**Step1**: Fill up screening question **Step2**: Fill up the consent form **Step3**: Download study materials

Step 4: Finish Session #1 and Session #2 user study

**Step 5**: Fill up the survey

# Session #1:

- This session consists of a user study using Session1\_1 and Session 1\_2 folders from the downloaded ContractStudy.zip file.
- In each folder, execute 3 buggy programs (BuggyProgram1.py, BuggyProgram2.py, BuggyProgram3.py) according to the given instructions in each folder.
- Set #1 (Session1\_1) buggy programs will be executed using regular Keras and execute Set #2 (Session1\_2) buggy programs will be executed using Keras with annotated DL contracts, we named it @Keras.

## Task #1:

- Execute BuggyProgram1.py, BuggyProgram2.py, BuggyProgram3.py from both sessions directories (Session1\_1 and Session 1\_2).
- Detect the bugs in the buggy programs by following specific instructions in Session1\_2.
   In Session1\_1, you can observe the output without any error message and should find the accuracy is low or training time is high. Because there is a silent bug in each of the codes which regular Keras does not warn us but annotated @Keras does.
- In Session1\_2, you can observe the error message after "contracts.interface.ContractException:".Fix those 3 buggy programs according to the provided suggestion only in Session1\_2 and execute after fix.
- Fill up a survey after executing Session1\_1 and Session 1\_2 buggy programs.

# Session #2:

- Follow a tutorial with an example on how to write contracts on top of a Keras API is provided below.
- Then, write 3 contracts using provided instructions in Session 2 (Task 2.1, Task 2.2, Task 2.3).

#### Task #2:

- Write contracts using Deep Learning contract syntax following the provided guidelines (Task 2.1, Task 2.2).
  - Task 2.1: Write a contract for multiclass classification on top of compile API (line 301 in the training.py) by defining activation\_func\_multiclass as 'softmax', 'categorical\_crossentropy' as a loss function.
  - Task 2.2: Write a contract for data normalization on top of fit API (~line 670 in the training.py) by defining 'data\_normalized' context as string, 'normalization\_interval' less than or equal to 2.0 as float.

• Fill up a survey on the process and experience of writing Deep Learning contracts.

After completing the two sessions, please delete all the files of this user study.

## **Tutorial:**

The following tutorial will guide you through how to write a contract on top of compile API (line 301 in the training.py file inside AugKeras folder).

We need to first define last\_layer and activation\_func\_binary and binary\_crossentropy string as below:

```
last_layer = 'last_layer'
activation_func_binary = 'sigmoid'
binary_crossentropy = "binary_crossentropy"
```

Then we annotate binary classification contract as below on top of compile API:

Here, context is specified as 'last\_layer', 'activation' has been specified with 'activation\_func\_binary' and 'loss\_func' has been specified as loss\_func with the values declared above.