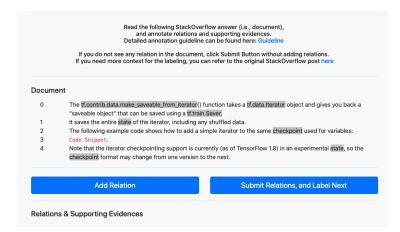
### 1. Workflow Overview

- 1. Read the annotation guideline, and set up the annotation tool [details]
- 2. For each document,
  - a. Read the full document, while focusing on ML keywords that are highlighted in the document.
  - b. Find and annotate relations of ML keywords: look for *is\_compared\_with* relations involving at least one of the keywords [details], and annotate them [details]
  - c. Find and annotate supporting evidence: for each relation annotation, find all the sentences describing the relational fact (i.e., supporting evidence) [details].

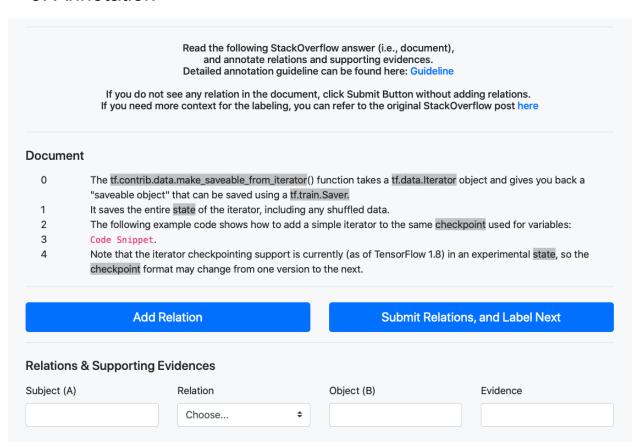
# 2. Annotation Tool Set-up

- 1. First, setup localhost on your machine if you haven't already.
  - a. If you have not done this step before,
    - [mac] refer to this page, and follow the instructions until the chapter "Create Sites Folder": <a href="https://websitebeaver.com/set-up-localhost-on-macos-high-sierra-apache-mysgl-and-php-7-with-sslhttps">https://websitebeaver.com/set-up-localhost-on-macos-high-sierra-apache-mysgl-and-php-7-with-sslhttps</a>
    - [Windows 10] refer to this page, and follow the chapter "Configuring PHP on IIS": https://stackify.com/how-to-host-php-on-windows-with-iis/
- 2. Unzip the tool at localhost root
  - i. if you followed the link above, /Users/[username]/Sites/ for mac, and C:\intepub\wwwroot\ for Windows 10.
- Open your web browser, and go to <a href="http://localhost/REAnnotationTool/re\_index.php?workerld=annotator1&taskId=0&documentId=0">http://localhost/REAnnotationTool/re\_index.php?workerld=annotator1&taskId=0&documentId=0</a>
- 4. You'll see a document and buttons like below.



- 5. Try annotating one document, and click the Submit button. The tool will save your annotation under the "re\_labeling\_result" folder.
  - i. If the tool has successfully saved your annotation, now you are good to start annotation.
  - ii. If you don't see any new text file generated under the folder, contact the researcher for troubleshooting.

### 3. Annotation



- a. Before you annotate anything, please read the whole document focusing on the ML keywords highlighted in the document.
  - "Code Snippet" in the document indicates places where the original Stack Overflow post had a (here omitted) code snippet.
  - ii. If you need more context, you can refer to the original Stack Overflow post. You can open the post by clicking the link ("here") at the top of the page.
- b. When you're ready to annotate, click the "Add Relation" button or press "esc". Then you'll see text input boxes and a dropdown menu for the relation annotation.
  - i. Copy and paste keywords into Subject (A) and Object (B) text boxes.
    - For each relational fact you annotate, at least one input (subject/object) should be a highlighted ML keyword in the given document.
    - Copy and paste the keywords as is. Make sure to input the terms as shown in the given document. Please do not paraphrase or remove words in the middle.
    - 3. If you no longer want to add a relation, leave the text box empty, and select *no relation* from the relation dropdown menu.
    - 4. Spaces at the beginning/end of the terms will be removed in the post-processing steps, so feel free to submit them as is.
  - ii. Choose a relation that holds between *Subject (A)* and *Object (B)* from the "Relation" dropdown menu.
    - 1. If you change your mind while inputting relations (e.g., you want to remove the relation you were annotating), select *no relation* from the relation dropdown.
  - iii. Input the sentence identifiers (numbers on the left side of sentences) into the *Evidence* text box. If you find multiple supporting evidences, separate them using "," like "0,1,2".
  - iv. If you have more relations to annotate, click the *Add Relation* button again, or press "esc" to add new input fields.
  - v. Read the document again to make sure that you don't miss any relation in the document.
- a. Once you annotate all the relations you found, click "Submit Relations, and Label Next" button to move to the next document.

## 4. Annotate Relations

Identify relations, *is compared with*, of ML keywords that are highlighted in the given document. If you cannot find any relational facts of ML keywords, click the *Submit Relation* button.

#### Relation Examples

- A is compared with B
  - Sigmoid (A) is compared with softmax (B)
  - LSTMBlockCell (A) is compared with BasicLSTMCell (B)

#### Annotation Notes

- Note1 Relations must be reflected in the document, without relying on external world knowledge (e.g., what you learned from your coursework).
   Do not label relations that you can only infer by the structure of a document (e.g., listed together).
- Note2 Make sure to input the terms as shown in the given document.
   Please do not paraphrase or remove words in the middle. If a term is in a plural form, input that in plural form, and do not change it to a singular form. Do not introduce new words, but just input the nouns given in documents.
- Note3 Relations could be spread over multiple sentences.

#### Relations

A is compared with B: is a symmetric relation. You can label two terms with this relation when the document is comparing the two (see examples below), such as A is an alternative to B, A is better/worse than B, A should alter B, and A is similar to B. You can usually find this relation when the document is comparing two, or suggesting to alter one with another. The document should describe how or why the two are different, or similar.

#### **Annotation Example 1**

- [Given document] The main difference between
  tf.contrib.rnn.LSTMBlockCell and BasicLSTMCell is that
  BasicLSTMCell is implemented in terms of primitive TensorFlow
  ops, so it's useful code to copy and edit if you want to play with
  your LSTM architecture.
- [Annotation] tf.contrib.rnn.LSTMBlockCell is compared with BasicLSTMCell
- **[Explanation]** The given document describes the difference between the two methods. Although BasicLSTMCell is not highlighted in the document, as long as one of the terms is highlighted, you can still annotate the relation.

#### **Annotation Example 2**

• [Given document]

- <u>tf.nn.batch\_normalization</u> is a low-level op. The caller is responsible to handle mean and variance tensors themselves.
- <u>tf.nn.fused\_batch\_norm</u> is another low-level op, similar to the previous one. The difference is that it's optimized for 4D input tensors, which is the usual case in convolutional neural networks. <u>tf.nn.batch\_normalization</u> accepts tensors of any rank greater than 1.
- <u>tf.layers.batch\_normalization</u> is a high-level wrapper over the previous ops. The biggest difference is that it takes care of creating and managing the running mean and variance tensors, and calls a fast fused op when possible. Usually, this should be the **default choice** for you.

#### • [Annotation]

tf.nn.batch\_normalization is compared with tf.nn.fused\_batch\_norm tf.nn.batch\_normalization is compared with tf.layers.batch\_normalization tf.nn.fused\_batch\_norm is compared with tf.layers.batch\_normalization

• **[Explanation]** You can infer that they are being compared based on the structure, which you need to be careful annotating this, as per Note1. However, it is safe to annotate them in this document because they are also being compared explicitly in text, by "similar to the previous one" or "The biggest difference is that". When there are more than two that are compared, you need to annotate all of the combinations.

# 5. Supporting Evidence

For each relational fact you annotated, select **all** sentences that support the relation (e.g., sentences explaining the differences between the two terms) instances as supporting evidence.

### [Example document]

- 0: The issue stems from tf.zeros.
- 1: Initializing your weights to zero is a common mistake when defining a neural network.
- 2: This article explains the reasoning behind it
- 3: very approximately, all the neurons will have the same value, so the network won't learn.
- 4: Instead you should initialize your weights to small random numbers, and a typical scheme is to use tf.truncated\_normal() with a standard deviation inversely proporational to the number of input units.

[Relation annotation you find] tf.zeros is compared with tf.truncated\_normal [Supporting evidence] 0, 1, 3, 4

## [Wrong supporting evidence] 0, 4

**[Explanation for wrong annotation]** You need to annotate ALL sentences that discuss the reason why tf.truncated\_normal should alter tf.zeros.