

ROBOTIC GRIPPER

A Robotic Gripper Operated by Gestures Learned Trough DeepLearning

This project allows a user to control a robotic gripper using gestures captured by a webcam.

1 - How does it works

The project is divided in 3 main phases, in order to fulfill user requests:

- Phase 1: Images must be captured from the webcam to compound a labeled gestures dataset.
The dataset will feed training and testing datasets to be used in supervised learning.
- Phase 2: A deep learning model, basically a neural network, will be created and used to train the gestures recognition, using keras and tensorflow.
- Phase 3: A program will be used to sequentially capture webcam images. The images will be classified by the model trained in Phase 2, and the result will be used to operate the robotic gripper.

In [1]:

```
1 %load_ext autoreload
2 %autoreload 2
```

2 - Capturing labeled gestures images

Images will be captured from the webcam. A folder named **capture** will have several subfolders. The subfolders will have meaningful names, such as **left**, **right**, and so on. The subfolder named **left** will hold images of the gesture that yields the command **turn to the left**. This is so that later the subfolders name will become the ground truth values of the datasets for the machine learning process.

For controlling the robotic gripper, we are going to use nine commands:

1. nothing
2. left
3. right
4. up
5. down
6. forward
7. back
8. grip
9. loose

Some examples of images are:



nothing



left



right



grip



loose

In [2]:

```
1 # imports
2
3 %pylab inline
4 import cv2
5 from IPython.display import clear_output
6 import time
7 from datetime import datetime
8 import os
9 import numpy as np
```

Populating the interactive namespace from numpy and matplotlib

In [5]:

```

1  """
2      function  start_webcam_capture
3      parameters:
4      path - the path to save captured gesture images files
5  """
6  def start_webcam_capture(path, number_of_captures=10):
7      # variables to define play warning sound
8      frequency = 100 # Hertz
9      duration = 50 # milliseconds
10     #lets make sure the path exists!
11     if not os.access(path, os.F_OK):
12         os.makedirs(path)
13     count_captures = 0
14     #using webcam 0.
15     #in some systems webcam may be under different numbers, i.e, 1 or 2 or 3 ..
16     vid = cv2.VideoCapture(0)
17     start_time = time.time()
18     try:
19         while(count_captures<number_of_captures):
20             # Capture frame-by-frame
21             ret, frame = vid.read()
22             if not ret:
23                 # Release the Video Device if ret is false
24                 vid.release()
25                 # Message to be displayed after releasing the device
26                 print("Released Video Resource due to capture fail!")
27                 break
28             # Convert the image from OpenCV BGR format to matplotlib RGB format
29             # to display the image
30             frame = cv2.cvtColor(frame, cv2.COLOR_BGR2RGB)
31             # check if it is time to save frame to a file
32             elapsed_time = time.time() - start_time
33             if elapsed_time > 4:
34                 # make sound to indicate action
35                 os.system('play -n synth %s sin %s' % (duration/1000, frequency
36                 timestamp = datetime.utcnow().strftime('%Y_%m_%d_%H_%M_%S_%f')[
37                 timestamp = timestamp + '.jpg'
38                 image_filename = os.path.join(path, timestamp)
39                 #print(image_filename)
40                 cv2.imwrite(image_filename, frame)
41                 #increment count_captures
42                 count_captures += 1
43                 #restart the timer
44                 start_time = time.time()
45             # check for ESC
46             key = np.int16(cv2.waitKey(1))
47             if key == 27:
48                 print("Esc key interrupted!")
49                 break # esc to quit
50             # Turn off the axis
51             axis('off')
52             # Title of the window
53             title("Robotic Gripper Gestures Capture")
54             # Display the frame
55             imshow(frame)
56             show()
57             # Display the frame until new frame is available
58             clear_output(wait=True)
59     except KeyboardInterrupt:

```

```
60      # Message to be displayed after releasing the device
61      print("keyboard interrupted!")
62      # Release the Video Device
63      vid.release()
64      print("Released Video Resource")
65      path, dirs, files = os.walk(path).__next__()
66      file_count = len(files)
67      print('There are now ', file_count, ' images in ', path)
68
```

Let's start by capturing the gesture for **nothing**. When you are done, select **Kernel** on jupyter notebook menu and then select **Interrupt** As the file names are bases on a complete and unique timestamp, if you wish, you can run the same code again to add more gestures images. You can even visually select and remove some files (in case of a mistake) using a external file manager from your operating system.

In []:

```
1 path = 'capture/nothing'
2 #start capturing gesture images
3 start_webcam_capture(path)
```

Let's capture te gesture for **left**.

In []:

```
1 path = 'capture/left'
2 #start capturing gesture images
3 start_webcam_capture(path)
```

Let's capture te gesture for **right**.

In [6]:

```
1 path = 'capture/right'
2 #start capturing gesture images
3 start_webcam_capture(path)
```

```
Released Video Resource
There are now 10 images in capture/right
```

Let's capture te gesture for **up**.

In [7]:

```
1 path = 'capture/up'
2 #start capturing gesture images
3 start_webcam_capture(path)
```

```
Released Video Resource
There are now 10 images in capture/up
```

Let's capture te gesture for **down**.

In [8]:

```
1 path = 'capture/down'
2 #start capturing gesture images
3 start_webcam_capture(path)
```

Released Video Resource

There are now 10 images in capture/down

Let's capture te gesture for **foward**.

In [9]:

```
1 path = 'capture/foward'
2 #start capturing gesture images
3 start_webcam_capture(path)
```

Released Video Resource

There are now 10 images in capture/foward

Let's capture te gesture for **back**.

In [10]:

```
1 path = 'capture/back'
2 #start capturing gesture images
3 start_webcam_capture(path)
```

Released Video Resource

There are now 10 images in capture/back

Let's capture te gesture for **grip**.

In [11]:

```
1 path = 'capture/grip'
2 #start capturing gesture images
3 start_webcam_capture(path)
```

Released Video Resource

There are now 10 images in capture/grip

Let's capture te gesture for **loose**.

In [12]:

```
1 path = 'capture/loose'
2 #start capturing gesture images
3 start_webcam_capture(path)
```

Released Video Resource

There are now 10 images in capture/loose

3 - Build the Model and train it using the captured gestures from the first phase

We are going to build our deep learning (https://en.wikipedia.org/wiki/Deep_learning) robotic gripper gesture commands model using Keras (<https://keras.io/>) and TensorFlow (<https://www.tensorflow.org/>).

In []:

```
1 #imports
2
3 import pandas as pd
4 import numpy as np
5 from sklearn.model_selection import train_test_split
6 from keras.models import Sequential
7 from keras.optimizers import Adam
8 from keras.callbacks import ModelCheckpoint
9 from keras.layers import Lambda, Conv2D, MaxPooling2D, Dropout, Dense, Flatten
10 from utils import INPUT_SHAPE, batch_generator
11 import argparse
12 import os
13 import cv2
14 import sys
15
16 np.random.seed(0)
```

In []:

```
1 '''
2     load_images_from_folder
3     '''
4 def load_images_from_folder(folder, result, images, results):
5     print('folder: ', folder)
6     for filename in os.listdir(folder):
7         img = os.path.join(folder, filename)
8         if img is not None:
9             images.append(img)
10             results.append(result)
11     return images, results
```

In []:

```

1 def load_data(args):
2     images = []
3     results =[]
4     labels = ['nothing', 'left', 'right', 'grip', 'loose']
5
6     #load a list of images and a corresponding list of results (images=640x480)
7     images, results = load_images_from_folder('capture/nothing01/', 0, images, re
8     images, results = load_images_from_folder('capture/left01/', 1, images, resul
9     images, results = load_images_from_folder('capture/right01/', 2, images, resu
10    images, results = load_images_from_folder('capture/grip01/', 3, images, resul
11    images, results = load_images_from_folder('capture/loose01/', 4, images, resu
12
13    print("Images: ", len(images))
14    print("Results: ", len(results))
15    print("labels: ", len(labels), labels)
16
17    # if we wish to check some of the images, just change de index value
18    # note that the index can't be bigger than the number of images -1
19    #cv2.imshow('Capture', cv2.imread(images[80]))
20    #print(images[80])
21    #print(labels[results[80]])
22    #cv2.waitKey(0)
23    #X = np.asarray(images)
24    #y = np.asarray(results)
25    #X = X.reshape(len(images),1)
26    #y = y.reshape(len(results),1)
27    #print('X shape: ', X.shape)
28    #print('y shape: ', y.shape)
29    X_train, X_valid, y_train, y_valid = train_test_split(images, results, test_s
30
31    print("Train Images: ", len(X_train))
32    print("Valid Images: ", len(X_valid))
33    print("Train Results: ", len(y_train))
34    print("Valid Results: ", len(y_valid))
35
36    # if we wish to check some of the images, just change de index value
37    # note that the index can't be bigger than the number of images -1
38    #cv2.imshow('Capture', cv2.imread(X_train[80]))
39    #print(X_train[80])
40    #print(labels[results[80]])
41    #cv2.waitKey(0)
42    #cv2.destroyAllWindows()
43    #sys.exit(0)
44
45    return X_train, X_valid, y_train, y_valid

```

In []:

```

1 def build_model(args):
2     """
3     Modified NVIDIA model
4     """
5     model = Sequential()
6     model.add(Lambda(lambda x: x/127.5-1.0, input_shape=INPUT_SHAPE))
7     model.add(Conv2D(24, 5, 5, activation='elu', subsample=(2, 2)))
8     model.add(Conv2D(36, 5, 5, activation='elu', subsample=(2, 2)))
9     model.add(Conv2D(48, 5, 5, activation='elu', subsample=(2, 2)))
10    model.add(Conv2D(64, 3, 3, activation='elu'))
11    model.add(Conv2D(64, 3, 3, activation='elu'))
12    model.add(Dropout(args.keep_prob))
13    model.add(Flatten())
14    model.add(Dense(100, activation='elu'))
15    model.add(Dense(50, activation='elu'))
16    model.add(Dense(10, activation='elu'))
17    model.add(Dense(1))
18    model.summary()
19
20    return model

```

In []:

```

1 def train_model(model, args, X_train, X_valid, y_train, y_valid):
2     """
3     Train the model
4     """
5     checkpoint = ModelCheckpoint('model-{epoch:03d}.h5',
6                                 monitor='val_loss',
7                                 verbose=0,
8                                 save_best_only=args.save_best_only,
9                                 mode='auto')
10
11    model.compile(loss='mean_squared_error', optimizer=Adam(lr=args.learning_rate))
12
13    model.fit_generator(batch_generator(X_train, y_train, args.batch_size, True),
14                        args.samples_per_epoch,
15                        args.nb_epoch,
16                        max_q_size=1,
17                        validation_data = batch_generator(X_valid, y_valid, args.batch_size, False),
18                        nb_val_samples=len(X_valid),
19                        callbacks=[checkpoint],
20                        verbose=1)

```

In []:

```

1 def s2b(s):
2     """
3     Converts a string to boolean value
4     """
5     s = s.lower()
6     return s == 'true' or s == 'yes' or s == 'y' or s == '1'

```


In []:

```
1 def main():
2     """
3     Load train/validation data set and train the model
4     """
5     parser = argparse.ArgumentParser(description='Behavioral Cloning Training P
6     parser.add_argument('-d', help='capture directory', dest='capture_di
7     parser.add_argument('-t', help='test size fraction', dest='test_size',
8     parser.add_argument('-k', help='drop out probability', dest='keep_prob',
9     parser.add_argument('-n', help='number of epochs', dest='nb_epoch',
10    parser.add_argument('-s', help='samples per epoch', dest='samples_per_e
11    parser.add_argument('-b', help='batch size', dest='batch_size',
12    parser.add_argument('-o', help='save best models only', dest='save_best_onl
13    parser.add_argument('-l', help='learning rate', dest='learning_rate
14    args = parser.parse_args()
15
16    print('-' * 30)
17    print('Parameters')
18    print('-' * 30)
19    for key, value in vars(args).items():
20        print('{:<20} := {}'.format(key, value))
21    print('-' * 30)
22
23    data = load_data(args)
24    model = build_model(args)
25    train_model(model, args, *data)
```

In []:

```
1 main()
```