoding_layer_train(
41             encoder_state, stacked_lstm, dec_embed_input,

```

```
42         target_sequence_length, max_target_sequence_length,
43         dense_layer, keep_prob)
44
45     # reusing the Variables being shared between training and inference phases
46     scope.reuse_variables()
47     inf_decoder_output = decoding_layer_infer(
48         encoder_state, stacked_lstm, dec_embeddings,
49         target_vocab_to_int['<GO>'], target_vocab_to_int['<EOS>'],
50         max_target_sequence_length, target_vocab_size,
51         dense_layer, batch_size, keep_prob)
52
53     return tr_decoder_output, inf_decoder_output
```

## Build the Neural Network

Apply the functions you implemented above to:

- Encode the input using your `encoding_layer(rnn_inputs, rnn_size, num_layers, keep_prob)`.
- Process target data using your `process_decoding_input(target_data, target_vocab_to_int, batch_size)` function.
- Apply embedding to the target data for the decoder.
- Decode the encoded input using your `decoding_layer(dec_embed_input, dec_embeddings, encoder_state, vocab_size, sequence_length, rnn_size, num_layers, target_vocab_to_int, keep_prob)`.



In [ ]: ▶

```

1  # building the sequence to Sequence Model
2
3  def seq2seq_model(input_data, target_data, keep_prob, batch_size,
4                    source_sequence_length, target_sequence_length,
5                    max_target_sentence_length,
6                    source_vocab_size, target_vocab_size,
7                    enc_embedding_size, dec_embedding_size,
8                    rnn_size, num_layers, target_vocab_to_int):
9      """
10     Build the Sequence-to-Sequence part of the neural network
11     :param input_data: Input placeholder
12     :param target_data: Target placeholder
13     :param keep_prob: Dropout keep probability placeholder
14     :param batch_size: Batch Size
15     :param source_sequence_length: Sequence Lengths of source sequences in the batch
16     :param target_sequence_length: Sequence Lengths of target sequences in the batch
17     :param source_vocab_size: Source vocabulary size
18     :param target_vocab_size: Target vocabulary size
19     :param enc_embedding_size: Decoder embedding size
20     :param dec_embedding_size: Encoder embedding size
21     :param rnn_size: RNN Size
22     :param num_layers: Number of layers
23     :param target_vocab_to_int: Dictionary to go from the target words to an id
24     :return: Tuple of (Training BasicDecoderOutput, Inference BasicDecoderOutput)
25     """
26     output, state = encoding_layer(input_data, rnn_size, num_layers, keep_prob,
27                                   source_vocab_size, enc_embedding_size)
28
29     processed_input = process_decoding_input(target_data, target_vocab_to_int, batch_size)
30
31     tr_decoder_output, inf_decoder_output = decoding_layer(processed_input, state,
32                                                            target_sequence_length, max_target_sentence_length,
33                                                            rnn_size, num_layers, target_vocab_to_int, target_vocab_size,
34                                                            batch_size, keep_prob, dec_embedding_size)
35
36     return tr_decoder_output, inf_decoder_output
37

```

## Neural Network Training

## Hyperparameters

Tune the following parameters:

- Set `epochs` to the number of epochs.
- Set `batch_size` to the batch size.
- Set `rnn_size` to the size of the RNNs.
- Set `num_layers` to the number of layers.
- Set `encoding_embedding_size` to the size of the embedding for the encoder.
- Set `decoding_embedding_size` to the size of the embedding for the decoder.
- Set `learning_rate` to the learning rate.
- Set `keep_probability` to the Dropout keep probability

```
In [ ]: 1 # setting the Hyperparameters
2
3 # Number of Epochs
4 epochs = 10
5
6 # Batch Size
7 batch_size = 512
8
9 # RNN Size
10 rnn_size = 128
11
12 # Number of Layers
13 num_layers = 2
14
15 # Embedding Size
16 encoding_embedding_size = 128
17 decoding_embedding_size = 128
18
19
20 # Learning Rate
21 learning_rate = 0.01
22
23 # Dropout Keep Probability
24 keep_probability = 0.5
25 display_step = True
```

## Build the Graph

Build the graph using the neural network you implemented.

```

In [ ]: ▶ 1 import tensorflow as tf
2
3 # Path for saving the checkpoints
4
5 save_path = 'checkpoints/dev'
6
7 # Loading the preprocessed source, targetfiles
8 (source_int_text, target_int_text), (source_vocab_to_int, target_vocab_to_int), _ = load_preprocess()
9
10 max_target_sentence_length = max([len(sentence) for sentence in source_int_text])
11
12 train_graph = tf.Graph()
13 with train_graph.as_default():
14     # getting the inputs
15     input_data, targets, lr, keep_prob, target_sequence_length, max_target_sequence_length, source_sequence_length
16
17     #sequence_length = tf.placeholder_with_default(max_target_sentence_length, None, name='sequence_length')
18     input_shape = tf.shape(input_data)
19
20     train_logits, inference_logits = seq2seq_model(tf.reverse(input_data, [-1]),
21                                                    targets,
22                                                    keep_prob,
23                                                    batch_size,
24                                                    source_sequence_length,
25                                                    target_sequence_length,
26                                                    max_target_sequence_length,
27                                                    len(source_vocab_to_int),
28                                                    len(target_vocab_to_int),
29                                                    encoding_embedding_size,
30                                                    decoding_embedding_size,
31                                                    rnn_size,
32                                                    num_layers,
33                                                    target_vocab_to_int)
34
35
36 training_logits = tf.identity(train_logits.rnn_output, name='logits')
37 inference_logits = tf.identity(inference_logits.sample_id, name='predictions')
38
39 masks = tf.sequence_mask(target_sequence_length, max_target_sequence_length, dtype=tf.float32, name='masks')
40
41

```

```
42     with tf.name_scope("optimization"):  
43         # Loss function  
44         cost = tf.contrib.seq2seq.sequence_loss(training_logits, targets, masks)  
45  
46         # Optimizer  
47         optimizer = tf.train.AdamOptimizer(lr)  
48  
49         # Gradient Clipping  
50         gradients = optimizer.compute_gradients(cost)  
51         capped_gradients = [(tf.clip_by_value(grad, -1., 1.), var) for grad, var in gradients if grad is not None]  
52         train_op = optimizer.apply_gradients(capped_gradients)
```

## Train

Train the neural network on the preprocessed data. If you have a hard time getting a good loss, check the forms to see if anyone is having the same problem.

```

In [ ]: 1 # Training the model
2
3 # funtion to get if prediction is accurate
4 def get_accuracy(target, logits):
5     """
6     Calculate accuracy
7     """
8     max_seq = max(target.shape[1], logits.shape[1])
9     if max_seq - target.shape[1]:
10         target = np.pad(
11             target,
12             [(0,0),(0,max_seq - target.shape[1])],
13             'constant')
14     if max_seq - logits.shape[1]:
15         logits = np.pad(
16             logits,
17             [(0,0),(0,max_seq - logits.shape[1])],
18             'constant')
19
20     return np.mean(np.equal(target, logits))
21
22 # Splitting the data to training and validation sets
23 train_source = source_int_text[batch_size:]
24 train_target = target_int_text[batch_size:]
25
26 valid_source = source_int_text[:batch_size]
27 valid_target = target_int_text[:batch_size]
28
29 (valid_sources_batch, valid_targets_batch ) = next(batch_data(valid_source,valid_target,batch_size))
30 # getting the target and source lengths for validation set
31 valid_targets_lengths = []
32 for sen in valid_targets_batch:
33     valid_targets_lengths.append(len(sen))
34
35 valid_sources_lengths = []
36 for sen in valid_sources_batch:
37     valid_sources_lengths.append(len(sen))
38
39
40
41 with tf.Session(graph=train_graph) as sess:

```

```
42 sess.run(tf.global_variables_initializer())
43
44 for epoch_i in range(epochs):
45     for batch_i, (source_batch, target_batch) in enumerate(batch_data(train_source, train_target, batch_size)):
46         # Need the lengths for the _lengths parameters
47         targets_lengths = []
48         for sen in target_batch:
49             targets_lengths.append(len(sen))
50
51         sources_lengths = []
52         for sen in source_batch:
53             sources_lengths.append(len(sen))
54
55
56         _, loss = sess.run([train_op, cost],
57                             {input_data: source_batch,
58                              targets: target_batch,
59                              lr: learning_rate,
60                              target_sequence_length: targets_lengths,
61                              source_sequence_length: sources_lengths,
62                              keep_prob: keep_probability})
63
64
65         if batch_i % display_step == 0 and batch_i > 0:
66
67             batch_train_logits = sess.run(inference_logits,
68                                             {input_data: source_batch,
69                                              source_sequence_length: sources_lengths,
70                                              target_sequence_length: targets_lengths,
71                                              keep_prob: 1.0})
72
73
74
75
76             batch_valid_logits = sess.run(inference_logits,
77                                             {input_data: valid_sources_batch,
78                                              source_sequence_length: valid_sources_lengths,
79                                              target_sequence_length: valid_targets_lengths,
80                                              keep_prob: 1.0})
81
82             train_acc = get_accuracy(target_batch, batch_train_logits)
83
```

```

84         valid_acc = get_accuracy(valid_targets_batch, batch_valid_logits)
85
86         print('Epoch {:>3} Batch {:>4}/{ } - Train Accuracy: {:>6.4f}, Validation Accuracy: {:>6.4f}, Loss
87               .format(epoch_i, batch_i, len(source_int_text) // batch_size, train_acc, valid_acc, loss))
88
89     # Save Model
90     saver = tf.train.Saver()
91     saver.save(sess, save_path)
92     print('Model Trained and Saved')

```

## Save Parameters

Save the `batch_size` and `save_path` parameters for inference.

```

In [ ]: 1 # save the parameters to be used later
        2 save_params(save_path)

```

```

In [ ]: 1 # Loading the parameters from the checkpoint
        2
        3 import tensorflow as tf
        4 import numpy as np
        5
        6 _, (source_vocab_to_int, target_vocab_to_int), (source_int_to_vocab, target_int_to_vocab) = load_preprocess()
        7 load_path = load_params()

```

## Sentence to Sequence

To feed a sentence into the model for translation, you first need to preprocess it. Implement the function `sentence_to_seq()` to preprocess new sentences.

- Convert the sentence to lowercase
- Convert words into ids using `vocab_to_int`
  - Convert words not in the vocabulary, to the `<UNK>` word id.



```
In [ ]: ▶ 1 # Function to preprocess the sentence in English Language
          2
          3 def sentence_to_seq(sentence, vocab_to_int):
          4     """
          5     Convert a sentence to a sequence of ids
          6     :param sentence: String
          7     :param vocab_to_int: Dictionary to go from the words to an id
          8     :return: List of word ids
          9     """
         10     lower_case_words = [word.lower() for word in sentence.split()]
         11
         12     word_id = [vocab_to_int.get(word, vocab_to_int['<UNK>']) for word in lower_case_words]
         13
         14     return word_id
```

## Translate

This will translate `translate_sentence` from English to French.

In [ ]: ▶

```

1  # To check if the model is translating the sentence
2  translate_sentence = 'it is cold in winter but summer somtimes hot .'
3
4
5  """
6  DON'T MODIFY ANYTHING IN THIS CELL
7  """
8  translate_sentence = sentence_to_seq(translate_sentence, source_vocab_to_int)
9
10 loaded_graph = tf.Graph()
11 with tf.Session(graph=loaded_graph) as sess:
12     # Load saved model
13     loader = tf.train.import_meta_graph(load_path + '.meta')
14     loader.restore(sess, load_path)
15
16     input_data = loaded_graph.get_tensor_by_name('input:0')
17     logits = loaded_graph.get_tensor_by_name('predictions:0')
18
19     target_sequence_length = loaded_graph.get_tensor_by_name('target_sequence_length:0')
20     source_sequence_length = loaded_graph.get_tensor_by_name('source_sequence_length:0')
21
22     keep_prob = loaded_graph.get_tensor_by_name('keep_prob:0')
23
24     translate_logits = sess.run(logits, {input_data: [translate_sentence]*batch_size,
25                                         target_sequence_length: [len(translate_sentence)*2]*batch_size,
26                                         source_sequence_length: [len(translate_sentence)*batch_size,
27                                         keep_prob: 1.0}))[0]
28
29 print('Input')
30 print('  Word Ids:      {}'.format([i for i in translate_sentence]))
31 print('  English Words: {}'.format([source_int_to_vocab[i] for i in translate_sentence]))
32
33 print('\nPrediction')
34 print('  Word Ids:      {}'.format([i for i in translate_logits]))
35 print('  French Words: {}'.format(" ".join([target_int_to_vocab[i] for i in translate_logits])))

```

